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METHODOLOGY FOR REAL-TIME HULL FATIGUE MONITORING OF AN ALUMINIUM VESSEL

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ABSTRACT

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Methodology for Real-Time Hull Fatigue Monitoring of an Aluminium Vessel

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In this study, a general methodology of monitoring the real-time fatigue onboard aluminium vessels was created. The created methodology was briefly demonstrated by using a case example of a new build aluminium vessel. The requirements for hull fatigue monitoring of the case vessel was discussed with the owner party.

The goal of this work was to find out what is needed for producing a real-time fatigue monitoring system aboard an aluminium vessel. This includes the determination of methods for real-time fatigue calculation, aspects of data collection and benefits from such system.

The methodology was constructed with the support of a literature review, previous studies on the subject and current methods of ship design by regulatory parties. The methods presented are generally approved for use by the major class societies.

The initial requirements and regulations for monitoring greatly affects the process of implementation and the scope of data collection. For real-time fatigue monitoring, critical structures need to be found, analysed for severity and instrumentation planned. Further understanding of the responses can be achieved by collecting reference data, such as sea states, vessel motions and locational information.

For the case vessel, an evaluation based on the created methodology was completed and a structural model was produced. The global FE-model was analysed against a wave slamming sea state. The responses were achieved by using an One-way FSI-method between the CFD- and FEA-solvers. Further analysis was conducted by local sub-models and the structures with stress responses were analysed for their criticality and instrumentation possibilities.

TIIVISTELMÄ

LUT-Yliopisto
LUT Energiajärjestelmät
LUT Kone

Mikael Parvikoski

Metodologia Reaaliaikaiseen Rungon Käyttöikä tarkasteluun Alumiinisessa Aluksessa

Diplomityö

2020

100 sivua, 34 kuvaa, 5 taulukkoa ja 1 liite

Tarkastaja: Professori Timo Björk
Diplomi-insinööri Leo Siipola

Hakusanat: alumiini, alus, laiva, reaaliaikainen, runko, rakenne, seuranta, eheys, väsyminen, väsymisenseuranta, runkorakenteiden seurantajärjestelmä, huipputekniikka, käyttöikä

Tässä työssä luotiin yleispätevä metodologia reaaliaikaisen väsymisen seuraamiseksi alumiinisille aluksille. Luotua metodologiaa demonstroitiin käyttämällä uudisrakenteista tapausesimerkkiä alumiinialuksesta. Tapausesimerkkiin liittyvistä vaatimuksista rungon väsymisseurannalle keskusteltiin omistavan tahon kanssa.

Työn tavoitteena oli selvittää, mitä tarvitaan reaaliaikaisen väsymisvalvontajärjestelmän tuottamiseen alumiiniselle alukselle. Tähän sisältyy reaaliaikaisen väsymislaskennan menetelmien, tiedonkeruuseen liittyvien kohtien ja hyötyjen arvioimisen selvittäminen.

Metodologian rakentumista tuettiin käyttämällä hyödyksi kirjallisuusselvitystä, aiheeseen liittyviä aiempia tutkimuksia ja nykyisiä hyväksytyjä metodeja laivasuunnittelussa. Yleisesti, esitetyt menetelmät ovat suurimpien luokituslaitosten hyväksymiä.

Seurannalle asetetut vaatimukset ja säännökset vaikuttavat suuresti tällaisen järjestelmän täytäntöönpanoon ja tiedonkeruun laajuuteen. Reaaliaikaista väsymisenseurantaa varten on löydettävä kriittiset rakenteet, analysoitava niiden vaikutus lujuteen ja suunnitella paikallinen instrumentointi. Aluksen vasteita kuormitukseen voidaan paremmin ymmärtää ja hyödyntää keräämällä referenssidataa mm. aaltotapauksista, aluksen liikkeistä ja sijainneista.

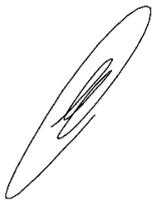
Tapausesimerkille suoritettiin metodologian mukainen arviointi ja luotiin rakennelaskentamalli. Globaali FE-malli altistettiin aallon iskukuormaa vastaaville aalto-olosuhteille. Rakenteelliset reaktiot saatiin käyttämällä yksisuuntaista FSI-menetelmää CFD- ja FEA-ratkaisijoiden välillä. Rakenteiden jatkotutkimus suoritettiin käyttämällä paikallisia alimalleja. Rakenteet, joissa havaittiin jännityskeskittymiä analysoitiin niiden kriittisyyden ja instrumentoinnin osalta.

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APPENDIX I: Specifications for hull monitoring systems by class societies.

LIST OF SYMBOLS AND ABBREVIATIONS

Δ	Displacement
σ_{res}	Residual stress
B_H	Hull breadth
D	Accumulated damage as per Palmgren-Miner rule
\dot{D}	Damage rate expressed in time-domain
FAT	Fatigue class of structural detail [MPa]
L_H	Hull length
n_i	Cycle amount for stress range i
N_i	Cycle capacity for stress range i
R	Stress ratio
R_m	Material ultimate strength
r_{true}	Weld toe radius
V_{max}	Max. speed
1-D	One-dimensional
2-D	Two-dimensional
3-D	Three-dimensional
ABS	American Bureau of Shipping
ANN	Artificial Neural Network
BV	Bureau Veritas
CAD	Computer Aided Design
CBM	Condition-Based-Maintenance
CCEB	Current-Condition-Evaluation-Based
CFD	Computational Fluid Dynamics
CFRP	Carbon-Fibre-Reinforced-Polymer
CSR	Common Structural Rules
DNV-GL	Det Norske Veritas - Germanischer Lloyd
ENS	Effective Notch Stress method
EOC	Environmental and Operational Condition

ETTF	Estimated Time To Failure
FEA	Finite Element Analysis
FEM	Finite Element Method
GPS	Global Positioning System
HCF	High Cycle Fatigue
HMM	Hidden Markov Models
HS	Hot-spot Stress method
iFEM	Inverse Finite Element Method
INS	Inertial Navigation System
IACS	International Assosiation of Classification Societies
KR	Korean Register of Shipping
LBSG	Long Base Strain Gauge
LCF	Low Cycle Fatigue
LRS	Lloyd's Register of Shipping
MPC	Multipoint Connections
MSSPD	Minimization of Sum of Squared Perpendicular Distances
NDE	Non-destructive Evaluation
NK	Nippon Kaiji Kyokai
PSD	Power Spectral Density
RAO	Response Amplitude Operator
RFC	Rainflow cycle counting method
RS	Russian Maritime Register of Shipping
RUL	Remaining Use Life
SBSG	Short Base Strain Gauge
SCF	Stress Concentration Factor
SHM	Structural Health Monitoring
SOLAS	Safety of Life at Sea
ULS	Ultimate Limit State, ultimate strength limit of structure

1 INTRODUCTION

Controlled life cycle and reliability are important aspects for a product in this constantly renewing world. New innovations for creating more reliable and efficient designs is in a key role for future proofing a product to minimize the impact on the environment and saving costs. The current aspiration in certain applications is to remove risks for premature failure which could lead to the end of the products service life.

These trends are also affecting the maritime industry. A drive to create even more reliable and environmentally friendly solutions for offshore structures and vessels has already generated a lot of discussion and actions for new innovations from the top operators. Digital twins of an operating ship give deeper insight into the vessel health during operation by utilizing sensor monitoring (Storhaug, 2019).

This master's thesis is a concept design project of creating a methodology for real-time fatigue monitoring of an aluminium vessel using maritime proven technologies. The example case used for this thesis is designed according to the VTT workboat instructions, an organizational guide for building workboats from the Finnish open publishing, fully state-owned LLC (VTT LLC, 2020). The workboat instructions are based on a European standard for small crafts on the sea, called SFS-EN-12215. The workboat guide acts as a set of instructions for a regulatory approval for operation of the vessel when sailing under the Finnish flag (VTT Expert Services Oy, 2016).

The research is produced for Elomatic Oy as a part of an improving monitoring platform, under development to enhance the use of collectable data and improved design cycles for future projects. The platform under development is set to enhance the data collection on every aspect and providing more essential data to customers for greater control over the life cycle of their application. Including more sub-systems into the mainframe creates a variable platform to further grasp knowledge and ingenuity for design improvement when the data sets are combined.

1.1 Background information and regulations concerning the case vessel

As the aluminium vessel is a new build, the customer has asked for certain characteristics for efficient use in demanding environmental conditions. The vessel should be operational at any climate year around and reach operational speeds of over 20 knots. The main dimensions for the vessel are; length of 20 m, width of 6 m and the displacement of 50 t.

The VTT workboat guide has several categories of ship classes, ranging from A to D. The design classes feature different significant wave heights and typical wind loads as measured in the Beaufort scale (VTT Expert Services Oy, 2016, pp. 15-16). The case example is set in class A, with the highest demand for environmental loads. The ship has an extra notation for ice driving capabilities, requiring additional strengthening.

1.2 Research questions

The methodology achieved in this study aims to answer at least the following research questions:

- What prerequisites are there for hull structural health monitoring?
- What data is needed for real-time fatigue monitoring?
- How is the functionality of such system ensured and utilized?

These questions are covered and analysed throughout the study. As the questions could be answered indirectly during the study script, a compilation of answers is discussed in the late chapters.

1.3 Goal and limitations

This study aims to compose a methodology for a real-time fatigue monitoring on an aluminium vessel. Building the fully working system is based on multiple aspects in addition to this study, including the measuring devices fitted on the vessel, the ready computer system for continuous calculation and devices displaying the real-time damage rate.

The real-time fatigue methodology in this work is focused on instrumented monitoring and continuous calculation method. Other methods are however briefly discussed in context for comparison to long-term monitoring.

This study is dedicated on reflecting the needs to produce a structural health monitoring (SHM) system for the hull of an aluminium vessel by discussing the needed components of theory and using a concept case of an aluminium vessel built for real purposes. This includes determining the correct method for the real-time calculation, finding the most critical details for data collection, monitoring and estimating the benefits from a ready system. The system with included peripherals is not considered in this study. This noted however, the thinking process will always feature a line of thought on the ready system as it helps to understand the complete functionality. This study does not feature experimental testing and relies mostly on information found from literature.

The global strength of the case vessel is not in the focus, this step has already been addressed in the design stages so far and doesn't need to be reviewed. The global and local load responses are used to find the critical details in the case study. However, if structural details are found with insufficient strength, design changes are proposed.

1.4 Methods and hypothesis

As most vessels are built to sail according to a regulatory approval, the regulations should be studied and reviewed for notations regarding this kind of a system. The review should always be based on the design guidelines to which the vessel is designed for and being built upon. Recommended practices can be utilised though if available.

Next, the critical details and failure modes need to be found. This requires an analysis based on vessel global and local loads acting on the structures. As many vessels experience heavy use and climate conditions, the global loads should be based on the most common and critical environmental and operational conditions (EOC's).

The found critical details are then evaluated for their potential failure, either by overload situation exceeding the load bearing capacity or cyclic, fatigue inducing loads leading to crack propagation and final fracture. The structural details are then individually assessed for the type of calculation method should be used and what is their role in the bigger picture for hull reliability.

Real-time calculation is based on constantly updating situation on the vessel's structures; thus, continuous data collection is needed. The data needed is evaluated and its uses analysed. The devices used to collect the data and their role in the system is discussed and reviewed.

The hypothesis for the study is to produce a methodology for real-time fatigue monitoring and calculation concept for aluminium vessels. When this study is further developed to a system-state design it will benefit the customer by enabling the use of condition based maintenance schedules and better understanding of the vessels behaviour during operation. The better understanding of vessels conditions under use improves crew driving performance and lessens the caused damage.

2 PRELIMINARY DEFINITION FOR HULL MONITORING

In this chapter, the main behaviour characteristics of a ship's hull in operation is discussed. It is important to recognise the basic load and response events for constructing of a hull monitoring system. The use of monitoring systems is growing fast due to the increased interest in environmental health and through regulatory matters. The SHM-systems implemented however are different when considering dissimilar ship types. Guan (2015, p. 5) expressed the potential solution for hull SHM-systems as follows: "An ideal technique for ship hull monitoring should possess the features of simplicity, reliability, scalability and affordability."

A convention party Safety of Life at Sea (SOLAS) has taken the monitoring in ships as a safety measure against accidents. As far as from year 2004, the regulatory guidelines have required ships with over 500 gross tonnage to have a monitoring system capable of recording positional data, such as speed, coordinates and other safety related information to ensure that the ship is operational and on-call. (Hulkkonen, et al., 2019, p. 416; Phelps & Morris, 2013, p. 8)

From a methodology viewpoint, it is important to recognise what is relative to construct a SHM-system on board an aluminium vessel and how it should be utilized. Aluminium as a material already brings differences in the application of the SHM-system. Usually aluminium is used on smaller vessels with more complex structures and thus have more local fatigue behaviour compared to larger ships. Recent trend is however bringing aluminium to larger vessels as well, as demonstrated by the recent build contract for 13 000 gross tonnage, 130 m long twin hull high speed passenger ship by Incat Tasmania Pty Ltd in Australia (Incat, 2019).

2.1 Regulatory rules and guidelines for health monitoring

As with many aspects in shipbuilding, regulatory guides and rules are to be followed for approval of usage. The major class societies recognise these SHM-systems for their environmental and safety benefits. All regulatory guides and rules concerning SHM from major class societies are listed in Table 1. More detailed specifications are listed in Appendix 1.

Table 1. Class remarks and guides for SHM-systems on ships (Dessi, et al., 2018, p. 96).

Classification Society	Recommended practise or rule	Notation
Lloyd's Register of Shipping (LR)	ShipRight Digital Compliance: Procedure for the Approval of Digital Health Management Systems	SEA (HSS), SEA (ICE)
Det Norske Veritas – Germanischer Lloyd (DNV-GL)	DNV GL Hull HMON	HMON
American Bureau of Shipping (ABS/ABS ice)	Guide for Hull condition monitoring systems	HM1, HM2, HM3, ILM (ICE)
Bureau Veritas (BV)	Rules for Classification: MON-HULL	MON-HULL
Russian Maritime Register of Shipping (RS)	Part XVII: Section 17: Notation of HMS for hull monitoring systems fitted onboard	HMS
Nippon Kaiji Kyokai (NK)	Rules for Hull Monitoring Systems	HMS
Korean Register of Shipping (KR)	Rules for Classification: Additional installations – Hull monitoring systems	HMS
China Classification Society (CCS)	Hull Monitoring Systems	HMS

2.2 Aluminium as material

As the current trend is to favour more environmentally friendly solutions for naval new-builds, aluminium has proven to be a great material for lightweight designs. It should be noted though, that aluminium has inferior strength capabilities when compared to traditional ship-building steels. As discussed by a few studies, structures built from aluminium are not as well researched even up to this date. (Sielski, 2007, pp. 1-4; Soliman, et al., 2019, p. 2)

Aluminium extruded profiles give designers great opportunities to utilise the material as they please by enabling the use for more non-standardised cross-sections. The extended freedom is better for designing lightweight crafts due to great performance gains. (Tveiten, et al., 2007, p. 255)

The uses for aluminium are not only limited to strength and weight ratio, but other advantages over more traditional steel materials are found. Most commonly, 5000- and 6000-series aluminium's are used in commercial and bureaucracy ship applications requiring high speed and reliability. 5000-series aluminium alloys have great corrosive properties, advantageous in parts in direct contact with corrosive and salty seawater. 6000-series offers gains in weldability. (Sielski, 2008, p. 2)

Despite the great strength to weight ratio, possibility for extruded complex profiles and superiority in corrosive properties, aluminium certainly has some trade-offs. Under cyclic loading, aluminium has much higher crack propagation rate than traditional steel in shipbuilding. If steel and aluminium are used in similar conditions, aluminium structures would fail due to fatigue faster than steel. This is even more critical in high speed crafts experiencing more slamming loads large in scale. (Soliman, et al., 2019, pp. 5-6; Sielski, 2007, p. 5)

Usually created during fabrication, residual stresses are also heavily influenced by material properties. Aluminium has much higher thermal expansion coefficient as mentioned before. This leads into greater distortion under temperature variation, such as in an event of welding. Greater distortion could potentially mean larger concentrations of residual stresses, but aluminium has elastic modulus of only one-third compared to steel. These together cause larger distortions but lower residual stresses. Of course, dissimilar alloys behave differently, but in general they have quite similar characteristics. (Sielski, 2008, p. 4)

2.3 Structural loads

To construct a hull monitoring system for real-time fatigue calculations, the loads affecting the vessels structures must be found. All seagoing vessels experience static and dynamic loads during their operation. The effect on fatigue by load type varies based on the ships EOC demands and type. It is important to recognise situations which might cause failure due to overloading and concurring events that affect the vessels fatigue life by cyclic loading.

2.3.1 Static loads

As the ship stays afloat during calm seas or otherwise in stable water, the hull of the ship experiences hydrostatic pressure due to buoyancy forces caused by the displaced water. The opposing forces caused by ship weight inertia effects and buoyancy by displaced water causes shear and bending moment on the hull structures. The variation of these types of loads along the length of the ship are usually minimal in smaller vessels and more pronounced in bulk carriers due to the constant shifting of cargo weight amounts. (Phelps & Morris, 2013, p. 2)

2.3.2 Frequency based dynamic loads

Hull fatigue in vessels is mostly caused by dynamic, wave induced loads. The pressure on the hull varies as the ship moves in the ocean. In the worst case scenario, extreme sea conditions may lead into premature failure of critical hull structures (Smith, 2007, p. 1).

Waves of the sea are considered as low frequency loads and are usually dominant in slower, larger ships such as bulk carriers, cruise ships and container vessels. The case example used in this study is a higher speed, partially planning craft constructed from aluminium operating in vastly changing conditions and has more complex EOC demands. Low frequency loads could still be present in smaller vessels and should not be neglected. The prediction of ship reaction in waves gets more complex as high sea states can represent non-linearity. The most significant sea states usually still represent and lead to low amplitude loads and thus act more linearly (Sielski, et al., 2002, p. 100).

Variating loads from engine and propulsion systems causing vibrations on the vessel hull are considered high frequency loads. All loads operating near the ships natural frequency can be considered excitation inducing. The amount of excitation force is mostly dependent

on the natural frequency of the ship and offset mass of the vibration source. High displacement responses cause damage and contribute to fatigue life. Class societies usually use on board comfortability standards for vibrations e.g. acceptable levels of excitation aboard ships for approval (Lloyd's, 2015, p. 1).

Springing and whipping are also continuums from these low and high cycle dynamic loading scenarios. In springing, excitation forces from waves cause the hull to resonate. The excitation period could be long enough to cause fatigue damage accumulation; thus, decreasing the life of the ship. Whipping is caused by wave impact on hull resulting in high frequency oscillations, also potentially leading to fatigue damage accumulation. Springing is however considered more dominant in larger vessels with lower natural frequencies. (White, et al., 2012, pp. 1-2)

2.3.3 Slamming loads

Singular or combined effects of major heave and pitch motions result in bow lift and impact against opposing waves, causing high peak stresses and violent transient vibrations ultimately affecting the damage accumulation. These slamming events are very known to happen for high speed vessels capable of planing (Phelps & Morris, 2013, p. 3). In heavier seas, a high-speed jump of the wave crest could potentially cause damage to the vessel if the bow impacts between wave trough and crest at a certain angle.

Slamming load effect on fatigue should be assessed along with global wave loads (Magoga, et al., 2017, p. 1). Slamming inherently causes the mentioned whipping and springing, the vessels response to high frequency and sudden impact. Magoga (2017) assesses whipping as a reaction from slamming loads to contribute greatly to accumulated damage in their research. The research however also notifies, that the occurrences depicted in the study are a source of only one vessel and few strain gauges. The structural response to whipping could potentially have less effect in different locations of the hull not included in their research.

As expressed by Daidola & Mishkevich (1995, p. 23): “Perhaps the most significant factors which govern or influence slamming conditions are the length of ship, sea severity, ship speed, and course angle relative to predominant sea, ship loading condition, overall ship

form as it affects ship motion, and also fullness or flatness of bottom forward.” The states for perfect slamming are quite complex.

2.3.4 Operational loads

Specialized smaller vessels have vastly different operational demands compared to larger, heavily standardized ships carrying cargo; bulk or passengers. All the different operational requirements bring more load cases to be considered when designing the vessels. Depending on operational needs, the loads caused by them could affect the fatigue damage accumulated and can be evaluated in the fatigue calculations. If certain operational equipment are critical for functionality and needed constantly, structural monitoring should be considered to foresee the possible need for maintenance and sudden failure prevention. Operational loads could consist of, but are not limited to following:

- Helicopter landing equipment
- Ice-breaking capability
- Onboard weaponry or defence systems
- Rescue, contamination and towing equipment usage
- Cargo space dynamics, moving in transit
- Cargo handling cranes

2.4 Load detection by instruments and notations

It should be noted that small and sudden loads are not easily recognised by the measuring devices. Vibrations, such as whipping and springing have high occurrence frequencies. High frequency loads should be measured using higher sampling frequencies (Phelps & Morris, 2013, p. 3).

Longer duration loads are easier to detect with measuring devices, such as strain gauges, accelerometers and pressure transducers. On smaller vessels, detection is harder due to very local load occurrences and more complex geometry. Due to less material usage, temperature variation is also more pronounced on smaller vessels. This temperature variation should be noted at least in the case of strain gauges usage to avoid distorted results (HBM, 2020).

Thermal changes have different effects based on the material being used. Elongation of a structure is down to the thermal expansion coefficients, which are dependent on the material. Aluminium has higher coefficient than steel, so temperature variations have larger effect on vessels built using aluminium (Zhang, et al., 2013, p. 8).

2.5 Hull load response

When any of the loads described in Chapter 2.2 are in effect on the vessel of interest, the hull has a response by transmitting the forces onwards through the primary, secondary and tertiary structures. These responses are recognised by all the major class societies part of International Assosiation of Classification Societies (IACS). (Hopkinson, et al., 2002, p. 5)

Primary load responses are considered as global ship bending moments, caused by ships motion in waves. Bouyancy and ship weight together with wave placement cause non-uniform stresses across the vessel length. In the simplest form, the ship bending can be seen as a simple beam subjected to bending moment which results in either top flange compression and lower flange tension and vice versa. These phenomena are known as sagging and hogging, shown in Figure 1.

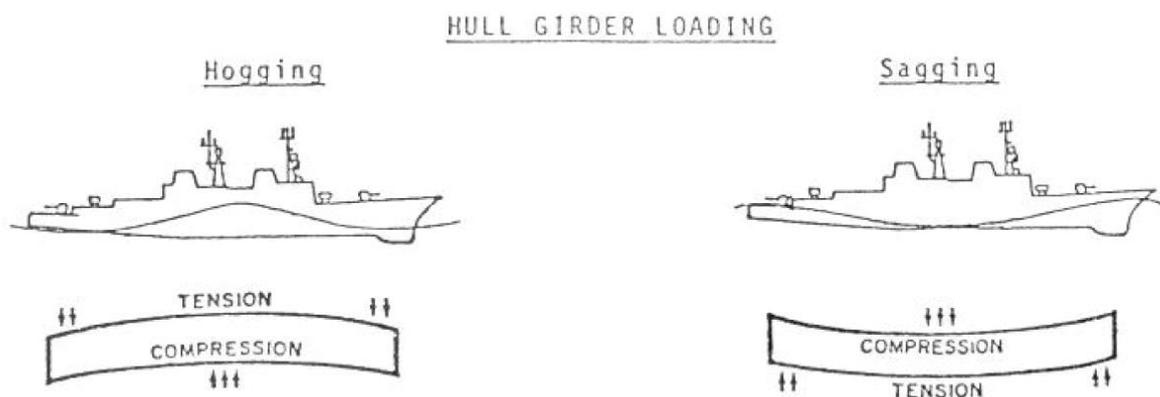


Figure 1. Hogging and Sagging phenomena illustrated (Hopkinson, et al., 2002, p. 2).

Secondary responses are related to the plate and girder combinations and are considered as a local response conditions to previously listed pressure events, such as hydrostatic, cargo, wave slamming, deck and wind pressures, which of some are defined by the prevailing weather conditions. (Hopkinson, et al., 2002, pp. 3-4)

The same conditional effects are also responsible for the tertiary structure responses. Tertiary responses are referred as local plate stresses bound by orthogonal stiffeners. The lateral loads and pressures on the local plates are added to the primary and secondary load responses. The effect of this addition is dependent on the location, nature of the load and area of effect. (Hopkinson, et al., 2002, p. 4)

The responses to wave loads are described as Response Amplitude Operators (RAO) in the maritime industry, and consist of the ship's transfer functions in various sea states. Sielski (2002) describes RAO's as: "The amount of response to a unit wave height of some hull response parameter, such as bending moment. The value of the response is determined over the range of all anticipated wave encounter frequencies." RAO's can be used to describe many behaviour elements, such as stress, moment, displacements and angular misalignments.

2.6 Recognition of possible structure failure causes

After recognition of hull responses for the ship type of interest, it is important to know how the load responses further develop into failure mechanisms and which mechanisms are noteworthy for the SHM-system to track and notify off.

2.6.1 Failure by overload

As noted earlier, aluminium has inferior strength capabilities when compared to traditional ship building steel materials. Aluminium as a material in shipbuilding has been generally used on smaller vessels, less prone for global strength failure due to different hull geometry and load characteristics. Specialised small crafts usually have highly irregular EOC load scenarios and thus are prone for overload induced failure mechanisms. (Sheinberg, et al., 2011, p. 2)

Overload is an event where the structures load bearing capacity has been exceeded by an extreme load. Typically, this event leads into failure of the structure by stability loss. In naval applications, this type of an event is prone to occur when there is a sudden change in weather conditions or poor judgement by the crew of choosing to operate in conditions which are not suitable for the vessel and surpass the weather conditions set by the design codes.

Common behaviour in overload situations is buckling of the structure; thus, stability loss. Buckling is a phenomenon related to the geometry of a structure and the material properties (Phelps & Morris, 2013, p. 4). The possible buckling locations in an event of overload should be studied on ship to ship basis to find the most critical details.

2.6.2 Failure by cyclic loading

Fatigue has been a known failure mechanism of ships for a long time. Class societies have a set of rules for calculation and prediction of such failure events for many ship types, mainly for the ones built from steel. Fatigue calculation rules for smaller vessels, frequently built from aluminium, are not yet addressed widely by the class societies, though some recommended practices do exist (Sielski, 2008, pp. 3-4).

For larger ships, the fatigue life can be evaluated using simple beam theory. The assessment is then based on the scantling value calculated with estimation of cycles during ships lifetime and using the global load scenarios. This method is applied to multiple girder sections. Local fatigue is also considered in larger ships, especially in widely known location, such as openings and girder discontinuities, end connections and crossings. (Phelps & Morris, 2013, p. 5)

When addressing smaller vessels with more complex geometries, potentially out of reach for simplified methods, the local fatigue is more predominant. The hull structures aboard smaller vessels, also the ones built using aluminium, have vastly different structural configurations based on their EOC needs. Though their framing systems have similarities to larger, heavily standardised ships, the variation in operational needs and structure complexity leads into less standard procedures for fatigue assessment.

Det Norske Veritas – Germanischer Lloyd (DNV-GL) has however a fatigue analysis methodology guide for fatigue life estimation to high speed and light crafts. This guide points out the most known critical areas such as stiffener transitions, all cross-structures, discontinuities of structural members, pillar connections and engine foundations. The criteria relies on global and local load scenarios, mostly for the frequently occurring EOC loads. (DNVGL-RU-HSLC, 2019, p. 21)

The mentioned practise emphasizes on individuality per structural detail and basis on fatigue calculation by Palmgren-Miner linear cumulative damage usage, which will be covered in more detail in Chapter 4.5. The specified criteria by DNV-GL should be satisfied with S-N data of mean value. (DNVGL-RU-HSLC, 2019, p. 21)

Categorization to high-cycle fatigue (HCF) and low-cycle fatigue (LCF) is helpful in estimation of criticality. Events especially contributing to LCF are potentially dangerous if very frequent. LCF is due to cyclic loading event passing the natural yield limit of the material and has a low cycle count until failure. LCF is usually caused by tension and compression by large loading and unloading events contributing to high strains. LCF is evaluated by strain and not stress. (DNVGL-CG-0129, 2015, p. 211)

HCF is the usual fatigue caused by vessels movement in waves, contributing to stresses under the material's yield limit and evaluated through stress-cycle-correlation. HCF also includes the fatigue effects resulting from vibration and structure excitation.

3 ANALYSIS METHODS FOR LOADS AND RESPONSES

When constructing a SHM-system, the steps for producing a working system is dependent on few notations:

- What are the minimum requirements by regulatory standards if there are any?
- What is wanted from the system?
- How accurate system is needed?

These notations define the need of data collection and overall complexity of the calculation during each step in building the intended system. Most accurate systems can give predictions of remaining hull life during operation by conducting continuous load history- and 2D-Rain-flow analysis. The most simple systems however, could only utilize the calculated fatigue capacity by using the pre-processed values and weather prediction models (Hulkkonen, et al., 2019, pp. 425-426). Vessels with highly predictable voyages could utilize the weather prediction models quite comfortably. SHM-systems can be very individualized due to the nature of different ship types and their operational needs.

3.1 Modelling the hydromechanics

Still nowadays, aluminium vessels are considered as small, agile and as described earlier, not as widely researched as their steel counterparts. This has an effect for load determination when in search of the load responses for critical detail analysis. The global load scenarios used to find the responses are defined by regulatory parties, usually referred as Common Structural Rules (CSR). However, as the purpose is to analyse detail structures in the ship's hull, direct calculation methods are to be utilised.

There are multiple methods for assessing the hydromechanics for aluminium vessels, some known for decades and some proven better for modern day. For SHM-systems, the correct sea state modelling in finding the critical hull structures is key. Potential sea state evaluation can be completed with several methods, ranging from simple semi-empirical equations to complex hydromechanics simulations using computed bodies of water (Sielski, et al., 2002, pp. 60-62).

As time and computational power can be limited, the methods for modelling the hydromechanics can be arranged by their accuracy and impact on computational needs as shown by Figure 2.

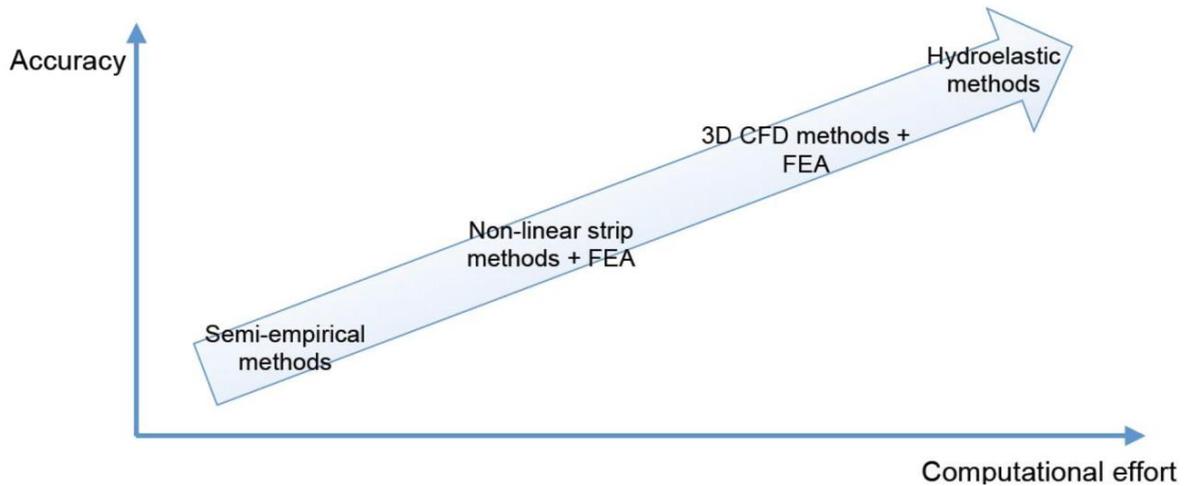


Figure 2. Hydromechanic modelling and computational effort (Rosen, et al., 2020).

The hydrodynamic pressures on hull can be represented by few methods with various accuracy's and suitability's for different ship types. In most complex methods, ships motion in waves can be considered as hydroelastic, coupling the hydrodynamics and structural elasticity (Hirdaris, et al., 2010).

The vessel behaviour in waves can be modelled as following:

- Quasi-Static
- Quasi-Dynamic
- Hydroelastic

Quasi-Static considers the hydromechanics as a static pressure on the hull, neglecting the inertia effects due to slow application of the load. The calculation model is then being held by nodal constraints and the hull is rigid. This means that the Quasi-Static method doesn't feature harmonic responds to vibrations caused by sudden impacts, such as slamming loads. Using semi-empirical equations as global strength analysis for pressure distribution on vessel hull is considered Quasi-Static. (Piro, 2013, p. 7)

Quasi-Dynamic is similar in sense of hull rigidity but includes the effects of inertia for model stabilization against the hydrodynamic hull pressures; thus, giving a better representation of vessels reaction to waves. Quasi-Dynamic analysis could consist of retrieving hull pressures by using strip and panel methods in time domain explained in Chapter 3.1.2 or modelling the waves by using Computational Fluid Dynamics (CFD) discussed in Chapter 3.1.4.

Hydroelastic model features the effects from the Quasi-Dynamic approach, but also considers the elastic behaviour of hull structures. This means that vibration effects, such as harmonic responses from sudden impact loads can be simulated. In larger ships, problematic springing phenomenon in heavy seas can be assessed by using the hydroelastic approach. (Piro, 2013, pp. 1-3)

3.1.1 Semi-empirical methods

For defining the moments and forces the hull structures faces, the design rules usually point out the prevailing bending moments and pressures for the most key load cases of static strength design and scantlings against limit states. For example, the design code can define the global wave moments and bow slamming forces. The rationally based design always considers the extreme values for the loads. Depending on ship type and assumed worst loading conditions, the loads described for direct calculation are often developed from the rule scantling semi-empirical formulae and are based on equivalent regular waves and other presumed loads depending on whether global or local strength is studied. Their uses in direct calculation is however established. (Hughes & Paik, 2010, pp. 118, 131, 161)

3.1.2 Strip and Green function methods

Wave interaction with a vessel's hull is considered as a three-dimensional (3-D) problem. Strip method reduces this problem into a 2-D form for more efficient calculation procedures. The outer hull is divided into multiple strips and the hydrodynamic pressure on the hull is assessed by the 2-D flow on the surface using analytical or panel method for each strip. Method fails in waves shorter than one-third of ship's length. (Hughes & Paik, 2010, pp. 157-158)

This method has multiple variations, such as a non-linear interpretation to accommodate high speed crafts by introducing the effects from planing. Commonly they still lack the effects from uniform reactions of hull panels to pressure and the 3-D effects of hydromechanics. (Razola, 2013, pp. 22-24)

Green function method, sometimes also referred as the panel method, is based on dividing the outer hull into small surfaces. In this method, a velocity potential is set for every wetted surface based on the displaced water and actions that cause lift, such as manoeuvring conditions. (Hughes & Paik, 2010, p. 158)

Many third-party software's utilize these methods for simulated wave responses on ship hulls and for plotting hull pressures for further analysis by direct calculation. For a few examples, GL ShipLoad uses frequency based linear strip method (Rörup, et al., 2008, p. 2) and Ansys Aqwa uses the 3-D panel or Green function method for hydrodynamic estimations (ANSYS, 2010).

3.1.3 Experimental methods

As the regulatory formulas are developed to be used for ship scantling checks and stress reactions to limit states during the iterative design phases, their role in finding fatigue and overload critical structures for operational situations can be too inaccurate; thus, the use of experimental methods have been helpful in retrieving wanted RAO's for more irregular sea states.

Conducting water tank experiments for scale model vessels is however very time consuming and costly. The towing experiments can't also depict correctly many sea states, wave forms and wave slamming events. Pressure data interpolation to further studies, e.g. direct calculation for global strength, is proven to be difficult as well. (Johnson, et al., 2018, p. 634)

3.1.4 Computational fluid dynamics

Vessels facing highly irregular operating conditions would benefit mostly from more simulated calculation methods as well as from combining well established methods with more state-of-the-art solutions. As computer processing power has taken notable leaps during the

last few decades, complex calculation tasks can be completed by using more advanced methods, such as Computational Fluid Dynamics (CFD).

CFD enables a wide variety of simulation possibilities. Inclusions of multiple sea states in correct wave forms and manoeuvring conditions give a more realistic representation of the vessel's behaviour in the given conditions. The uses of CFD in manoeuvring conditions were already recognised and discussed by Bertram (2000, p. 16) in the beginning of 21st century. The simulation of manoeuvring conditions and ship behaviour, such as whipping and springing in CFD is now possible (Hirdaris, et al., 2010).

If possible, more state-of-the-art solutions should be utilised in defining the load characteristics when constructing a SHM-system. As SHM-systems for specialised vessels themselves are mostly state-of-the-art applications, there is no reason to use older and possibly outdated technologies for defining load characteristics to modern vessels. Especially analysis of fast boats benefit greatly from CFD (Garbatov, et al., 2009, p. 805).

CFD shows its strengths best when used along with Finite Element Method (FEM). The coupling can be divided into one- and two-way scenarios. With one-way scenario, the pressure and inertia reactions are solely carried from the CFD solver into Finite Element Analysis (FEA). The method employs rigid body motions to the FE-mesh for structural analysis. Two-way coupling or co-simulation is used to transfer reactions between the two methods. This way, all displacement experienced by the FE-model can be transferred back to CFD, updating the fluid domain correctly. The two-way method can be divided to a weaker and stronger couplings. (Lakshmyanarayanan, 2017, p. 76; Takami & Iijima, 2019, pp. 346-359)

3.2 Critical detail recognition

As the key interest is to find and recognise structures prone for failure due to overload or fatigue, the vessels hull has to be studied by conducting direct calculation or 3-D numerical procedures. These methods can also be utilised in global, longitudinal, beam and detailed strength assessment if the design code allows for it. It is possible to use analytical methods to estimate stress concentrations, but the task would be far too tedious to complete due to possibly a high number of hotspots and critical structures.

3.2.1 Simple beam theory

Most prismatic structural profiles can be considered as a simplified beam section. This section can be then analysed for adequate section modulus against cyclic loading. These methods would be only applicable for assessing the stress and damage on stiffener sections and as such are more suitable for vessels with more concurring structures. Methodology for assessing beam section fatigue life has been established by the members of IACS. This simplified method enables faster criticality recognition and fatigue life assessment of critical girder sections and stiffeners, but can't represent local stress concentration behaviour (Sielski, et al., 2002, p. 88).

3.2.2 Finite element method

FEM can be used to find the critical structures and to evaluate a need for fatigue assessment and locations for measuring devices during operation. Depending on the source for the load cases, whether the analysis will be based on regulatory semi-empirical hull pressures from extreme conditions, computer simulation with CFD or something else, the combination of load cases should be estimated based on the operational situations for a more realistic approach and viable for multiple load cases simultaneously. (Zilakos, et al., 2013, p. 282)

This method consists of multiple FE-models. A whole ship, also known as global FE-model is used for global load FEA to find stress responses and hotspot stress areas for further analysis. Whether the area is considered critical for overload or fatigue, local model is created for fine detailed analysis either to estimate the ultimate capacity for high stresses or number of cycles for failure. (DNVGL-CG-0129, 2015, pp. 77-94)

The implementation of loads and boundary conditions for a comprehensive FEA is always bound to the source of the load scenario deprivation. When using loads depicted by the design codes for global and local cases, the implementation is usually dictated by the code. When using more state-of-the-art load simulation methods, such as CFD for hull pressures to various sea states, the implementation of loads could be based around different domains, such as time (Takami & Iijima, 2019, pp. 351-352).

3.3 Failure mechanism estimation

When critical structural elements are found, the possible prevailing failure mechanisms are to be assessed. Failure mechanisms are introduced by two groups of loads; overload and cyclic. Overload is a load surpassing the ultimate strength and cyclic as notable load events contributing to the structural details use-life. Typical failure mechanisms referenced by force-displacement function in Figure 3.

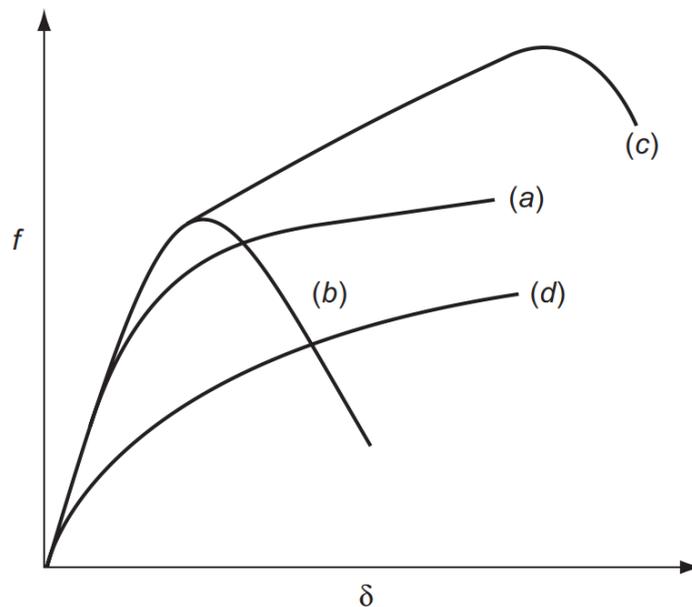


Figure 3. Load in a function of displacement per failure mechanism: a) plastic, b) buckling of profiles, c) buckling of plates, d) gradual buckling, non-bifurcation. (Hughes & Paik, 2010, p. 59)

3.3.1 Plastic deformation

Structures not prone to fail due to instability can still fail by high plastic deformation in tensile stress loads. As yield strength of the material has been passed, the structure is experiencing plastic and permanent damage. The structure can be then considered as failed due to not being able to function correctly in its original shape and capacity. (Hughes & Paik, 2010, p. 60)

In calculation, local plastic deformation can be assumed to accumulate when stress levels are passed the real yield limit of the material. Local yielding is present even earlier. Geometry has a great effect when assessing tensile behaviour. Simple beams transfer bending stress to localised tensile stress on the beam flange, when plates, usually uniformly loaded experience yielding at centre and edges (Smith, 2007, p. 5).

As already discussed, when using direct calculation, such as with FEM, the stresses surpassing the elastic region of the material should be studied further for probable failure. High stresses found in global load analysis over large areas could have dramatic effects in terms of structural capacity. Iterative and non-linear models should be used for maximum result accuracy.

3.3.2 Buckling

High compressive loads on a beam or plate section could cause stability loss of the structure if the combined compressive load exceeds the load bearing capacity of studied structural geometry. Buckling can be a local when a part of the structure fails and/or global when the whole cross-section loses stability and collapses. This phenomenon is dependent on the structural geometry and material strength. (Vukelic & Vizentin, 2017, pp. 136-137; Phelps & Morris, 2013, p. 4)

Designing a vessel according to rule scantling methods are frequently based on the structural buckling capacity and if calculated correctly buckling shouldn't occur during regular use. However, when more state-of-the-art methods are used for non-regular load events, such as slamming in extreme seas, a linear eigenvalue method can be used to determine if global buckling occurrence is found. This method is commonly recommended by many class societies as well in design scantling check procedure. (SFS-EN ISO 12215-5, 2019; DNVGL-CG-0128, 2015)

Further analysis can be conducted by using non-linear FEA by implementing initial imperfections and elasto-plastic material model. With this method, the accurate final mode shape for stability loss and ultimate strength is found. The non-linear method finds the more local buckling behaviour, present in smaller and more complex vessel geometries. (Ozdemir & Ergin, 2013, pp. 301-302)

3.3.3 Static fracture

In general, keeping tensile stress below the materials Ultimate Limit State (ULS), which also describes the ultimate tensile strength commonly, sudden fractures due to high static loads won't occur. Design codes frequently implement safety factors for stress depending on the structure and application to combat uncertainty of the occurring tension component. (Hughes & Paik, 2010, p. 62)

When constructing the SHM-system, possible locations for static fractures should be studied. Typically, high tensile stresses occur during heavy hogging and sagging conditions. In hogging condition, the deck structure is in tensile pull and hull outer shell in compression. In sagging, the roles are reversed (Hopkinson, et al., 2002, p. 2). Instrumenting a warning system for high loads by implementing sensors to key locations based on direct calculations is a great way to prevent stresses exceeding the ULS. Due to the crystal structure of aluminium alloys brittle failure is not possible.

3.3.4 Fatigue fracture

It is estimated that several ships continue operation even though being inspected and noted for fatigue cracks along their hull structures. This is possible due to some implementation issues in the rules. These neglections could quickly lead into severe damages and global catastrophes. (Knudsen & Hassler, 2011, pp. 1-2)

Ship structures contain a lot of welds and cut edges from which a crack will most likely initiate. The locations for these pre-existing cracks should be studied and evaluated for the SHM-system implementation. Common cause for pre-existing cracks can be found from manufacturing processes such as heat input from welding, material hardening processes and even chemical agents. The crack propagation rate is determined by material, cyclic load interval and intensity. (Broberg, 1999, pp. 27-38)

As the pre-existing cracks can be impossible to see, assumptions of correct initiation locations must be made. Discontinuities such as welds and cross section changes with high stress concentrations are the most predominant locations for fatigue crack propagation; thus, possible areas for a fracture.

For cost and time savings, every possible structural defect is not found during Non-destructive Evaluation (NDE) and visual inspection. However, a thorough analysis method, such as FEM, can be used find these structural hotspots as a preventive measure. Design changes can be introduced at early design stages if areas prone for defects are found in these analyses. Some fatigue crack initiation spots are shown in Figure 4. (Nair, et al., 2017, p. 12)

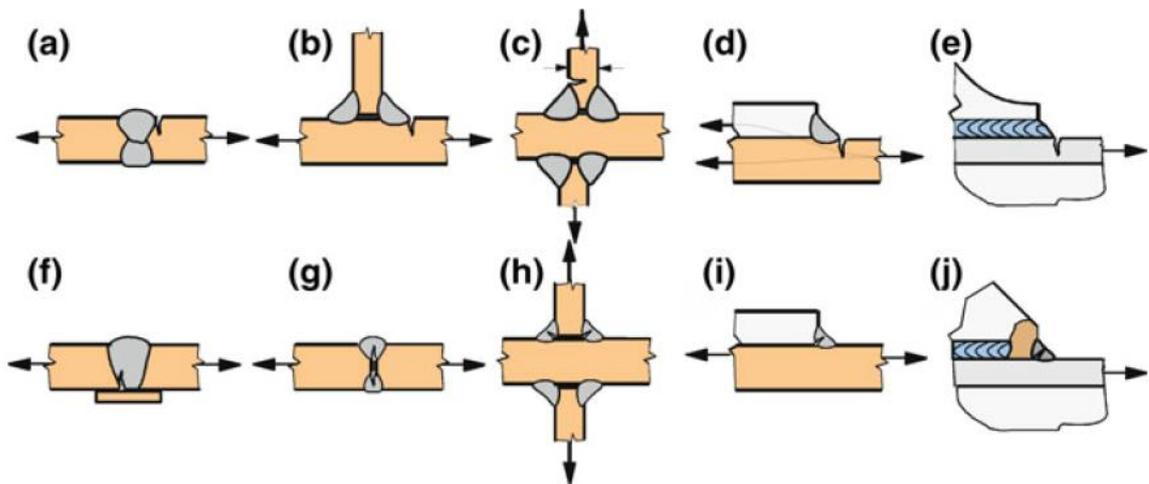


Figure 4. Possible fatigue crack initiation locations in welded joints (Niemi, et al., 2018, p. 6).

Cracking is usually inherited for tension stresses purely, but three distinct cracking modes for surface displacement can be found. Mode I is the *opening* mode. It reassembles the two faces moving apart from each other, mostly caused by pure tension. Mode II is the *sliding* mode. In sliding, the faces are separated by a mix of in-plane shear forces. The third mode is called the *tearing* mode. Tearing mode is caused by a mix of out-of-plane shear forces. Generally, the first mode is the most common mode for crack growth and final fracture. Surface displacement modes are shown in Figure 5. (Dowling, 2013, p. 344)

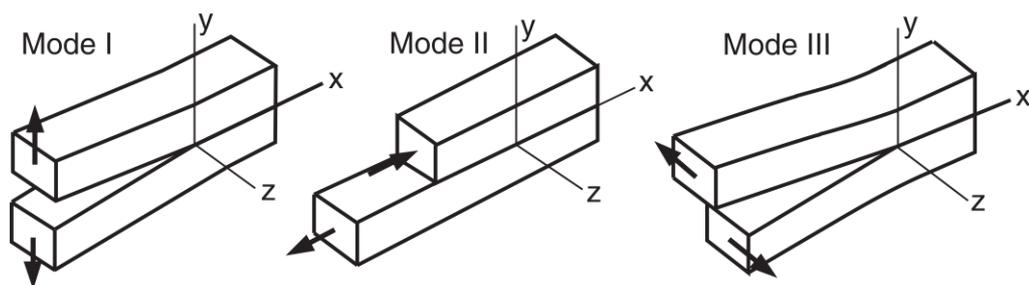


Figure 5. Surface displacement modes. (Dowling, 2013, p. 344)

4 REAL-TIME HEALTH CONDITION

The term ‘real-time’ is often conceptualized differently when SHM-systems are discussed. The calculation procedure however defines which types of methods are using continuous data sets for updated damage rates in operation and post-processed end-of-life analysis. As this study is more focused on the real-time condition and continuous data set collection, methodology of numerical methods for end-of-life and damage accumulation predictions are only covered for comparison.

As time-domain based fatigue calculation methods are generally applicable by design codes for vessels, this section mostly covers their use instead of other methods, such as those based on frequency domain using power spectral density (PSD). Time-domain based methods have been proven to be the most accurate and regarded as the “golden standard” in the industry (Ugras, et al., 2018). Computational power has also significantly increased during the last decades, real-time time-domain approaches are no longer restricted by performance.

Real-time monitoring systems rely on instrumented approaches to either warn the user of current hull action state exceeding predefined limit states and/or continuous calculation of the damage resulting from hull loads. The scope of the system can vary from simple warning states to real-time damage rate display and remaining life evaluation. (ABS, 2020, pp. 4-10)

Although, depending on the chosen methods for different calculation procedures, amount of data processing, ship type and wanted capability from the SHM-system, the basis for such system could be summed to a graph representing the steps for real-time fatigue analysis based on local strain effects prone to cause fatigue cracks. A simple concept of such real-time calculation system based loosely on the flowchart of SSC-410 (Kramer, et al., 2000, p. 24) can be divided into three phases as shown by Figure 6.

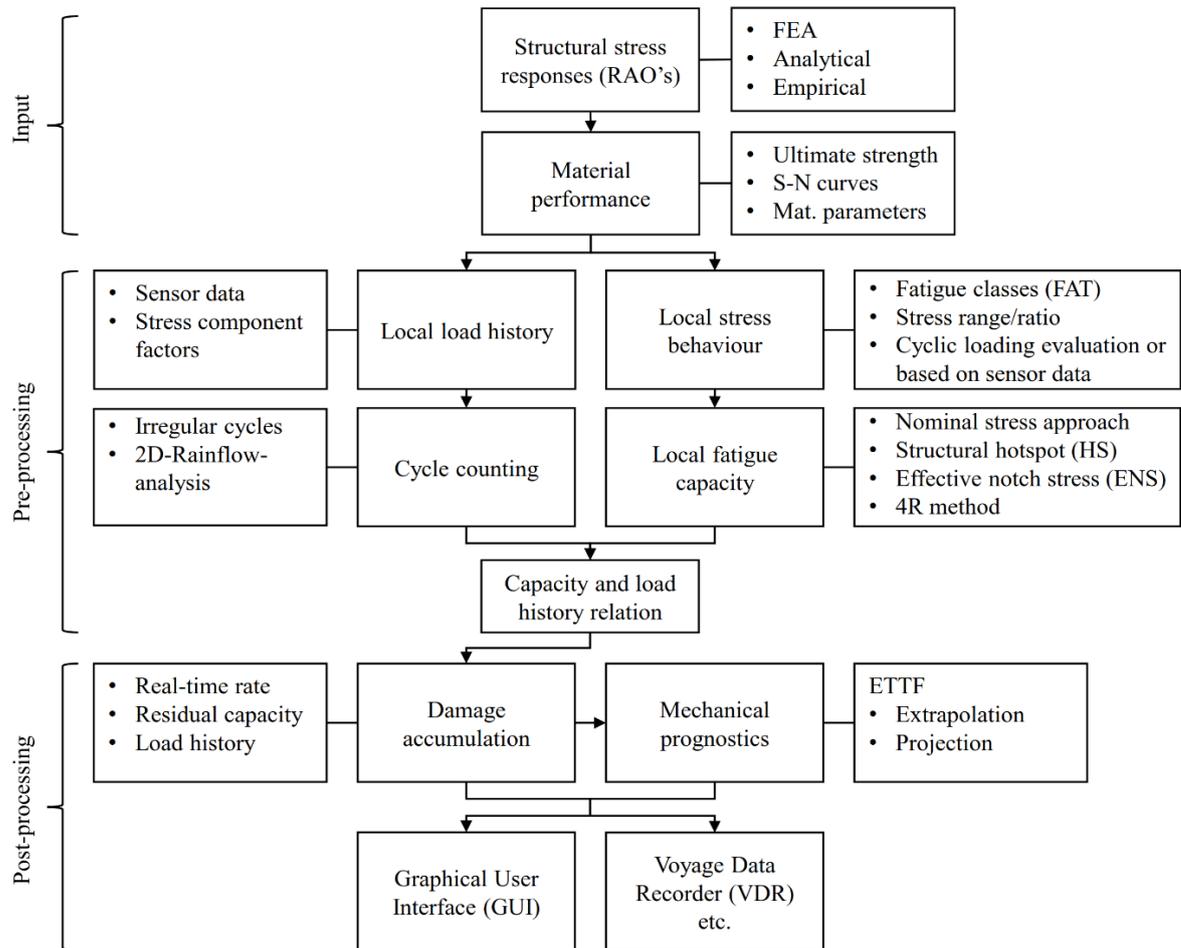


Figure 6. One concept for real-time fatigue calculation in time-domain.

4.1 Data collection

For life-time evaluation of vessel fatigue behavior, multiple data sets can be utilized in unison for further understanding of which type of combined loading has the greatest effect on fatigue damage. For example, strain gauge measurements along with significant wave height, heading and speed data produces deeper insight on which of these combinations are worst for certain structural details in terms of damage accumulation. (Torkildsen, et al., 2005, pp. 6-8)

The needed data for accurate health monitoring and lifetime evaluation varies by ship type and EOC characteristics. As discussed in Chapter 2.2, hull loads should be assessed on vessel basis by looking at their operational profile and requirements for usage. The data collection is simply divided to two subgroups; short-term- and long-term-data. Both methods offer

substantial benefits when compared to more traditional probabilistic weighted sea method based on wave statistics as they rely on actual cyclic data (Thompson, 2020, p. 2).

4.1.1 Short-term data

By utilizing short-term data collected during various EOC's which have been speculated to contribute the most to the vessels service life, multiple profiles for damage accumulation can be made. The data is collected during sea trials and maiden voyages of the ship and then the different load components are assigned with probabilities of occurrence. The data can be strain measurements along with heading, speed and wave information. The instruments can then be removed and operational parameters for different scenarios created based on the other information gathered. This removes the need for using continuous strain gauge measurements and large amounts of data to browse through. (Soliman, et al., 2019, pp. 12-16)

As short-term data collection relies on created operational profiles, a sudden change in use-cases potentially disrupts the semi-prediction calculation for damage and use-life. This requires the creation of updated profiles for the changed operational use. In this regard, it would be more feasible to tie the stress reactions from strain gauge measurements to other data, such as the already mentioned wave information, heading and speed. This collection of hull responses to EOC's can be used to derive RAO's for damage evaluation during operation. This is shown in Figure 7 by Johnson et al. (2018) in their research. (Johnson, et al., 2018, p. 635)

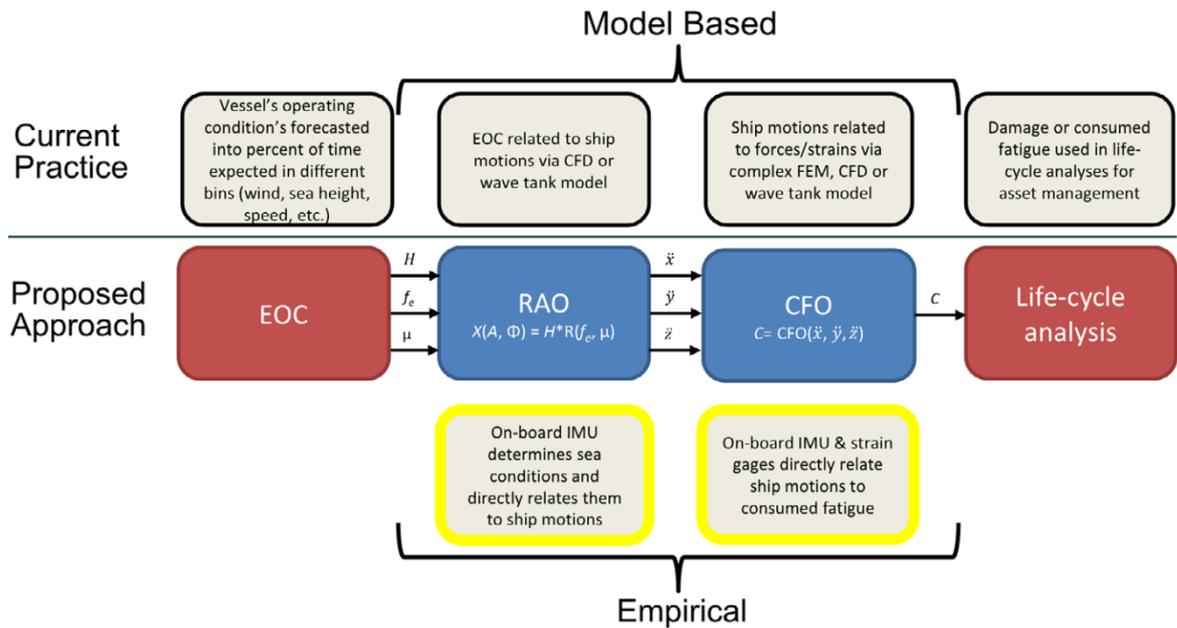


Figure 7. Proposed approach for short-term data collection and analysis (Johnson, et al., 2018, p. 636)

4.1.2 Long-term data

Although, certainly more costly and having a requirement for instrumentation service and replacement, long-term instrumented data collection and constantly updating damage evaluation provides the user with the most up to date results. On vessels with highly irregular EOC's, permanent measuring systems would be beneficial for not having to rely on models that utilize some level of prediction for damage accumulation.

Long-term monitoring with various data types and high sampling rates tend to result in large datasets for analysis and storage. With current day storage technology and cloud data services, this should not be too great of an issue, but relying on stored data always has risks for security, especially for government ships. (Thompson, 2020, p. 1)

4.1.3 Data storage

Data collection is important for analysis throughout the vessel's life or for a short period of time. The amount of storage space needed is vastly depended on the multitude of sensors used in the SHM-system and the amount of data processing completed in real-time. If pre- and post-processing are completed in short time period after data collection, the amount of data needed for storing could be lessened. (Matarazzo, et al., 2015, pp. 59-60)

Technology is constantly evolving; sensor sampling rates are high and storage capacity has cheapened over the years. Growth in network size and wireless data transfer speeds have enabled the use of many wireless variations in sensor equipment as shown in studies by Johnson et al. (2017) and Swartz et al. (2009).

4.2 Technology

As addressed by the previous chapter, data can be acquisitioned for multitudes of vessel hull motions and reactions to waves. All datasets have their contribution to SHM-systems aboard ships. Dependant of course by the ship type and her EOC's.

To collect wanted measurands, use of sensors is required. Sensor placement is evaluated by the hull response analysis. The data they provide is further used in health monitoring, either by user warning and/or fatigue damage calculation. The scope of placement and types of sensors used should be based on needed information from critical details and events greatly contributing to hull damage by earlier analysis, typical equipment for bulk carrier in Figure 8. And common measurands for SHM-systems aboard vessels in Table 2.

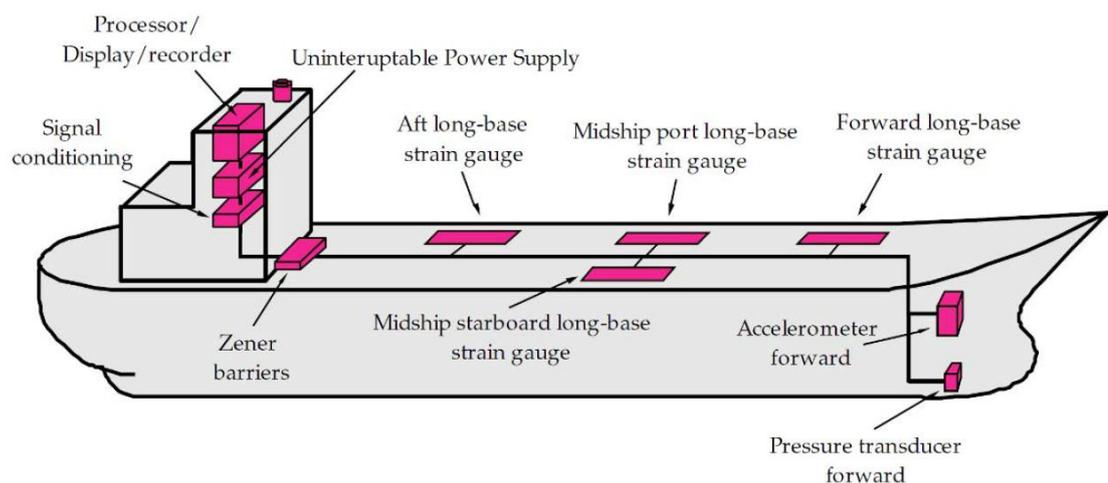


Figure 8. Typical measuring technology on bulk carrier, ShipRight by Lloyds (Bridges, et al., 2013, p. 3)

Table 2. SHM-system measurands and corresponding sensors. (ABS, 2016; Phelps & Morris, 2013; Torkildsen, et al., 2008; Cusano & La Marca, 2015)

Attribute	Subject	Sensor
Global load	<ul style="list-style-type: none"> - Global longitudinal hull deformations without local strains - Hull girder stresses - Springing vibration 	Long base strain gauge (LBSG)
Local load	<ul style="list-style-type: none"> - Local strain effects - Whipping vibration - Ice contact 	Short base strain gauge (SBSG) Pressure transducer
Hydromechanics	<ul style="list-style-type: none"> - Slamming force - Hydrostatic/-dynamic force - Sloshing 	Pressure transducer
Vessel motion	<ul style="list-style-type: none"> - Heave, roll, pitch and yaw - Vessel accelerations 	Inertial Navigation System (INS)
Wave condition	<ul style="list-style-type: none"> - Wave height, length and period - Wave profile and direction to hull 	Wave radar
Ship control	<ul style="list-style-type: none"> - Speed, heading, global position 	Global Positioning System (GPS)

4.2.1 Strain gauges

Strain gauges are often utilised in SHM, the ability to record and evaluate strain and stress from the area of interest is key in fatigue life calculations. Strain gauges come in a lot of variable configurations, but in ships they can be broadly separated in to two groups; long base and short base.

Long base strain gauges are used to measure strain effects in only one direction, ignoring shear strain and evening out the local strain effects from measurements. LBSG's are great for measuring more global deformation phenomena for their larger range, up to 2 m. These sensors are commonly used on larger vessels, more prone for midship failures. (Forestier & Austin, 2009, pp. 4-7)

To assess the vessels vertical bending moment (VBM) using these LBSG's, one can use the relation between moment and section modulus of the midship, as in Equation (1).

$$\varepsilon = \frac{M_{VBM}}{E \cdot W} \quad (1)$$

Where E is the elastic modulus and W is the section modulus of the current ship section. Thermal variations need to be considered for accuracy. (Cusano & La Marca, 2015, pp. 4-5)

Short base strain gauges are for measuring local stress components and can be directly used for fatigue calculations by measuring hot-spot stresses. Local strains contribute mostly to crack propagation and local plastic deformation. SBSG's prove their usefulness in complex structures and ability to measure strain and shear in multiple directions and planes. Tri-axial rosette placement enables the retrieval of all principle and shear stresses. (Phelps & Morris, 2013, pp. 23-25)

Strain gauges can be subjected by electromagnetic interference, usually caused by the use of ferrous alloys and magnetizable equipment aboard. Aluminium alloys used on ships is non-ferrous; thus, doesn't contribute to this phenomenon. Electromagnetic emissions are also recognised by class societies and should be handled anyway. (DNVGL-RU-NAVAL, 2015)

By using fibre optic strain sensors, immune to electromagnetic fields, interference problem is solved. They also can be routed to use less cabling due to multi-fibre cables. Reduced noise is a certain benefit when analysing the results. (Torkildsen, et al., 2008, pp. 2-3; Phelps & Morris, 2013, p. 3; Chang, et al., 2003, p. 263)

In particular, strain gauges need to be temperature compensated to produce accurate results. The compensation is solved by using dummy sensors for neglecting the expansions and contractions caused by temperature changes. The dummy sensor only measures the length change by temperature and doesn't receive the strain from the loading. (Phelps & Morris, 2013, pp. 25-26; Cusano & La Marca, 2015, p. 5)

Generally, strain gauges can be used in multiple formations to obtain princible stresses. When the direction of stresses is not known, tri-axial rosettes are used. Derivation of stress components are achieved with specific strain gauge placements (Hoffman, 2012, pp. 21-26, 44-48). Strain gauges can be used for following applications (Niemi, 1996, p. 37; Hoffman, 2012, pp. 36, 46):

- Structural hot spot stress measuring
- Nominal stress measuring
- Strain measurements for S-N curve creation
- Verification of FEA results
- Experimental definition for K_s
- Load cycle counting
- Dynamic response measuring
- Residual stress measurement

4.2.2 Pressure transducers

Although slamming events can be recognised by the use of strain gauges or even acceleration sensors, pressure readings from the point of impact in the bow can be converted into force readings for better understanding of how impactful the slamming events is. Zero pressure can also be used for bow emergence warning. (ABS, 2020, p. 4)

The installation locations for pressure sensors is dependent on the load for analysis. For slamming, direct load analysis based on simulated wave loads, e.g. CFD or 3D panel method, are suitable for finding the correct locations. Pressure sensor devices have also been used in measurements of extreme wave events and ice loads acting on the hull (Smith, 2007, p. 6).

4.2.3 GPS and INS

Both GPS and INS systems provide information about the ship movement. GPS is important for vessels SHM-system as it provides information about ships heading and current speed, both relevant to ships longevity in terms of recognising the environmental effects contributing to the damage accumulation. (Bridges, et al., 2013, p. 2)

INS provides information about the ships motion in waves. Critical motions for high stresses in hull structures can be derived by comparing the time domains for strain and motion. INS data is also used to compensate the vessels movement when profiling wave length, height and bow profile (Torkildsen, et al., 2005, pp. 1-2).

4.2.4 Wave radar and altimeter

In general, wave radar systems are used to monitor sea conditions, containing information for wave periods, heights, lengths and directions. The EOC's can be stored and analysed later for effects on the hull life or even creating the operational profiles discussed in Chapter 4.1.1. This system certainly increases the accuracy of such prediction profiles as you wouldn't have to solely trust buoy data (Johnson, et al., 2018, p. 650).

Microwave altimeter can be used to monitor the vessels bow height to the sea level; thus, enabling the profiling of waves. With the vessels motion compensation by INS, this gives information on which wave profiles correlate most to vessels stress responses. (Phelps & Morris, 2013, p. 15)

4.2.5 Data loggers and compute units

Data logger is a device capable of capturing and storing data from sensor applications, the data types are usually not limited. These devices can often be configured to run stand-alone to store the data offline for post-processing either by straight connection to the compute unit or by physical data transfer. Online models offer the possibility of data to be transferred wirelessly to onshore compute units, even running parallel to the compute unit responsible for needed calculations. Parallel operation enables the real-time aspect for online hull monitoring. (Ibrahim, 2010, pp. 397-398)

The decision between on- or offshore computation mostly depends on the chosen data logger, collectable data amounts and data sensitivity. The larger amount of data could be too large for wireless transmission to a server/PC and more viable option would be onboard calculation. Wireless options can also prove to be a security risk when transmitting sensitive data such as GPS coordinates over the airwaves.

4.3 Input

As shortly discussed earlier, real-time fatigue monitoring in this study is considered as a process which calculates the on-going damage rate and remaining life of structural detail within a reasonable time after the data collection. The configuration of this SHM-system affects the timeframe for real-time calculation. A vast multitude of sensors and complex

calculation procedures with raw data slow down the derivation of output values or requires significant amount of computer power resources for expected data output frequency.

Whether the system relies on short- or long-term data it still requires stress responses and material information as an input for the analysis.

4.3.1 Structural behaviour

The analysis of structural responses to loads, stress RAO's, are defined by the chosen fatigue calculation method per critical detail. Most accurate methods utilise the FEM for local stress responses and stress concentration factors (SCF). The different fatigue calculation methods should be chosen based on applicability on the structural detail of interest; thus, providing the best results for the remaining life estimate. Structural behaviour also includes the measured data from the vessel hull.

4.3.2 Material performance

Dependency for required material parameters are again down to the chosen fatigue calculation method and structural detail under evaluation. For most methods, needed aluminium parameters can be found from multiple sources, such as rules of classification, ship structure committee (SSC) reports, International Institute of Welding (IIW) and Eurocode 9. The respective S-N curves and FAT-classes are based on experiments for regarding these materials and structural details (Hobbacher, 2008, p. 42).

4.4 Pre-processing

The pre-processing in real-time fatigue monitoring is considered as data filtering, organizing and relation between data sets. Pre-processing can be divided into two different paths, load history and fatigue capacity. Load history is based on the collected load history from installed instruments. The history of data collection can consist, but not limited to, components listed in Table 2. Fatigue capacity is then based on the cyclic capacity of the whole vessel hull or structural detail, usually of welded joints and plate edges. Related parameters to fatigue calculations can be found from literature. Pre-processing also includes the fitting of these two paths together, the relation between cyclic loading and capacity.

4.4.1 Cyclic load spectrum

Measured vessel responses are highly variable and usually contain a lot of noise, depending on the sampling rate. The raw data retrieved from multitude of instruments must be converted to a more convenient form to fit into fatigue life calculations. The transformation of stress responses can be achieved by using an already proven methods, such as range-pair counting, level-crossing counting, reservoir counting and rainflow counting (RFC). (Marsh, et al., 2016, pp. 757-758).

Rainflow counting first introduced by Matsuishi and Endo (1968) is the most used method and has been approved in multiple design guidelines, such as Eurocode (SFS-EN 1999-1-3, 2007) and ship fatigue guidelines by DNV-GL (DNVGL-CG-0129, 2015) and ABS (ABS, 2020). RFC has seen modifications also to suit modern computers for cycle counting. A best example of this is the modified method developed by Downing and Socie. Their method 'One pass' is based on the full hysteresis loop of stress-strain behaviour. It checks for peaks as they occur rather than waiting for the full load spectrum to complete. (Downing & Socie, 1982, pp. 1-3)

Load cycle counting is often paired with the stress-strain behaviour of the material on hand. The stress-strain hysteresis loop is a cyclic representation of materials strain-stress relation and it is based on the elastic-plastic behaviour. This hysteresis loop cycle representation is particularly useful in damage estimation as well by connecting it to the chosen cycle counting method, especially in variable amplitude loading. Relation between stress-strain and load cycle counting in Figure 9. (Okamura, et al., 1979)

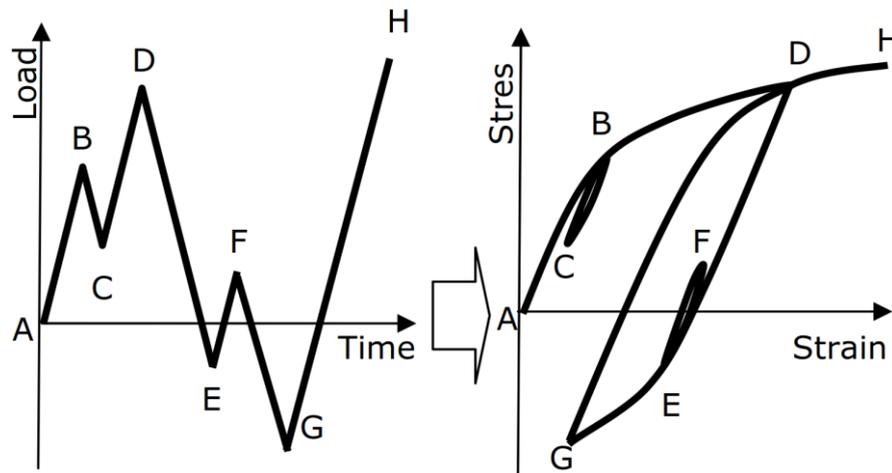


Figure 9. Relation of stress-strain and load cycle counting (Passipoularidis & Brøndsted, 2010, p. 44)

The RFC-method is not however compatible for real-time cycle counting in its original form as it is solely based on the history of loading from peak to peak. The history relation leads to increased amount of calculation needed for finding fatigue cycles; thus, not very suitable for real-time applications. History relation also leads into delayed data processing and display for the user.

For the applications that require a continuous cycle counting and current damage rate evaluation, a method of real-time RFC has been created by Musallam and Johnson (2012). They call their method for Rainflow cycle counting “The On-line method”. This method is based on two buffers after which the cycles are calculated as full- and half-cycles. As the original method is based on similar approach of full- and half-cycle association, the results from this real-time counterpart can be expected to be the same. The method has been developed first hand for thermal fatigue calculation solutions but can be used on other quantities as well.

In short, the recursive for minimum driven procedure is as follows; Load sequence starts, first value is set as minimum and placed in min-stack. Second value arrives, it is checked against the first one. If it is greater than the first, it is set as maximum and placed in max-stack. Next value arrives, it is less than the first minimum, a half-cycle is counted and the delta between first minimum and first maximum is calculated. Next value arrives, it is greater than stored minimum but less than the stacked maximum, a full cycle is realised and calculated. The procedure can be driven either with max or min values, meaning that in either

method, only two min values and one max value is kept and vice versa. Maximum driven in Figure 10 and minimum in Figure 11.

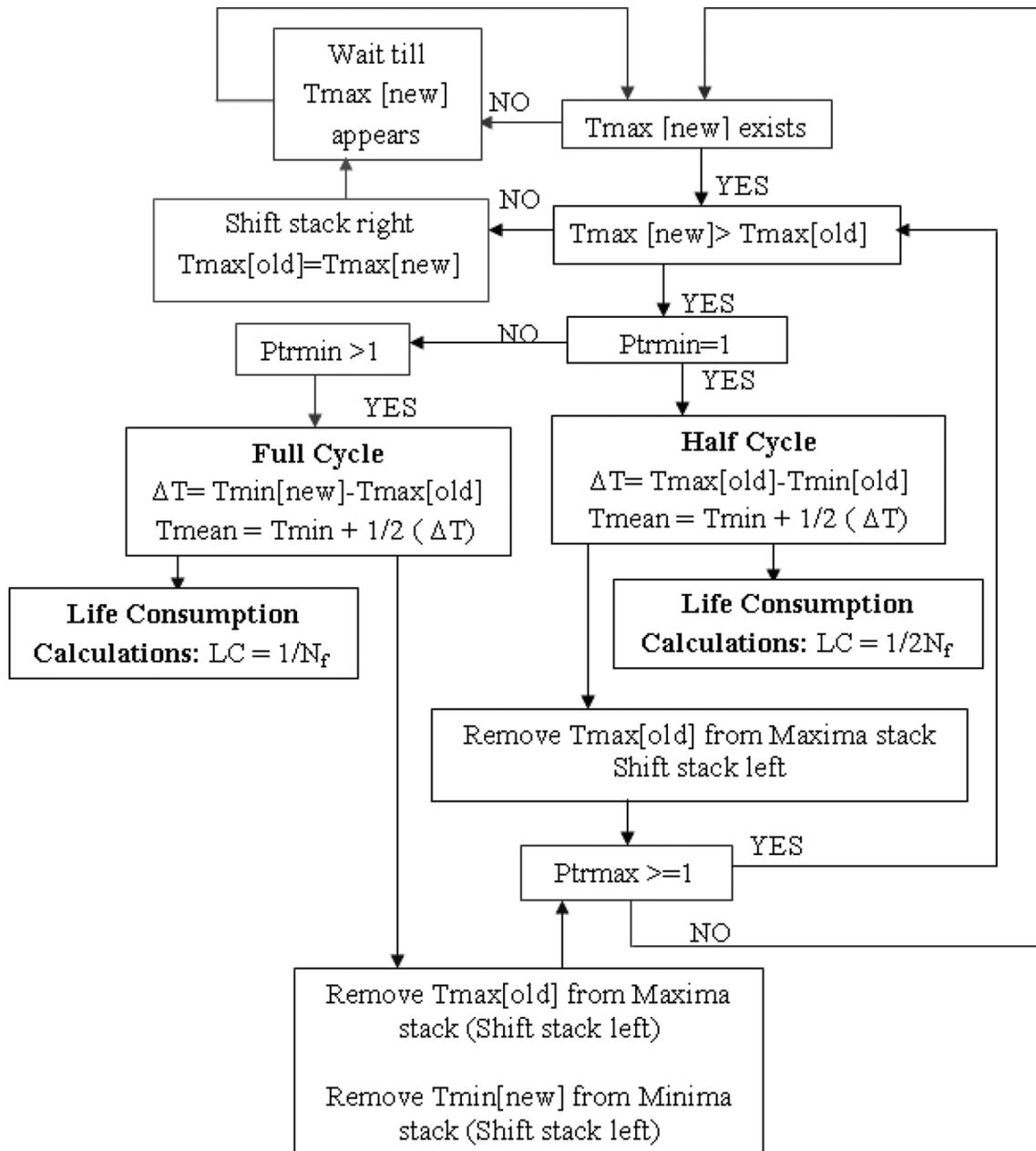


Figure 10. Stack counting driven with maximum values, presented with thermal application (Musallam & Johnson, 2012, p. 982).

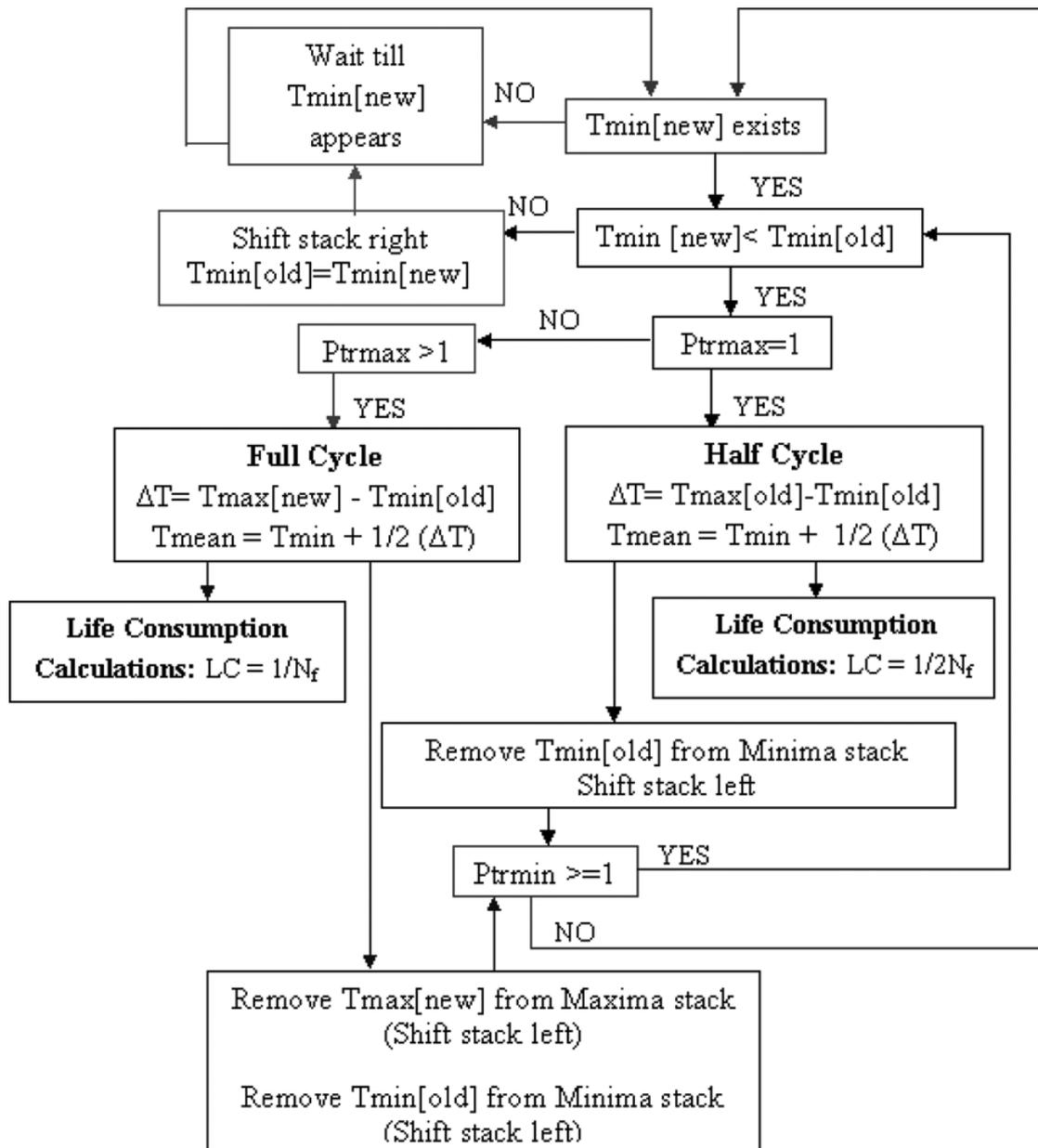


Figure 11. Stack counting with minimum values, presented with thermal application (Musallam & Johnson, 2012, p. 982).

The code produced for this method can run fast, but more experiments should be completed to see how it copes with quickly alternating loads, such as vibrations by whipping and springing phenomena. Cycle counting from thermal spectra shown in Figure 12.

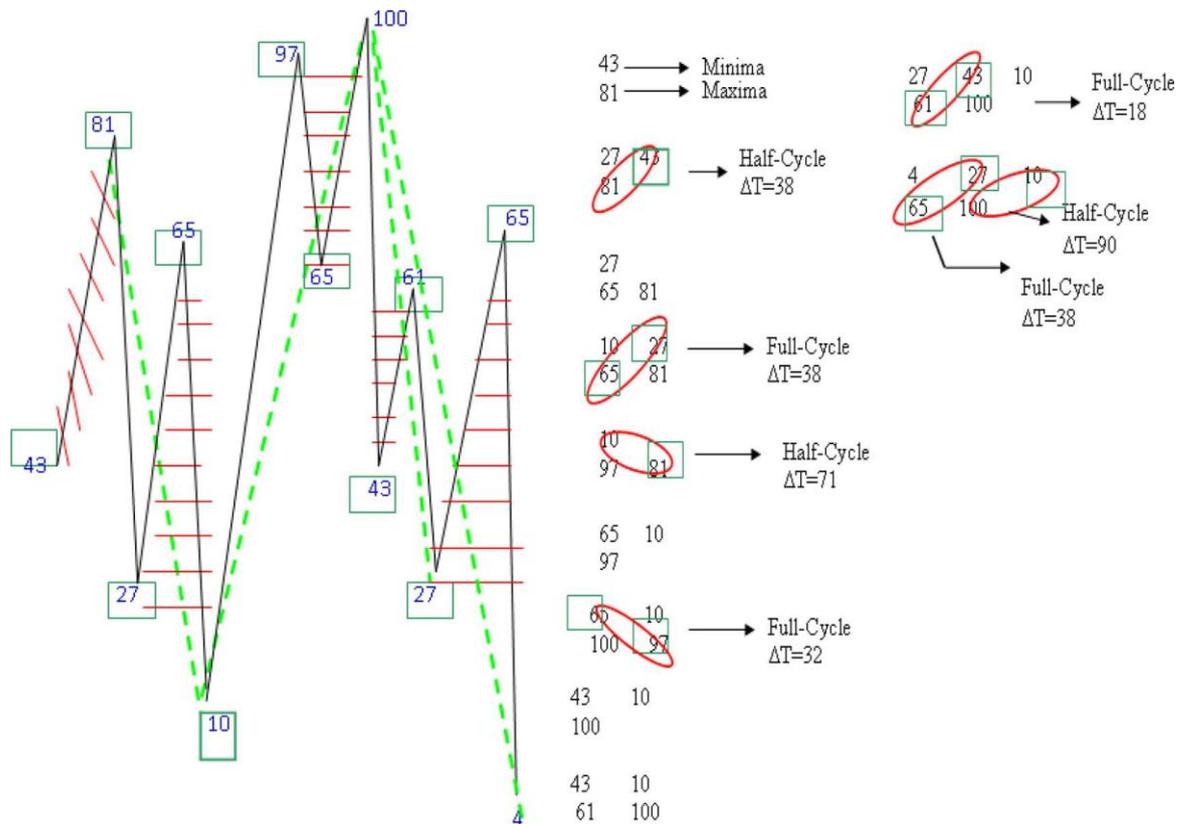


Figure 12. Real-time cycle counting from thermal spectra (Musallam & Johnson, 2012, p. 983).

This proposed method has also been covered by Ciappa & Blascovich (2015), Samavatian et al. (2018) and Loew et al. (2019). The method was found usable but under review for phenomena such as metal plasticity and creep when under heavy loading during real-time fatigue monitoring. If severe creep occurs during strain-stress measurements, the calculations for fatigue life could be compromised. Samavatian (2018) employs a creep and extremity check to their 4-point algorithm for online fatigue calculation.

4.4.2 Stress determination and fatigue capacity

All structures experiencing cyclic loading have a certain threshold until failure. This threshold can be calculated with few methods, each method having their pros and cons. All of these methods can however be utilized in ship structure fatigue calculations. The following chapters explain these methods for stress and capacity in short and evaluates their use in real-time calculation. The capacity definition for structural details doesn't have to rely on only

one method. Suitable methods for all critical details can be decided individually, basics for choosing the correct method can be seen as in Table 3.

Table 3. Choosing the fatigue calculation method based on stress raisers (Kozak & Gorski, 2011).

Type	Stress raisers	Stress determined	Assessment procedure
A	General analysis of sectional forces using general theories e.g. beam theory, no stress riser considered	Gross average stress from sectional forces	Not applicable for fatigue analysis, only for component testing
B	A + macrogeometrical effects due to design of the component, but excluding stress raisers due to the welded joint itself	Range of nominal stress (also modified or local nominal stress)	Nominal stress approach
C	A + B + structural discontinuities due to the structural detail of the welded joint, but excluding the notch effect of the weld toe transition	Range of structural hot-spot stress	Structural hot-spot stress approach
D	A + B + C + notch stress concentration due to the weld bead notches a) actual notch stress b) effective notch stress	Range of elastic notch stress (total stress)	a) Fracture mechanics approach b) Effective notch stress approach

4.4.3 Nominal stress method

Nominal stress method is the most simple and fastest method computationally and analytically to solve the stresses and fatigue capacity of a structural detail. The method is based on solving nominal stress on the sectional area of interest analytically, with direct calculation methods or experimentally. Macrogeometrical phenomena, discontinuities and misalignments must be included by stress factors in order to achieve accurate results. Simple example of nominal stress in Figure 13. (Hobbacher, 2008, pp. 21-23; Niemi & Kemppe, 1993, p. 232)

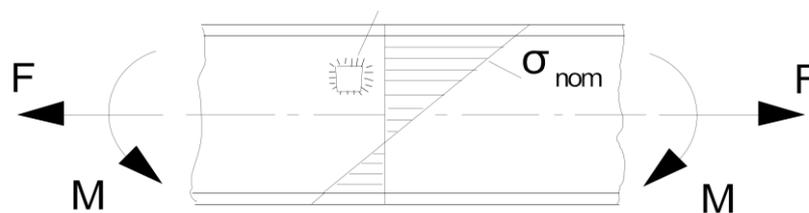


Figure 13. Simple representation of nominal stress on a beam sectional area (Hobbacher, 2008, p. 21)

When concerning fatigue with nominal method, the amount of cycles is calculated using S-N curves. The S-N curves are based on experimental data for real joints. Many structural

details have their own fatigue detail (FAT) classes, defining the characteristic fatigue life of the joint. FAT-classes are based on stress variations for 2×10^6 cycles. General FAT-classes for aluminium details are defined in corresponding ship design guidelines, usually referencing the IIW Recommendations on Fatigue of Welded Components. Example of FAT-classes and SN-curves for aluminium shown in Figure 14.

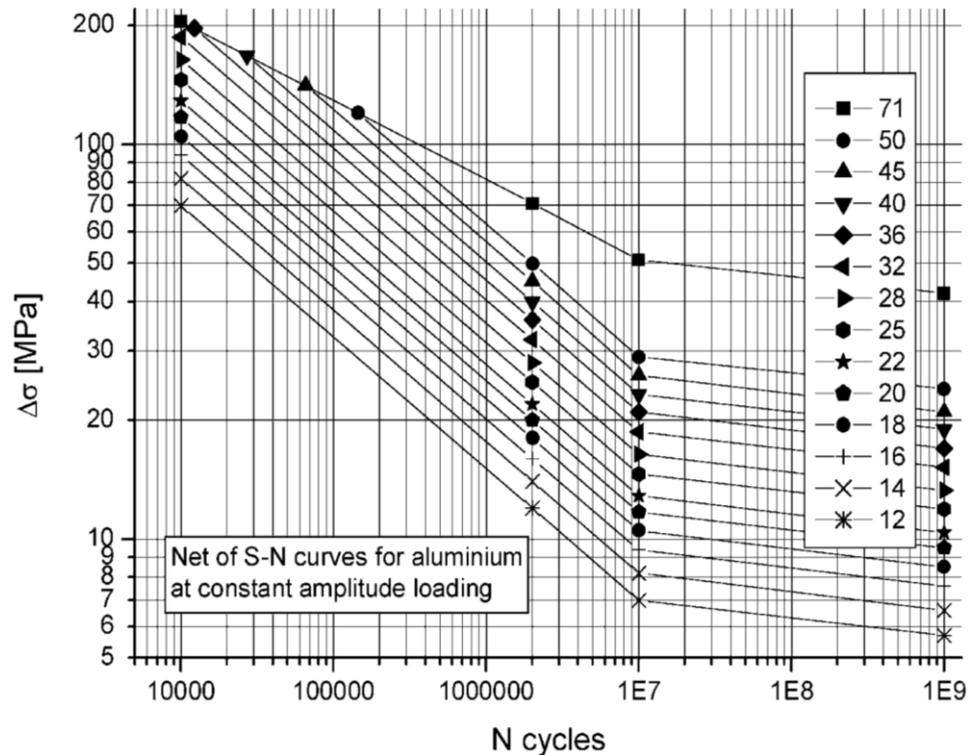


Figure 14. S-N curves and FAT-classes for aluminium alloys.

Generally, this method can be chosen when the structure under review features geometric qualities of a corresponding FAT-detail from IIW, the nominal stress has a clear retrievable quantity and the structural detail doesn't feature significant shape and welding errors.

4.4.4 Structural Hot-Spot stress method

In nominal stress method, the actual geometry of the fatigue detail is considered when selecting the corresponding FAT-class for calculations. The actual stress readings of the detail do not feature the actual structural stresses, known as hot spots. The welded details have much more complex geometry than the FAT-classes allow for, resulting in less accurate results.

Hot-spot stress method (HS) for fatigue is considered to solve this problem by taking an advantage of FEM or measured strain to feature the complex geometry in the analysis and producing the structural stresses as a result. The availability of increased computer performance has enabled the possibility of such analyses to be completed in relatively short span of time. The FEM has also enabled the designers to create formulas for calculations in advance for stress estimation. (Niemi, et al., 2018, pp. 1-2)

The type of hot-spot stress method you should use depends on the structural detail under evaluation, the choice is between type A and B. Type A hot-spots are typically on the plate surface, enabling for a linear extrapolation of stresses through-thickness. Type B hot spots are located generally on the plate edge; thus, through thickness effects are neglected. Type A and B hot-spots presented in Figure 15.

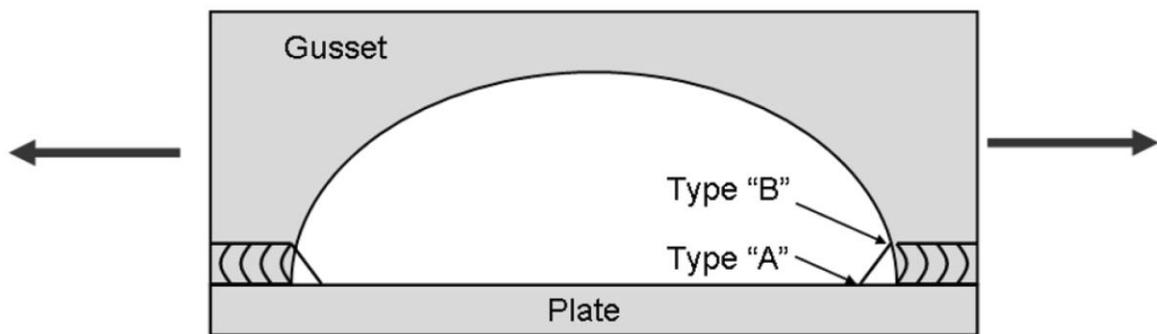


Figure 15. The types of hot-spot stress points on a gusset. (Lee, et al., 2010, p. 202)

In type A hot-spots, the stress distribution can be linearly estimated by using set ranges from the weld boundary. Usually the number of points and the distances are defined by the design code relevant for the vessel. Example of linear extrapolation in Figure 16. (Hobbacher, 2008, pp. 26-28)

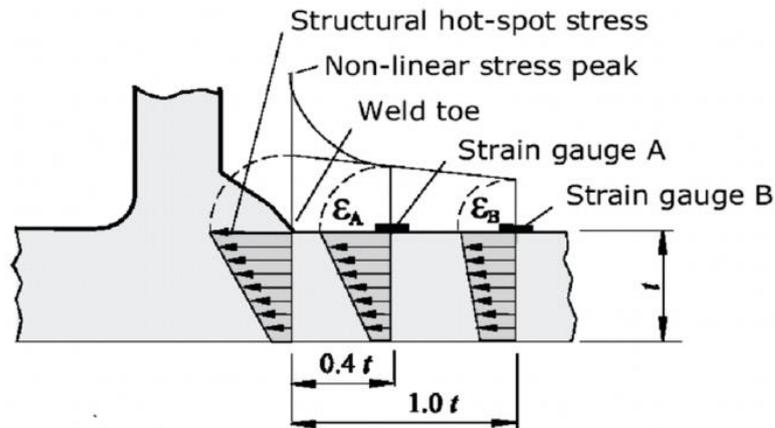


Figure 16. Linear extrapolation of hot spot stresses. (Lee, et al., 2010, p. 203)

The FEA method has to yield results for minimum and maximum stresses for a loading range, thus requiring at least two load cases to be analysed. The element type can be chosen between 2-D shell and 3-D solid elements, both having their requirements for geometry preparation and mesh sizing. Generally, a mesh size of *thickness x thickness* is considered as sufficient. Geometry requirements for different element types shown in Figure 17. (Lee, et al., 2010, pp. 204-205; Niemi, et al., 2018, pp. 18-21)

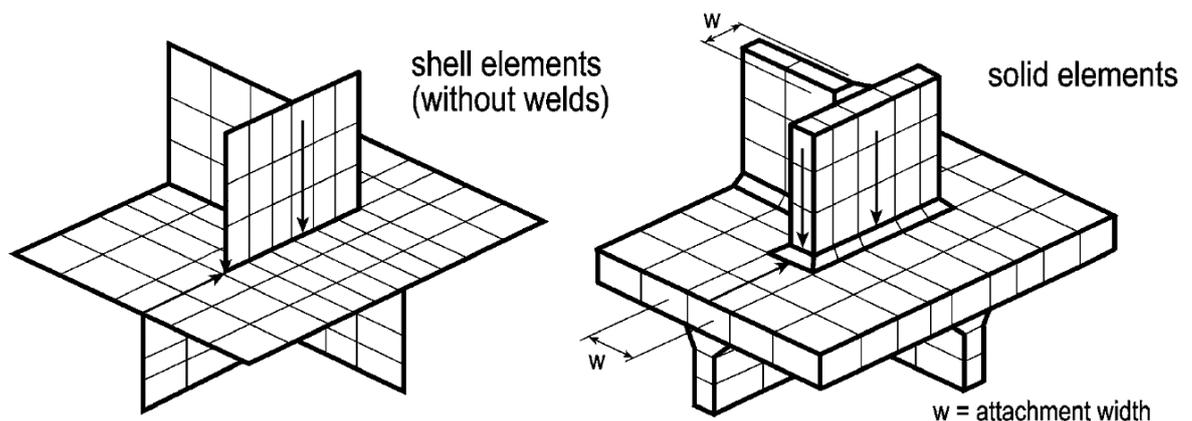


Figure 17. Geometry specification for the two element types (Hobbacher, 2008, p. 29).

Although the fatigue analysis design codes for ships are often based around the IIW specifications for welded joints, a further familiarization into the class notations should be followed for the hot-spot fatigue analysis. Specifications for measuring distances etc. could differ from the IIW recommendations.

4.4.5 Effective notch stress method

The Effective notch stress method (ENS) is based on the idea of parametrizing the stress occurring at the weld root (Fricke & Kahl, 2007, pp. 2-3). The ENS method is able to describe the total stress at the root and toe, including the non-linearity by the notch. The notch method assumes a linear-elastic material behaviour and an effective notch instead of the actual notch geometry with the radius of $r = 1 \text{ mm}$ which has been set for steel and aluminium and plates at least 5 mm thick. For thinner plates, using 0.05mm is accepted. The basis of ENS geometry idealisation is shown in Figure 18.

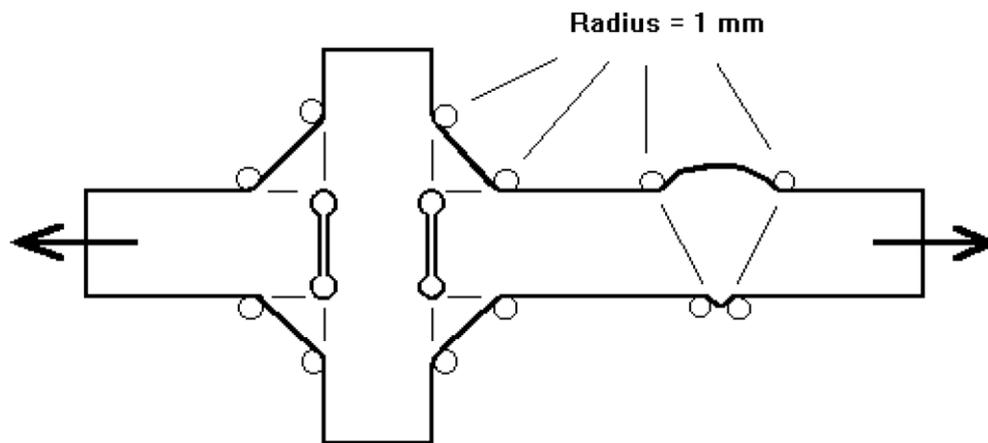


Figure 18. ENS method geometry idealisation (Hobbacher, 2008, p. 35).

ENS requires a high-quality mesh to include all macro- and micro-geometrical effects from the joint. The meshing sizes are recommended in the respective IIW document by A. Hobbacher. The Stress Concentration Factors (SCF) are retrieved from the FEA and further utilised in fatigue calculations.

ENS provides advantage to nominal and HS method by taking the local notch geometry, such as weld leg and theoretical throat into consideration. The modelled weld is still only a representation of the real geometry and surface quality; thus, the weld quality must be on par for accurate results. Porous or poorly executed weld geometry will not reach the intended lifetime calculated with ENS or any other methods. (Fricke, 2013, p. 763)

4.4.6 4R method

The 4R method, developed from 3R method, is a combination of the local strain methods, Smith-Watson-Topper (SWT) criterion and the previously mentioned ENS method. The method has been developed to overcome the held back possibility of the ENS method in terms of actual weld geometry, residual and mean stresses, plus material strength parameters. Björk et al. (2018, p. 2) explains that the method is named after the four parameters it uses in addition to the ENS:

- “material ultimate strength, R_m
- applied stress ratio, R
- residual stress, σ_{res}
- weld toe geometrical quality in terms of r_{true} ”

The method follows the approach of the ENS method and continues by the definition of the stress ratios and residual stresses. SCF's can be derived by using the FEA as mentioned in the previous chapter in the ENS method. The ENS weld quality is further adjusted in the refinement of the weld toe radius by the actual notch radius. Methodology of stresses shown in Figure 19.

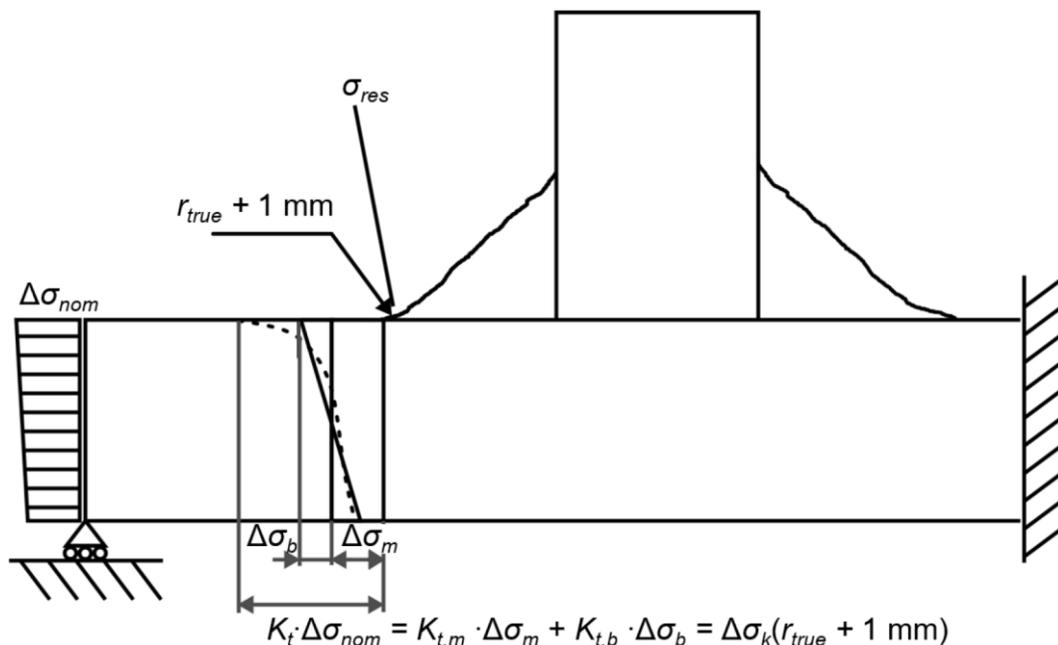


Figure 19. Methodology for stresses of 4R method (Björk, et al., 2018, p. 2).

The idea is to evaluate the joint strength by the local elastic-plastic behaviour at the notch. This local stress ratio evaluation is based on the Ramberg-Osgood material model, mean stress effect according to SWT and the unloading phase of strain decrease by Masing equation. The relation and derivation of set approaches gives us the definition of the local stress ranges. This is further elaborated in the research by Björk et al. (2018). The local stress range in context of the stress-strain behaviour of the 4R method presented in Figure 20. (Björk, et al., 2018, pp. 2-4)

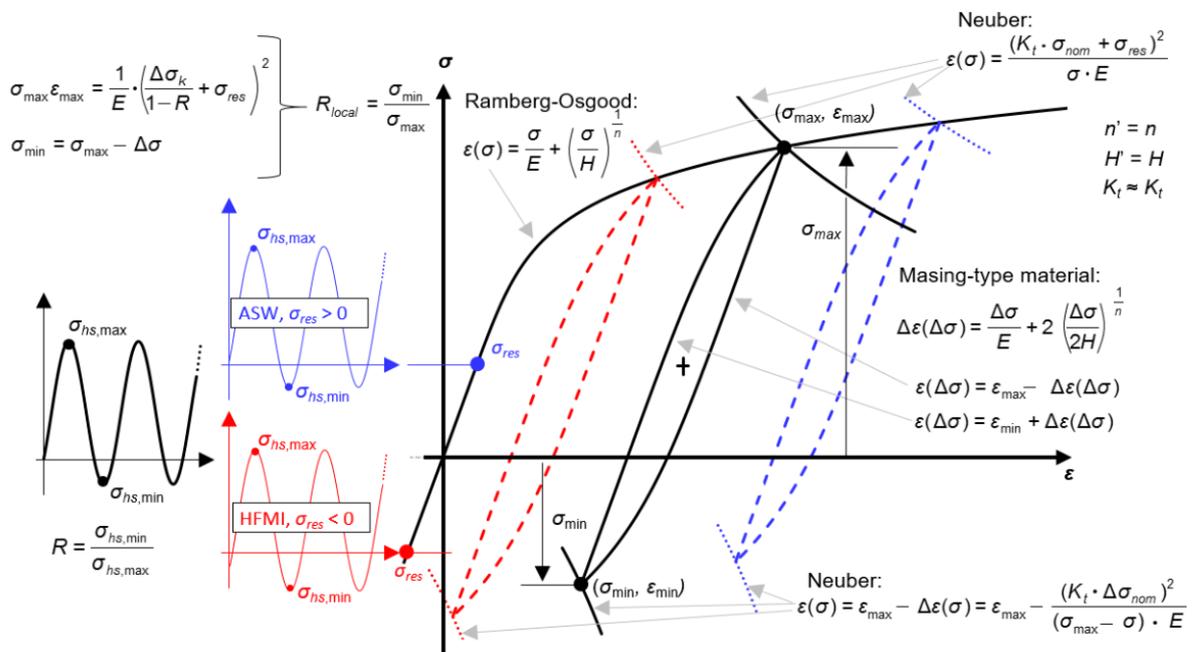


Figure 20. Defining the local stress ratio for the 4R method (Björk, et al., 2018, p. 3)

The method inherits the use of a master curve created for the material. As for now it is developed for steel but needing further elaboration for materials such as aluminium. The master curve for the 4R method is created by noting the number of cycles and scatter in the material S-N curve, inheriting the use of Minimization of Sum of Squared Perpendicular Distances (MSSPD) method for curve fitting. The proposed perpendicular offset approach yields into a larger correlation coefficient for the regression analysis, upping the accuracy for the fatigue life analysis. (Björk, et al., 2018, pp. 5-6; Nykänen & Björk, 2015, pp. 295-298)

4.4.7 Local strain method

Loads surpassing yield strength are often not allowed by the design codes for seagoing vessels. If such occurrences are allowed and common, the fatigue capacity must be defined through local strain method. For full analysis, the local strain analysis is followed by fracture mechanics. With these methods, the failure is analysed by crack initiation, propagation and final fracture. The local strain life is calculated by using a similar approach to the stress-life methods but require a description for the strain life – curve (ϵ -N). This yields for the use of Ramberg-Osgood stress-strain relation and modified damage parameters. Local strain method can be used for both LCF and HCF. (Fatemi, 2020a, pp. 43-45; Fiedler & Vormwald, 2016, pp. 31-37)

4.4.8 Fracture mechanics

The basis of fracture mechanics is the definition for the crack growth speed. This knowledge requires the information for stress intensity factors, fracture toughness of the material, initial crack size or estimation and the final crack size to calculate when the final fracture occurs. The method is usually used in maritime applications when initial crack can be assumed or recognised using NDT's for flaws to ensure safe operation despite the crack. Fracture mechanics are used together with S-N or ϵ -N life methods to form a fatigue life estimate from the crack nucleation to final fracture, shown as Equation (2). (Fatemi, 2020b, pp. 4-6; Kramer, et al., 2000, p. 4, 61)

$$N_{total} = N_{nucleation} + N_{growth} \quad (2)$$

Where the growth period is expressed with Paris power law and presented on a logarithmic scale for linear portion of the growth and a linear slope coefficient shown in Figure 21 (Fricke, 2013, p. 756). Paris relation for linear crack growth rate is expressed as in Equation (3).

$$\frac{da}{dN} = C(\Delta K)^m \quad (3)$$

Where C and m are material coefficients and ΔK represents the stress intensity.

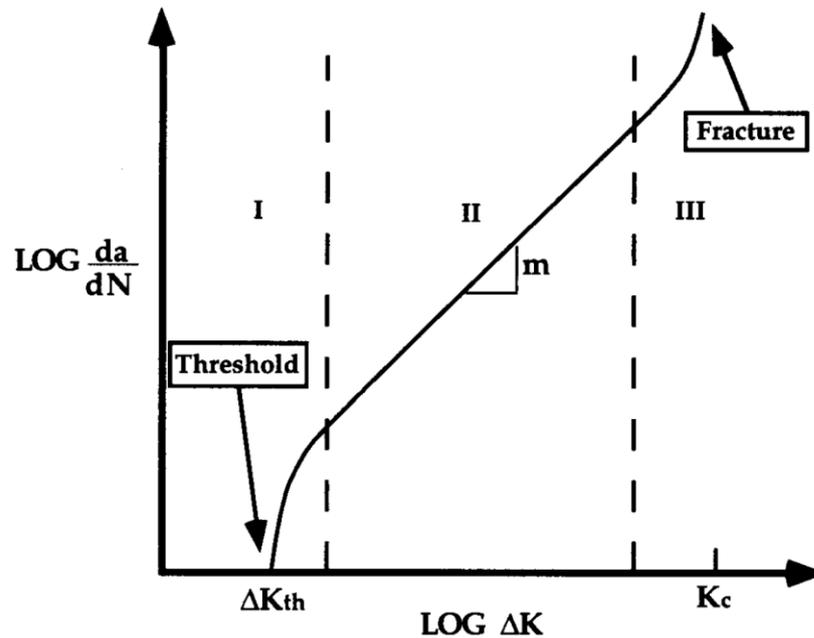


Figure 21. Logarithmic presentation of the crack growth until failure (Kramer, et al., 2000, p. 133).

The IIW document for fatigue by Hobbacher (2008, p. 115) recommends the fracture mechanics to be used in the following cases:

- “The Miner’s summation is sensitive to the exact location of the knee point of the fatigue resistance S-N curve,
- The spectrum of fatigue actions (loads) varies in service or is changed, and so the sequence of loads becomes significant or
- The resistance S-N curve of a pre-damaged component has to be estimated.”

4.4.9 Capacity and load cycle relation

To build a real-time fatigue and damage accumulation calculation method, the relation between load cycles and fatigue capacity must be realised. The current DNV-GL methodology for design life calculation is based around the linear damage sum and cumulation by Palmgren - Miner’s rule. The method involves setting the damage total sum and counting how many set stress range cycles it takes to reach this total sum. If the ship reaches the set value before the intended lifetime, the iterative process re-designs the failed details and the analysis is done again. (DNVGL-CG-0129, 2015, p. 53)

4.5 Post-processing

As the pre-processing has been established, fatigue capacity calculation and cycle collection decided, the data needs to be transformed into a form which can be made use off. The data can then be useful for the end-user to improve upon design aspects, vessel operation and periodical service. The post-processing can be configured to run onboard the vessel or on-shore, again, depending on the collected amount of data and the performance requirements for calculation.

4.5.1 Damage estimation method

The vessel fatigue calculations rely on Palmgren-Miner rule for damage accumulation. As it is mentioned in previous chapters (2.6.2, 4.4.9) to be an approved and recommended method for life cycle estimation by multiple design codes. It is also endorsed to be used in hull condition monitoring systems in real-time damage calculation. Here, online fracture mechanics and real-time crack growth monitoring is ignored as they've not been verified for accuracy by design codes for ship hull condition monitoring. However, it is recommended to use the measured data for scheduled crack growth calculations to ensure that the predicted life by linear damage methods are correct. (ABS, 2020, pp. 7-8)

The Palmgren-Miner linear cumulative damage rule is based around multiple stress ranges contributing together to the damage sum. In short, the Miner's rule represents the proportional amount of damage by the ratio between stress cycles and cycles to failure for the corresponding stress range. There exists a plethora of variations for this rule, but as it is generally approved by design guidelines in its original form, only the original is discussed in more detail. The rule is defined as Equation (4). (Hobbacher, 2008, pp. 109-110)

$$D = \sum_{i=1}^k \frac{n_i}{N_i} \quad (4)$$

Where n_i represents the number on cycles for the stress range of interest and N_i shows the number of cycles until failure for that same range. The fatigue capacity is evaluated using the chosen fatigue calculation method. The Miner's rule provides more accurate and reliable results when the stress spectrum represents narrow-band random loading. The use of Miner's

rule is not yet established when whipping or springing occurs (Fukasawa & Mukai, 2014, pp. 433-434).

4.5.2 On demand and storage

One of the most important features for a real-time SHM-system is to be able to show the prevailing damage rate to the user. This enables the operator to adjust the use of the vessel to such extent that the hull does not sustain too much damage. The limit states should be adjusted so that the vessel's hull won't experience stresses over the yield limit; thus, avoiding plasticity and permanent damage. The real-time damage indication can be based on the Miner's rule by expressing the damage rate at requested time frame per stress range/mean stress profile. Miner's rule expressed in Figure 22 and Figure 23 based on the capacity and accumulated damage.

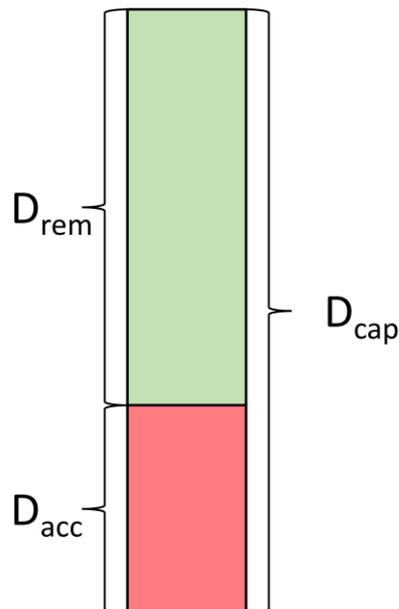


Figure 22. Singular profile for Palmgren-Miner's linear damage accumulation.

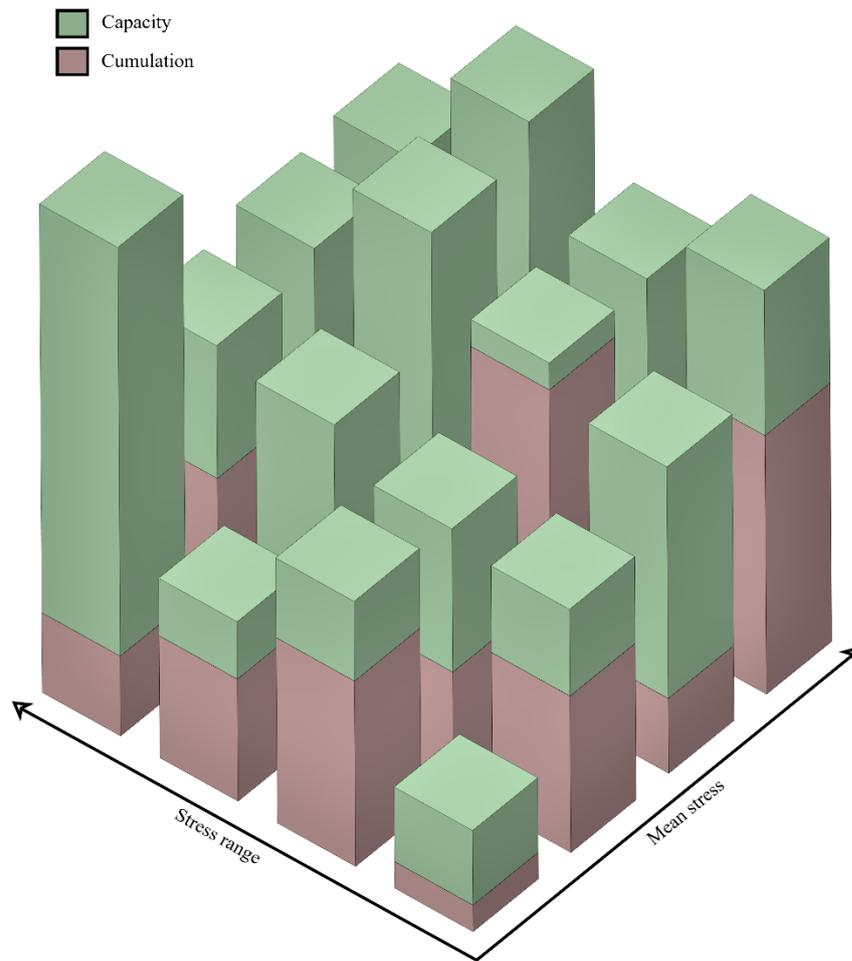


Figure 23. Multiple profiles for linear damage accumulation.

As the linear accumulation is represented by Equation (4) and is based on summation of the cycle profiles, the prevailing damage rate can be simply calculated in a selected time interval and presented to the user. This way the user has a clear vision of the damage caused to the vessel by the current conditions and manoeuvres. Simple representation of the Miner's damage rule in a selected time frame could be as in Equation (5).

$$D_{rate} = \sum_t^T D_{calc.} \quad (5)$$

Here, the D_{rate} represents the cumulated damage in the selected time frame, $D_{calc.}$ the damage sum calculated for cycles in time delta, T is the elapsed time since start and t is the chosen

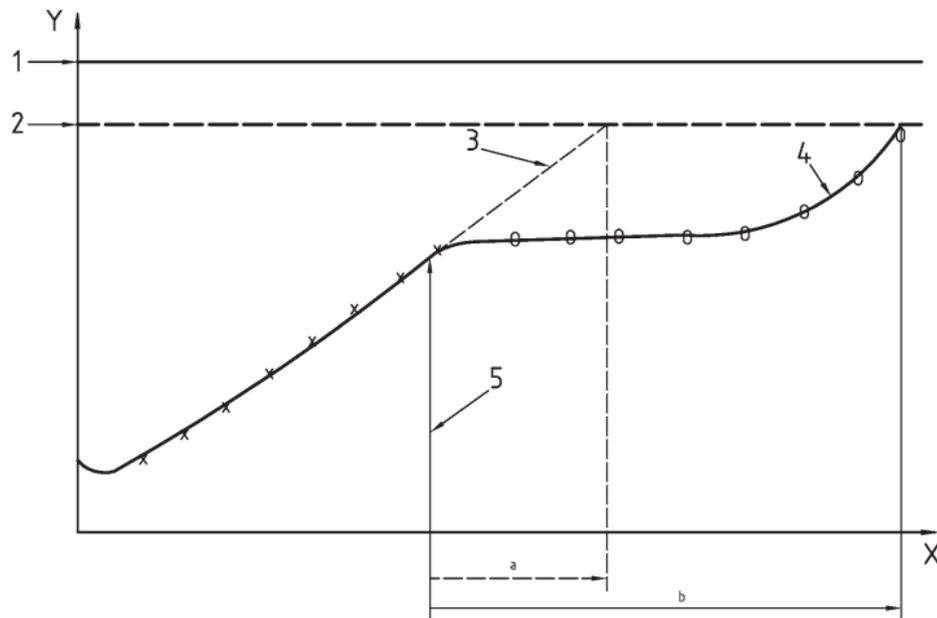
time step behind the elapsed time to produce a time delta. The damage rate can also be displayed in respect to time to see the impact per chosen time period as in Equation (6).

$$\dot{D}_{rate} = \frac{1}{T-t} \sum_t^T D_{calc}. \quad (6)$$

The above representation is practically the most useful for displaying the current damage rate for the user. Higher values indicate higher damage output.

4.5.3 Mechanical prognostics

For the user, the knowledge of the remaining usable life of the vessel hull is important for estimating when the hull has reached certain capacity or threshold. The end-of-life can be simply determined by using the current damage rate as an estimate for the failure occurrence time frame through extrapolation or projection. Common representation of the curve fitting techniques in Figure 24. (SFS-ISO 13381-5, 2015, p. 12)



Key

X	time	1	failure value
Y	value of parameter	2	trip set point
x	known points	3	extrapolation
o	behaviour points	4	projection
a	ETTF (extrapolation)	5	present time
b	ETTF (projection)		

Figure 24. Linear extrapolation and projection for ETTF (SFS-ISO 13381-5, 2015, p. 12).

Extrapolation uses the previous data to express the future damage behaviour trend until failure (Jakobsson, 2019, pp. 2-3). It doesn't require complex mathematical equations for this expression; thus, it is an efficient method for real-time and on-demand applications. Extrapolation can be configured to show the damage trend by the current damage rate or the overall scenario through the structure lifetime, shown in Figure 25. The Estimated Time To Failure (ETTF) can be then estimated with the extrapolated trend crossing the threshold.

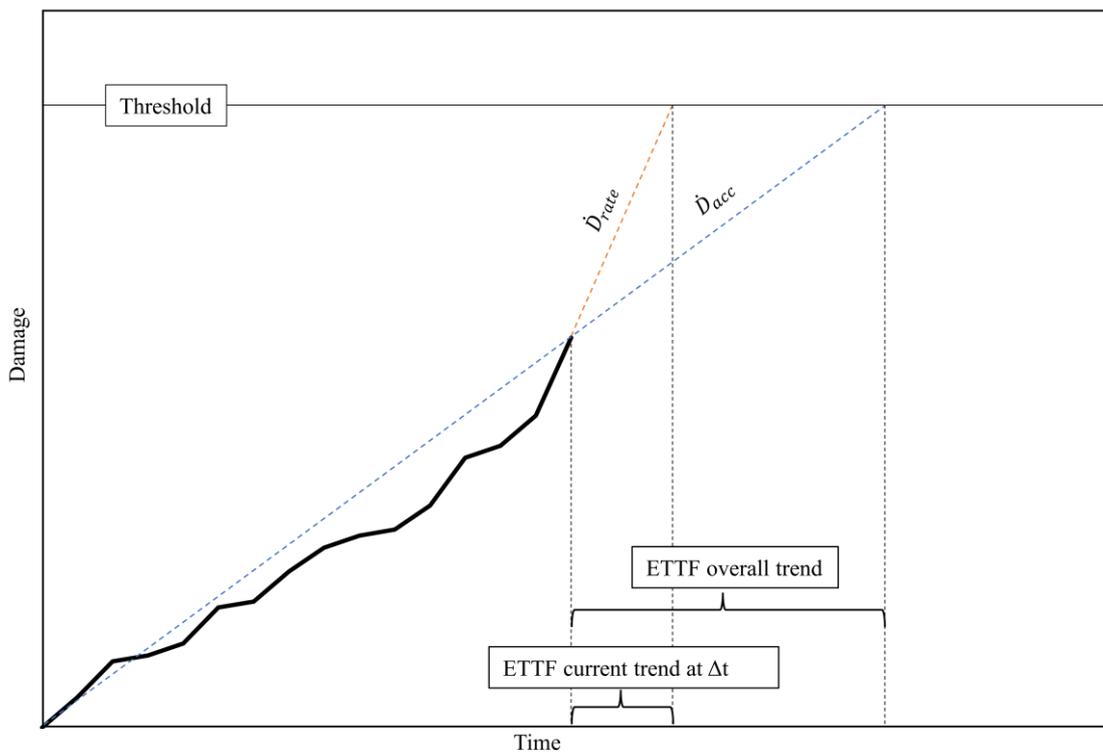


Figure 25. Current and overall trend extrapolation and ETTF estimate.

Projection for future damage behaviour requires the use of mathematical models. The prognostics projection failure models can be divided into three distinct categories and then combined for hybrid solutions. Further information for these methods are discussed by Liao & Kötting (2014) and Jakobssen (2019). Categories shown in Figure 26.

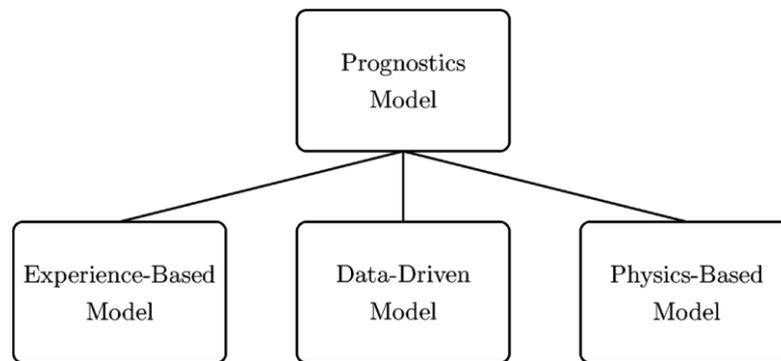


Figure 26. Prognostics models for future failure estimation (Liao & Köttig, 2014, p. 192).

Experience-based models are created by using events from history and engineering experience. This method employs rules which are generally easy to understand and logical. The collected expert knowledge can however lead into false results when it comes to complex systems. (Liao & Köttig, 2014, p. 192)

Data-driven methods use the cumulated data history to create a prediction for future behaviour. The matched behaviour can be achieved with statistics models (e.g. Hidden Markov Models – HMM), artificial intelligence (e.g. Artificial Neural Network - ANN) and reliability functions (e.g. Weibull distribution). These methods are used to create a correlation between the collected data and damage. (Liao & Köttig, 2014, pp. 192-193)

Physics-based models are created by the knowledge of the systems failure mechanisms. The physics phenomena, such as strain effects and crack growth, are used as the degradation processes to assess the failure life. The models are usually created during development and can be used for similar products by parameter modifications. (Liao & Köttig, 2014, p. 194)

5 BENEFITS AND FEEDBACK FROM SHM

Most structural health monitoring systems are implemented to achieve safety, environmental and financial gain, but it may sometimes be unclear when such benefits can be noticed. Monitoring of a structural detail does not increase the capacity; thus, the benefits rarely are immediate, depending on the level of monitoring and post-processing. This chapter discusses the benefits and feedback potential from such systems now that we have reviewed the methodology behind them by using literature and conducted studies.

5.1 Design stage

Implementing a state-of-the-art SHM-system capable of accurate real-time local fatigue calculations requires detailed structural analyses for proper sensor installation locations and setup. The conducted analyses have a direct effect in helping to understand problems in the vessel structures not noticed during the design procedure or otherwise not reachable with the design methods proposed by the design code of the vessel.

Depending on the chosen sea state modelling method for the structural analysis, more accurate EOC simulations provide a great platform to improve the design over the same fleet production or even to future new-built projects. The benefits can be seen in both, structural strength modifications and performance gains through the better understanding of ship behaviour in various sea states simulated. The long-term instrumentation provides the designers a deeper understanding of the actual ship responses when in operation.

5.2 Feedback coupling

Although detailed structural analyses can be used to find the critical details for overload and fatigue, simulation of all relevant EOC's can be very costly and time consuming. To assess the vessel structural deformation and stress response further during the operation, load/response estimation or shape sensing technologies can be used for full structure analysis without needing vast amounts of sensory outputs. (Hess, et al., 2018, pp. 409-410)

5.2.1 Load/response estimation

Direct measurements are not always possible for loads or hull responses; thus, solutions for extracting value estimations are needed for assessing the impact on the hull structure. Such methods are used to expand the direct measurements from alternate locations to the area of interest. Perisic & Tygesen (2014) used two expansion methods for dynamic responses and obtained relatively good results for the estimations. The two methods consisted of Kalman filter-based method and a Modal expansion method, both having their pros and cons shown in Table 4. (Hess, et al., 2018, pp. 409-410)

Table 4. Pros and cons for indirect load estimation methods (Perisic & Tygesen, 2014).

Property	Kalman filter-based method	Modal expansion method
Computational complexity	Low	High
Stochastic model	Yes	No
Number of estimations	Operational	All
Operational in real time	Yes	Near-real time
Structural model complexity	Low	High

5.2.2 Shape sensing

Shape sensing technology can be used alongside the real-time fatigue monitoring technology to gain next-level insightfulness. Shape sensing technology utilizes the same strain-sensors for digital structural reconstruction of the deformation by measured strain values. (Adnan, 2017, p. 4)

The shape-stress sensing methodology has been developed for multiple structural deformation methods, most notably for simplified beam method and FEM. Variations for these two main directions are in multitude with each having advantages and disadvantages over another. As vessels are often realised as large simplified beams, long base strain gauge values can be used as an input to simulate the hull response in real-time by inducing the strain values to a digital beam model. Similarly, strain rosette readings from a plate section can be digitally expressed as deformation on an Inverse Finite Element Method (iFEM)- model. These advanced inversed methods are enabling more powerful digital twins for full ship analysis (Hess, et al., 2018, p. 396).

The iFEM has been established as a methodology for possessing benefits over the more simplified methods. The iFEM as a method is also far branched. Studies on various element types and simulating of physical phenomena appear continuously as the method arouses interest in the science community. Adnan (2017, p. 20) expressed the user benefits as such:

- “The iFEM methodology does not require any loading and/or material information to reconstruct the three-dimensional displacement field of the structure.
- The iFEM formulation does not require the entire structure to be installed with strain sensors to monitor the entire structural displacements. Only few locations need to be instrumented with any type of strain sensors such as strain rosettes, strain gauges, fibre optic cables.
- The iFEM methodology is free from complex structural geometry and/or boundary conditions.
- The iFEM algorithm can provide robust, stable, and accurate displacement results even with the strain measurements have inherent errors (e.g., noise).
- The iFEM framework is sufficiently fast for real-time monitoring applications.”

These benefits are certainly great for maritime applications to accommodate the prevailing conditions ships are facing, such as vibrations introduced as noise in the strain gauge readings and the discussed methods for real-time fatigue monitoring of hull structures. Currently, SHM systems with active couplings and full-field stress analyses are used in aerospace industry, but studies such as Adnan’s (2017) show that the marine industry has a potential of employing a such concept.

5.3 Hull service and life longevity improvement

As most of the marine applications are designed assuming the worst load conditions, a great life benefit can be achieved by employing a robust system for remaining life estimation and hull service intervals. Structural health monitoring plays a big role by enabling the use of Condition-Based-Maintenance (CBM) methods instead of the more traditional time based and scheduled maintenance procedures. The use condition of vessel can change during her lifetime, so being able to schedule maintenance and inspection according to the deterioration can provide advantages to a more traditional methods. CBM is suitable for both, on- and off-

line condition monitoring systems. (Ahmad & Kamaruddin, 2012, p. 522; Hess, et al., 2018, p. 395)

Life longevity can be elongated by using the SHM for driver training against harmful operating conditions and manoeuvring actions. The SHM is used to support the decision making for the inspection and maintenance schedule based on the current use, overload, local fatigue damage rates and changes in global stiffness of the ship measured with midship strain gauges (Torkildsen, et al., 2005, p. 8). Generally, the measured and calculated vessel response and damage is used to decide the needed inspection and maintenance methods, referred usually as current-condition-evaluation-based (CCEB). The decision framework is shown in Figure 27.

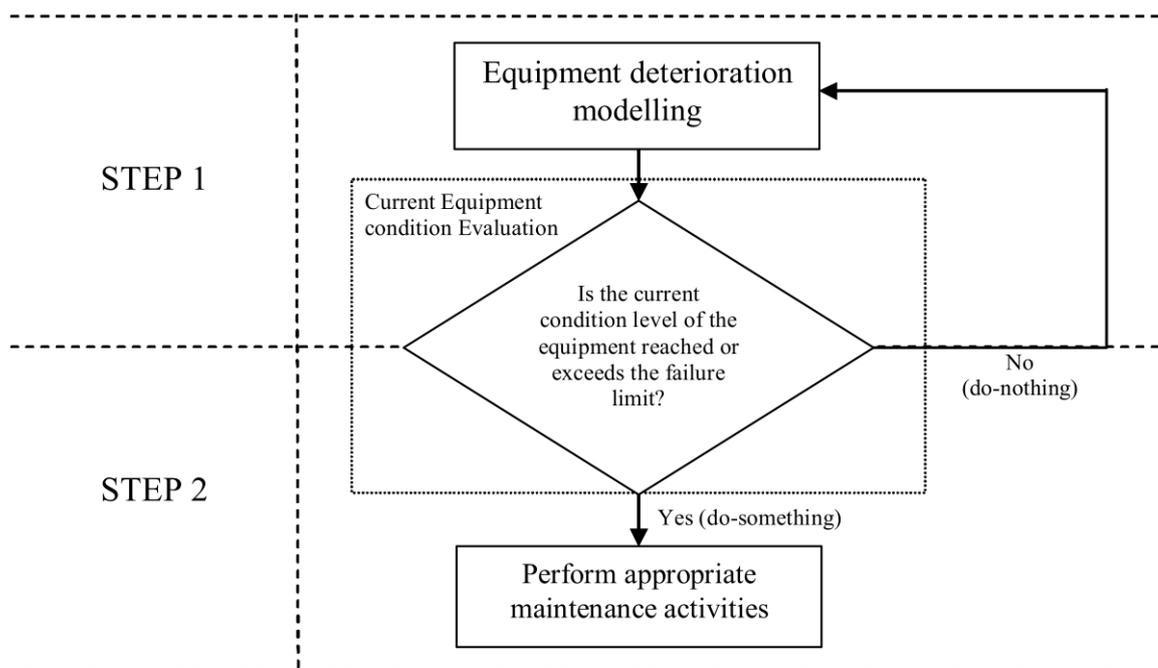


Figure 27. CCEB decision framework (Ahmad & Kamaruddin, 2012, p. 524).

The condition based decision making progress for repairs and maintenance should begin in the SHM development stage. When the critical hull structures and failure modes are recognised, hull repair methods should be estimated. Cracks in aluminium structures are harder to repair by welding, as aluminium has a high oxidation rate and low weldability (Sajed & Seyedkashi, 2020, p. 1). Welding is still possible by grinding away the oxidized layer and then completing the repair. Other methods such as carbon-fibre-reinforced-polymer (CFRP)

retrofitting to existing cracks on steel structures has been studied by Wang et al. (2015) and Hu et al. (2016). Their researches were focused on extending the fatigue life by employing CFRP-plating on top of crack initiation location. This method has been reviewed for aluminium structures as well by Pramanik et al. (2017).

6 THE METHODOLOGY CONCEPT

The generated methodology for real-time hull fatigue monitoring consists of three main branches; Definition for SHM, Analysis methods and constructing the actual SHM-system for monitoring the hull condition. The methodology is presented on simple flowchart consisting of different phases for building the system.

Installing a hull structural health monitoring system for real-time fatigue calculation consists of multiple steps. At each step it is necessary to consider whether the chosen methods produce results that meet the initial requirements for the monitoring. The initial requirements affects the scope of data collection and the analysis methods. The produced steps offers few ways to conduct real-time on-demand hull structural health monitoring.

The path for the SHM-system creation begins by assessing the vessel type, regulations and the requirements. The operational demands vary greatly across the different vessel types, some ships experience heavy static loads by cargo and some are designed to sail year around, even in icy conditions. These different demands for operation affect the data collection and the extent of the structural analyses.

Whether the vessel is a new-build or already in use, regulations concerning the hull monitoring system must be considered. Although such advanced systems are not generally required up-to-this-date, the rules determine for example how the data should be managed and at what sampling rate it should be recorded at. Further elaboration for these rules are in Appendix 1.

The vessel design evaluation is important for assessing the structural complexity of the ship. The structural complexity has a direct effect on the needed structural analyses for critical details. The evaluation also includes the materials used and the overall design/scantling process of the vessel. Already performed structural analyses can also prove useful in designing the hull SHM and real-time fatigue calculations.

Preliminary evaluation for the scope of data collection are based on the information requirements set for the system to produce. Detailed CBM and ETTF require a substantial use of sensory outputs for fatigue critical details if on-demand results are required. Usage of reference data is recommended for assessing the accurate EOC's in which the most damage occurs. The relation between damage and EOC's can be used for crew training along with warning states for high sea and stress states.

The operational loads and hull responses are needed for structural analyses. The loads vary from simple static pressure to stochastic wave events leading to slamming and vibrations. The hull responses are evaluated based on their criticality for structural health and most common/critical responses should be monitored. The structural failure possibilities are noted and used for preliminary definition of repairs and CBM.

Chosen analysis methods for the operational loads are directly related to the accuracy of the hull monitoring system. The most advanced methods utilise the hydroelastic vessel behaviour in waves and nonlinearity of local strain effects. The chosen load modelling technique also has a direct effect on which structural analysis method can be used for the hull responses. As for the SHM-system configuration, regulations should be studied for reference.

The structural analysis is used for recognising critical hull structures prone for failure, either static or dynamic. Depending on the chosen structural analysis methods, global and local strength can be assessed. The found critical structures are then studied for possible failure mechanisms. Failure mechanisms range from instability to cyclic fracture by fatigue.

As the critical structures are found, instrumentation is needed for real-time structural health monitoring. The data collection can be short- or long-term, both having their own advantages. Short-term monitoring is used for profiling the responses and developing a damage model running on reference data or predicted voyages. Long-term measurement is used through vessel life and is better for highly stochastic load scenarios, where hull responses vary greatly. The choice comes down to the preliminary requirements for the monitoring. Since direct instrumented measurements are not always possible, response expansion methods could be needed.

Handling the data can be configured to run onboard or onshore with modern data loggers. The on-line calculation of fatigue damage requires adequate processing power; thus, a capable compute unit is needed. Data sensitivity should be considered too as wireless transmissions are vulnerable to data breaches. Local computation and storage offer a more secure solution.

The term “real-time monitoring” of SHM-systems can be often conceptualised differently. Here, the real-time refers to direct measurement and calculation of responses and damage rates as they occur. For responses, this requires the use of limit states and warning systems for high damage and stresses. The load cycles must then be calculated with an on-line method capable of efficient stress/strain loop retrieval. The damage calculation must be completed as the cycle is found and then it can be used for on-demand display or prognostics.

Prognostics is known as a discipline for estimating the remaining useful life of a system. The mechanical prognostics for a vessel hull can be configured with extrapolation or projection for the ETTF. The estimation can be directly used for creating CBM-schedules to prevent sudden failure and elongate the life of the vessel. The full methodology for generating hull SHM-systems for real-time fatigue monitoring is shown in Figure 28.

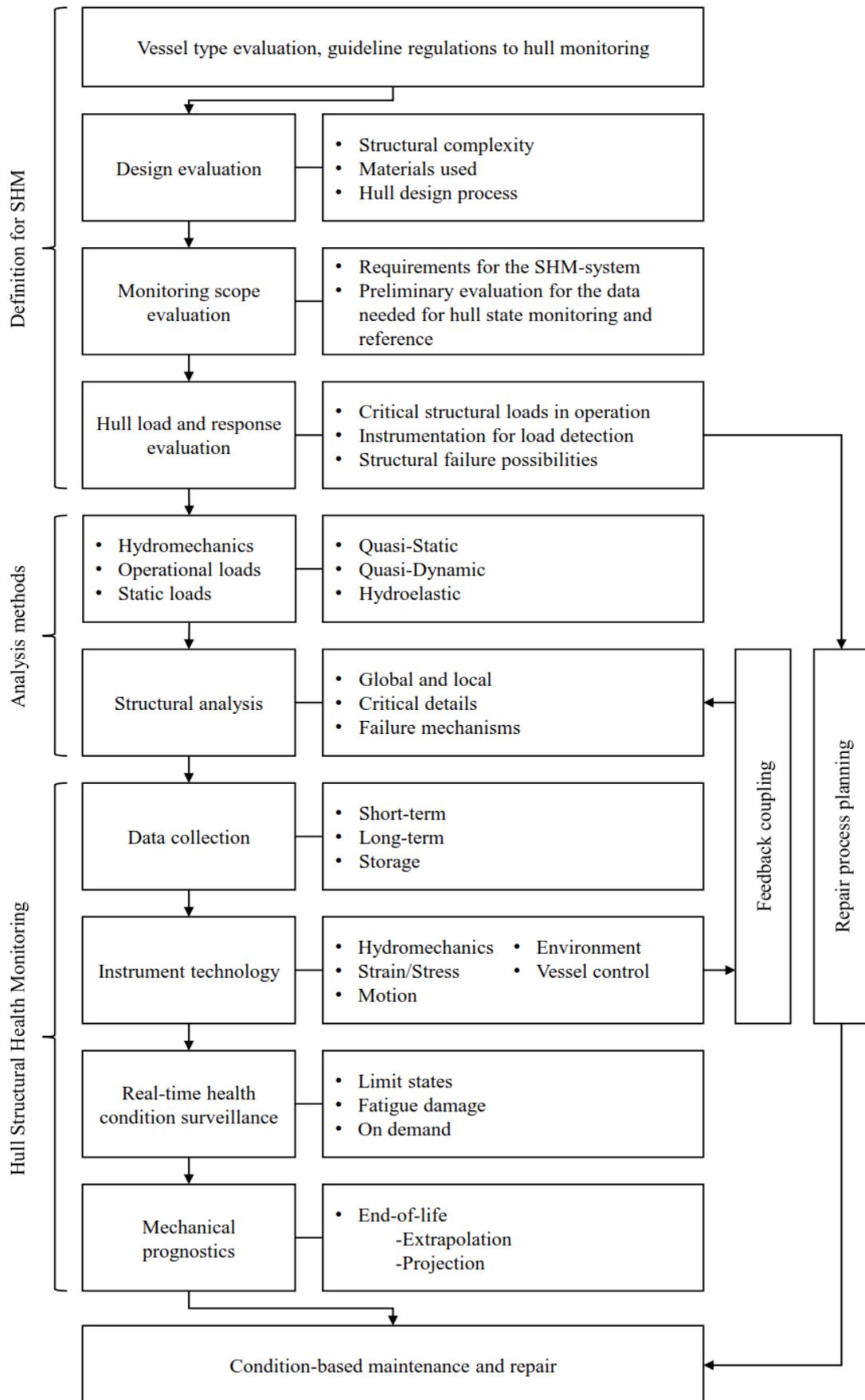


Figure 28. The methodology for creating a real-time hull SHM-system.

7 CASE STUDY

As discussed in the introduction, the case vessel used in this study is built upon requirement for relatively fast operational speeds, ice-driving capabilities and from aluminium for light-weight construction. Although the hull of this vessels has a traditional framing-system and longitudinal stiffener layout, the structural solutions are certainly non-uniform and complex. For reference, the vessels particulars are shown in Table 5 similarly to the vessel's design code symbols.

Table 5. Case vessel particulars.

Object	Quantity	Unit	Symbol
Hull length	20,0	m	L_H
Hull breadth	6,0	m	B_H
Displacement	50,0	t.	Δ
Max. speed	20,0+	kn	V_{MAX}

This vessel is used as a short example to reinforce the idea of the methodology concept. The provided examples for each step are a result of collaboration with the vessel owner party and a separate study for the hydromechanics by CFD. The study of the FSI connection between CFD and FEA is ongoing and set to improve the structural calculation results for dynamic load cases. For now, the loads are considered only as static neglecting the vibration effects of whipping and springing.

7.1 The requirements for hull monitoring

As noted earlier, to define the SHM-system for a vessel, requirements must be clear what is needed from the system and how much data is needed to reach the set goals. For this vessel, the requirements are as follows:

- On-demand hull structural analysis:
 - Current damage rate
 - Indicate too high usage by colour coded warning signals (green, yellow, red)
 - Warn driver of potential permanent deformation
- End-of-life analysis:
 - Producing timelines for damage outputs
 - Current and past trends for damage rate developments
 - Forecasted time to end-of-life
- Improved maintenance:
 - Using the data to schedule the hull inspection and repairs more efficiently
- Data management
 - No wireless transmission of locational data, security concerns

7.2 Regulations

The design code for this vessel does not contain any information or requirements for a hull monitoring system. Only notations for the intended systems concerns the electrical safety for the on-board measuring devices and compute-units. The system must be calculated for its power drain to ensure that overloading of the batteries and power delivery systems does not happen. List of demands for electrical safety in the VTT Workboat guide. (VTT Expert Services Oy, 2016, p. 184)

7.3 Design evaluation

The vessel is structurally very heterogeneous and complex. The main framework consists of bulkheads in different sizes due to the shape of the outer hull. Deck stiffeners are extruded aluminium profiles with snipped ends, however, usually placed through the bulkheads to allow deck flexing. As the vessel is intended for all-year-around use, it is intended to have a de-icing system. The de-icing system needs air convection; thus, the hull features multiple holes in the bulkheads for the heat to pass through.

This aluminium vessel is designed mainly from 5000- and 6000-series aluminium for its main hull structures, providing good protection against corrosion and sufficient strength to weight rating. The vessel scantlings are based on the required efficient section moduli against the significant wave for vessel class A. The ice-driving capabilities are achieved by using an ice-belt structure against the ice pressure defined by the regulations. The ice contact zone is defined by the regulations as well, requiring the use of reinforced structures close to the waterline.

7.4 Preliminary instrumentation needs

The requirements for the SHM-system state that the user wants constant information about the prevailing damage rates and estimation for the remaining useful life of the vessel. As the vessel faces varying EOC's, long-term damage monitoring and limit state warning systems would be beneficial. Collection of reference data, such as vessel motions, positions and sea states would provide better understanding against the most crucial events against structural integrity. The scope for such systems are defined by the structural analysis, whether the monitoring should focus on global and/or local phenomena.

7.5 Load and response analyses

The operational demands and intended uses for the vessel have a very stochastic nature; thus, the creation of load cases for normal operation is quite challenging. However, the forward speed effects are important to consider as most of the ships loading is caused by wave contact and not by distributed mass and bending moments from cargo. The vessel does not carry cargo other than the crew and occasional operational equipment. Infrequent ice-driving is not considered to cause significant fatigue damage but the stress limit states can be monitored against permanent damage.

The case vessel is relatively fast and small, most of the loading is probable to be caused by irregular sea states and sudden wave slamming events leading to larger amplitude vibration of whipping and springing. CFD enables the simulation of these effects through a FEA coupling. With CFD and FEA coupling, the simulation of vessel manoeuvring and planing condition is also possible.

Aluminium has a higher crack propagation rate than common shipbuilding steel, local fatigue cracking is probably the most predominant failure mode for these hull structures. These structural hot spots are best recognised by using direct calculation methods, such as FEM. Other failures, such as local buckling and local plastic deformation are possible in case of overload scenarios by slamming.

At this stage, the repair procedures for cracks and aforementioned possible failure modes are pre-considered. The ready-built vessel has tight spaces restricting the possibilities for repair methods requiring bulky machinery, the aforementioned CFRP-method by installing reinforcements on the crack growth locations can prove to be useful.

7.6 Design model

The vessel is designed by using CADMATIC Hull, a design software suited for hull structure generation with high levels of parametrisation, flexibility and rule-based engineering tools. The model can be exported as a step-file containing relevant geometrical information to a chosen third party-software, such as FE-tools. (CADMATIC, 2020)

In this case, FE-method is found most suitable for analysis due to irregular and complex structures in the vessels hull. The fine detail geometry is exported as a step-file and fed into the chosen FE-tool for further modifications and global analysis.

7.7 Global calculation model

The calculation model needs optimisation for efficient calculation and performance. Model reduction is completed by using SpaceClaim, part of the Ansys product family. SpaceClaim is a Computer Aided Design (CAD)-modelling software and features powerful geometry manipulation tools for FEA, enabling faster geometry simplification and preparation for meshing and analysis. (SpaceClaim, 2020)

As the global calculation model is used for finding the critical details for further analysis, the geometry can't be simplified too much. Some smaller fillets, openings, stiffeners are removed and/or replaced with simplifications. The simplified structures should still transfer loads and distribute stresses as the original design would. Some simplifications are shown in Figure 29. (Siipola, 2018)

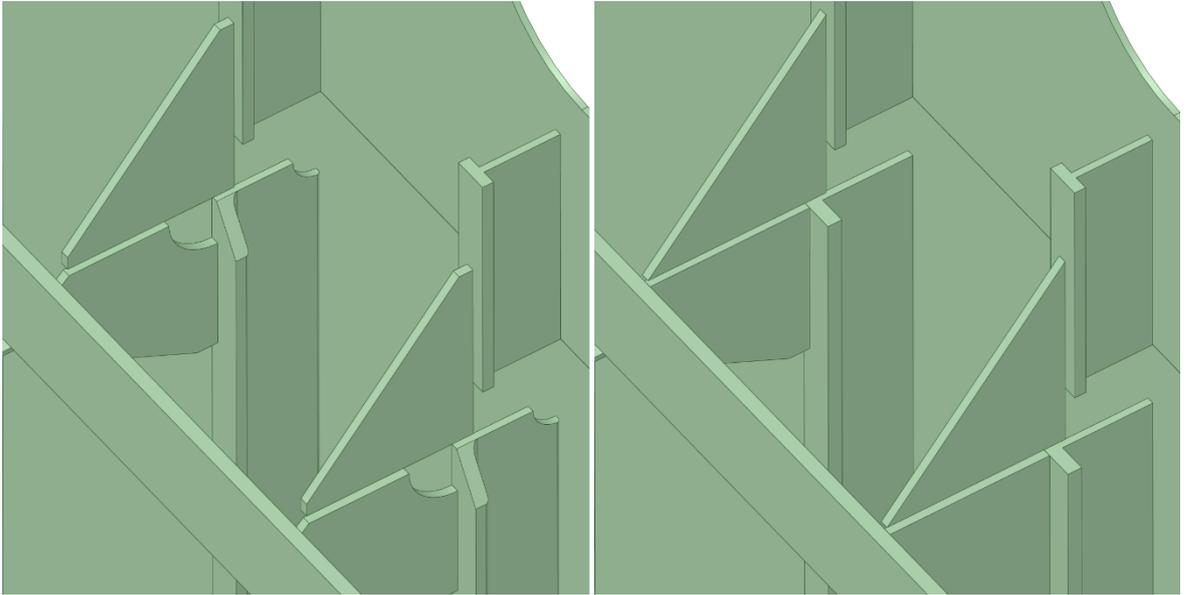


Figure 29. Simplified geometry in SpaceClaim.

The model reduction and simplification also help with the midsurfacing of the structures. Midsurfacing is required for the use of 2-D shell elements in FE-analysis. The midsurfacing creates a surface between two planars on the solid selected. The selection of coincident surfaces was completed manually and by thickness range. Midsurfaced example in Figure 30.

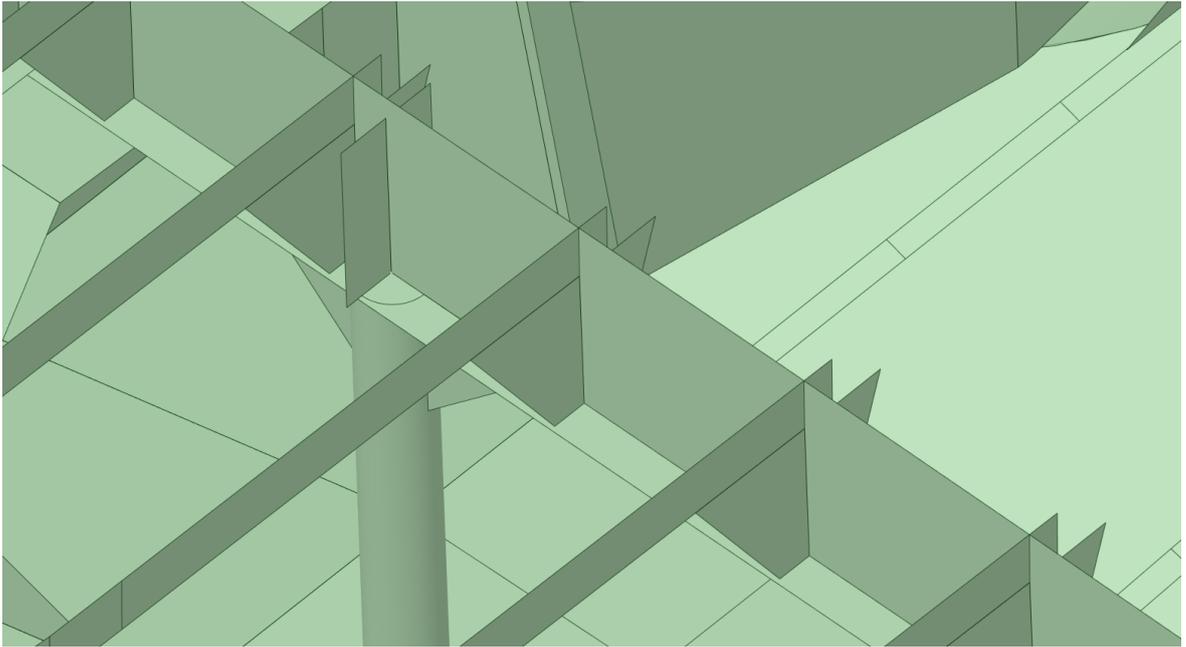


Figure 30. Midsurfaced geometry in SpaceClaim.

As the original solid geometry structures are connected and then midsurfaced, the connection between the continuous structures are lost. The created surfaces must be extended and trimmed to share the topology of the original model. This step can be time consuming and prone to cause geometry errors. SpaceClaim Midsurface-tool has automated extension and trimming setup, but in the case model used here, they didn't work as intended causing geometry errors and distortions. All geometry modifications were completed manually. SpaceClaim gives midsurfaced bodies the original thickness of the geometry; thus, saving time. As the needed connections are established and the midsurface model has similar strength characteristics to the original, the meshing procedure can begin.

As the vessel still features smaller tertiary structures transmitting forces, the mesh quality and size is chosen to accommodate these geometries. Defeaturing of such geometries could lead into false results and some fatigue critical details could go unnoticed. As ship structures are being constructed mostly out of plates and beams, a combination of 2-D shell and 1-D beam elements was chosen. 1-D and 2-D elements are great for their lesser computational effort and relative accuracy even in small details. However, when assessing further details in the hull structures, it should be noted that 2-D elements cannot represent perpendicular

stresses due to being planar without thickness. 3-D elements should be chosen for through-thickness stress analysis if needed.

Mesh size of 50mm provides accuracy for even the smaller details. This results in 300k elements for the whole vessel hull in Ansys Mechanical. The calculation model does not feature the vessels heavy equipment; thus, the model lacks in weight. This deficiency of mass must be solved by using additional distributed mass in Mechanical to reach the intended displacement of the vessel. Heavier equipment, such as engines and deck cranes are also modelled with distributed mass components on their particular support structures. The cabin is only modelled and meshed partly as the interest of critical detail search is limited to the hull structure of the ship. Typical mesh size in Figure 31.

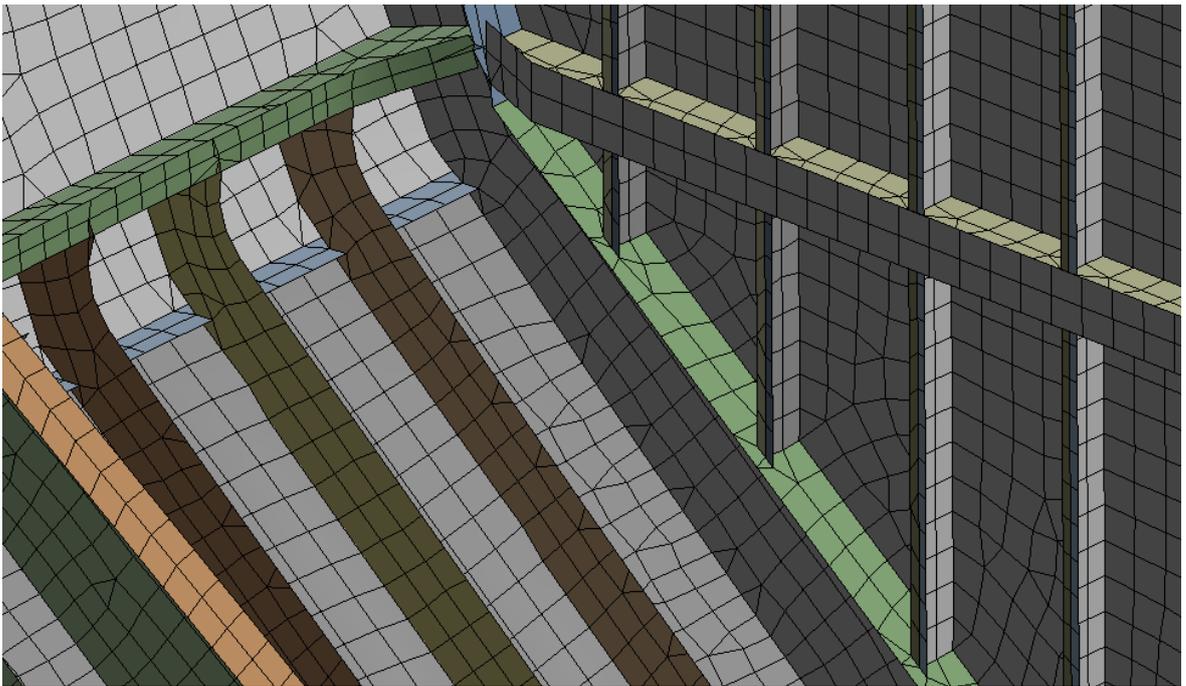


Figure 31. Typical mesh quality.

The cabin is also fitted with Sylodyn dampening elements to decrease the effects of potential vibrations. These dampeners are fitted along the circumference of the cabin and their values for stiffness and dampening are calculated according to the data provided by the manufacturer. The dampeners are modelled in Mechanical with bushing joints, allowing for Multipoint Connections (MPC) and greater stability. The MPC bushing joints also allow the

usage of actual damping values, increasing the accuracy of the results. Bushings are defined separately for each dampener.

As the model is created by midsurfacing an existing solid CAD-model, topology errors are possible. As the midsurfacing creates a planar surface between the top and bottom of a plate section, perpendicular intersections are left open requiring for extension. These sections can be extended manually by manipulating the geometry or attempting to use node merging. Detached mesh and structures can be found by conducting a modal analysis. The analysis can be completed with a simple fixed nodal constraint in the aft of the vessel. The resulting modal shapes clearly highlight the loose and/or detached structures for topology repairs.

7.8 Structural analysis

The highest slamming force is a sum of multiple parameters, including the relation between bow and the wave in terms of speed and the angle of attack, as explained in Chapter 2.3.3. The conditions for highest slamming forces are quite complex; thus, experimental simulations for the worst case are needed for this vessel. For the detail wave simulations, Simcenter STAR-CCM+ is chosen for advanced CFD-calculations.

7.8.1 Wave simulation

STAR-CCM+ features built-in wave simulation tools. The wanted wave length, period and height are used as inputs for the simulation. The software is also capable of producing a forward speed for the vessel, enabling performance analyses and statistics. The slamming conditions are defined by experiments for highest pressure delta and selected for structural analysis. For now, only slamming conditions are used for testing the fluid structure interaction between STAR-CCM+ and Ansys Mechanical. The CFD simulations are completed in a separate study.

As slamming is a sum of multiple factors, experimental investigation is required for the vessel of interest to find the worst combination of EOC's and forward speeds. As CFD-calculations are heavy on performance and require a lot of time, using other methods for the ship behaviour in waves should be considered. In this case, Ansys Aqwa is used for hydrodynamic diffraction and response analysis.

The hydrodynamic simulation was used for finding a ship response most likely contributing to the slamming. The ship forward speed was adjusted using the wave encounter period and wave height matched the common occurrence of the vessels operational area. The attack angle between the bow and the wave was minimized for maximum impact force. The best slamming case found was further studied in CFD by implementing a turbulent wave simulation model for accuracy.

7.8.2 Fluid Structure Interaction

FSI will be employed by one-way-method, transferring the pressure values from the CFD to FEA by file-based-coupling. The most significant wave load scenarios are simulated in STAR and the resulting pressures mapped to the global calculation model built in Ansys. The mapped pressures are imported back to the FEM-software for global and local structural analysis.

As the simulated load scenarios are dynamic, multiple load steps are processed. The loads are transferred into Ansys by using the built-in external data component, in which the pressures are defined for global coordinate locations. The pressures are imported and mapped on the ship hull individually. As the simulation was ran against few wave periods, the results were analysed manually and the maximum force impact modes were looked for. Two pressure interactions were chosen to test the FSI-method. The first pressure plot featured a maximum pressure on the ice-belt area, contributing to higher stress responses in the bow flare. The second pressure plot chosen featured a slamming of the bow thruster tunnels, showing higher stresses on the structures closer to the ship sides.

7.8.3 Structural FEA

The two chosen pressure plots were analysed by conducting a global static response study; thus, no hydroelastic response between the structure and the fluid is considered. The structural response is achieved with inertia relief boundary conditions. The inertia forces caused by the implemented pressure field are counterbalanced with accelerations. With the inertia relief method, false boundary results are avoided (Rosen, et al., 2020). In the inertia relief method only rigid body movements should be eliminated. As the analysis is 3-D, six degrees of freedom are restrained.

The global calculation model is inspected for stress hot-spots. The analyses for these two load cases did not show stress behaviour over or close to the materials yield limits. At this stage, ruling out the possibilities for static failures, such as buckling or large plastic deformation. Distinctive stress hot-spots leading to fatigue failure have been found and must be studied further.

7.8.4 Sub-model evaluation for monitoring

For this example, structural discontinuities with high stress concentrations are studied. As discussed in chapter 3.3.4, there are three distinct surface displacement modes for crack growth. These modes are mostly caused by high tension and shear stresses in structural discontinuities. The selected pressure load cases generated three distinct locations for stress concentrations all in close proximity of welds. These locations require further analysis by using local calculation models by employing cut boundary displacements from the global model. The plots shown are principle stresses from these selected sub-models.

The sub-models are used for evaluating the monitoring and fatigue calculation methods. The mesh sizing generally follows the recommendations by DNV-GL: Fatigue assessment of ship structures: Appendix E. The sub-models are created by using solid mesh elements for complex stress behaviour and through thickness effects. The general mesh size for the sub-models are 15x15x15mm and in close proximity of the hot spot detail, the element size is reduced to the lowest plate thickness of the attachment.

The first sub-model is retrieved from a WT-bulkhead of the ship. The hot-spot stress is located on the connection of two stiffeners close to the side of the vessel. As the stress response clearly shows that the concentration is located on the connection itself, all relevant welds are modelled for increased accuracy. Plot of the principal stress response for this first sub-model is shown in Figure 32.

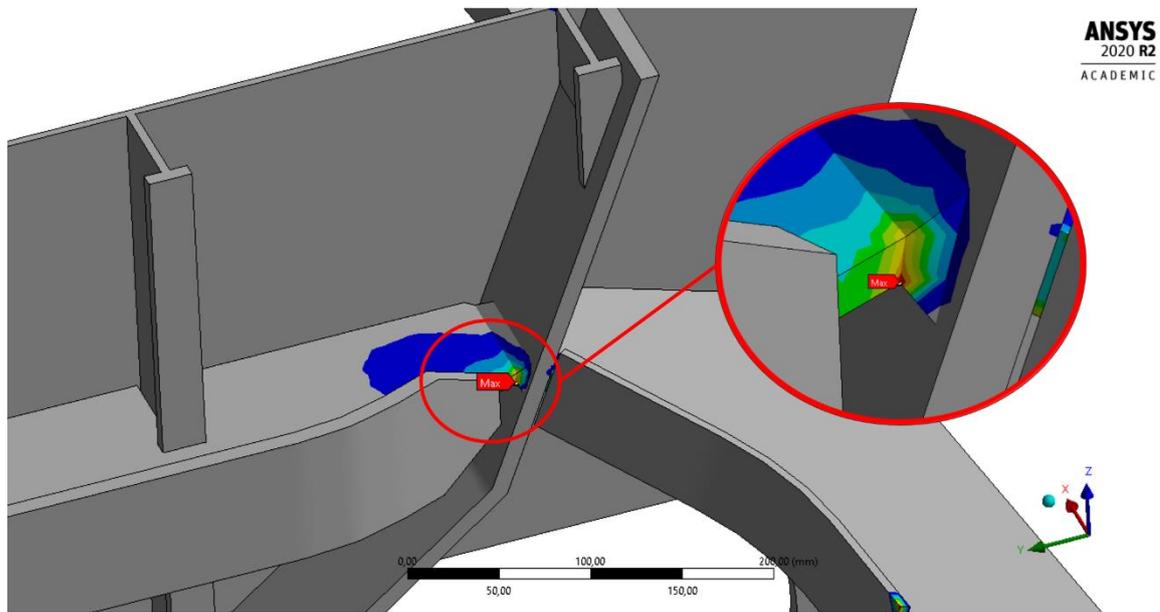


Figure 32. Stress hot-spot of stiffener connection in the first sub-model.

The stress concentration is located on the plate edge and in a tight location for strain gauge measurements. The plate edge is under tension; thus, mode I surface displacement is the most likely scenario for crack growth. For fatigue damage monitoring, strain gauge measurements of structural hot-spot stresses are possible, but requires alteration of the horizontal stiffener. The flange must be cut to make room for the strain gauges to be fitted. The stress measurement method for type B hot-spot should be used. Increased accuracy can be achieved by using ENS- or 4R-method for fatigue damage calculations, but measuring the needed stress components from this detail can be difficult due to tight spaces and the complex geometry.

The second sub-model consists of a longitudinal deck stringer directly under the cabin structure. The stress concentration is on the flange connection butt joint. The joint is under tension from the angular misalignment and prone to opening type (mode I) surface displacement. Here, the hot-spot stresses are measured as type A. Nominal stresses are easier to measure as there is room for instrumentation away from structural discontinuities, enabling the use of more advanced fatigue calculation methods. Stress concentration shown in Figure 33.

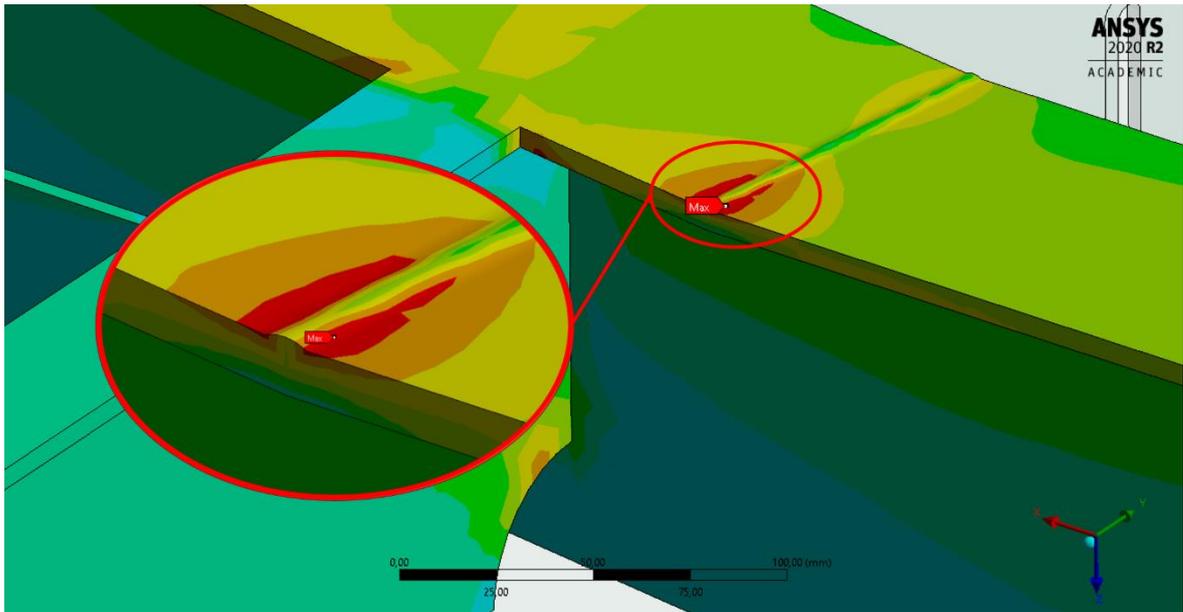


Figure 33. Stress concentration on longitudinal stringer flange butt joint.

The third sub-model is a connection between a transverse stiffener and the ice-stringer. The stress concentration is located on the cut-out plate section and can be measured as type B hot-spot. As the surface is rounded, it is generally harder to extrapolate the measured stress results to the weld toe. Measurement of nominal stresses for advanced fatigue calculation methods is difficult due to complex geometry. The structural detail is under tension, potentially leading into mode I crack opening. Third sub-model shown in Figure 34.

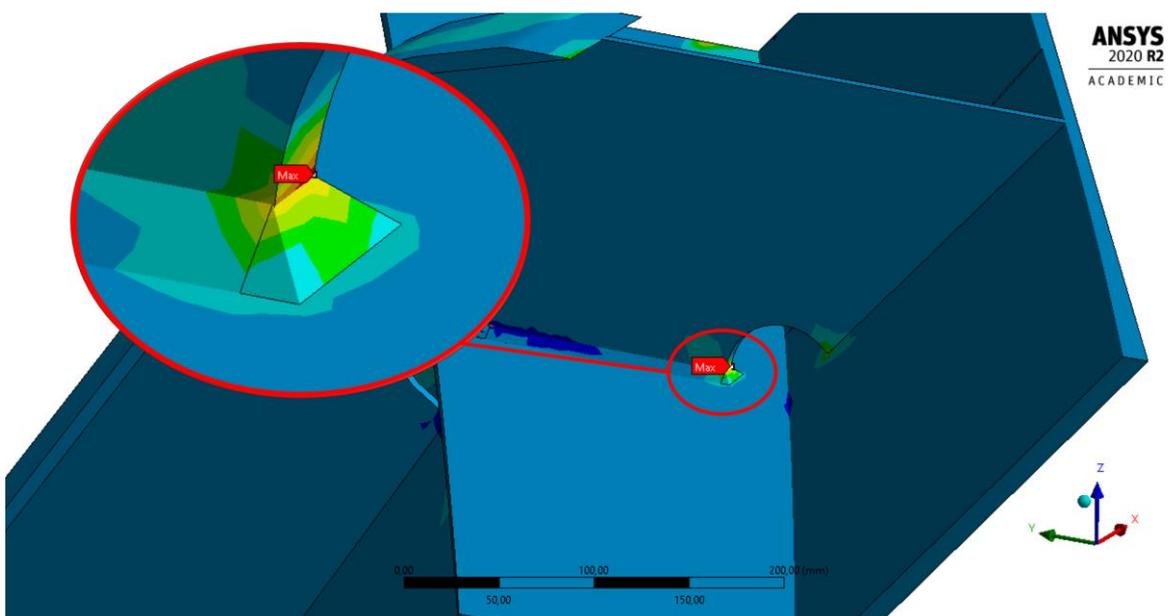


Figure 34. Stress hot-spot on ice-stringer connection.

The found stress hot-spots are generally applicable for stress/cycle monitoring, but should be rechecked for their relevance to the overall hull fatigue life by finding the stress ranges by continued analysis over the whole slamming wave event. Structural detail with high stress value per singular load case only tells us the static situation.

7.9 Data collection evaluation

The requirements for constant on-demand damage outputs and warning systems for high usage behaviour indicates the need for a long-term and permanent solution for data collection. Monitoring the found stress hot-spots for cyclic behaviour and potential permanent damage from high static loads is needed. Storage for long-term data can be achieved with local on-board equipment. After a set period of time, offloading this data to onshore storage would be beneficial. Local storage is a better choice if sensitive locational data is handled.

7.10 Instrument technology

Stress cycles are collected with strain gauges. As local fatigue damage seems most likely, SBSG's in the structural details are sufficient for this job. During the measurement of hull stress responses, other data is handled and collected during operation, leading to potential electromagnetic interference, e.g. noise, in the measured responses. Noise can be eliminated by using fibre optic strain gauges.

Collection of reference data, such as wave forms and periods can help understand which situations are most critical for the health of the hull. Additional instruments for accurate EOC estimation are needed, but usage of existing locational data and weather information from third party providers is also sufficient for evaluation. Zero pressure warning systems are not needed since the vessel is designed for semi-planing condition, bow emerging from water level is regular.

7.11 Real-time health condition surveillance

Since the instrumentation is based on local responses, the damage and health condition monitoring is based on the readings acquired from the SBSG's. The on-demand damage can be shown from the structural detail experiencing the highest current damage rate and/or stress.

Warning system can be set for yield limit exceedance to alert the driver for causing permanent damage to the hull.

The colour coded warning signals for damage rates should be adjusted based on the stress value related to the damage output. Damage caused by stresses over the yield limit are expressed as red and so forth. Adjustment of the colour coded damage rates should be done after acquiring more knowledge on how the stress and damage fluctuations occur.

The stress cycle counting must be able to record even the smallest oscillation during the operation. As slamming is assumed to be the most crucial load case for the fatigue life, whipping and springing can only be measured with high sampling rates. Noise reduction is also a key to eliminate any false cycles from the results. Equipment recording tests and calibration is required.

7.12 Mechanical prognostics

For the on-demand of the end-of-life condition analysis, a simple extrapolation of the current damage rate with the previous information is the most efficient method for real-time evaluation. Extrapolation provides enough accuracy for onboard management decisions to ship guidance and operation.

Separate prediction based models can be used alongside the real-time evaluation. These models can be built based on the knowledge learned during the ship operation. If enough data is collected, statistics based prediction model would be most beneficial. E.g. the statistical model can be based off the planned operational schedule and past statistics for damage behaviour in similar conditions.

7.13 Maintenance and repair

In the current state, no hull maintenance or checking periods are in use. With the collected knowledge of damage accumulation, setting up a condition based maintenance, or at least an inspection period is easier. The inspection schedules can be planned at set damage intervals or when high stress events occur during normal use. As the critical structural details are already known, repairs for specific structures can be planned beforehand when scenarios

with limit state exceedance happen. Constructing a decision framework for such inspection/maintenance periods as shown in Chapter 5.3 becomes easier when the vessel behaviour is better known through long-term monitoring.

8 DISCUSSION & CONCLUSIONS

In this study, a concept methodology for real-time hull fatigue monitoring for aluminium vessels was created and briefly affirmed by using a case study of an ongoing design project. The foundation for the methodology was supported by previously conducted studies and various ship design codes. Relevance to terms such as structural health monitoring and hull structural monitoring was quickly discovered.

The methodology in this study emphasizes the real-time aspect of structural health monitoring and fatigue calculation. The sub-methods introduced are previous findings and techniques used in structural health monitoring concepts. The methodology provides a simple approach for the creation of a SHM-system capable of real-time fatigue monitoring and end-of-life evaluation. The focus of such system should always support the initial requirements for operation and the regulations for the vessel. The final decision for each sub-method is down to the definition and particular needs for such system. After development of such methodology concept in this study, following conclusions can be made:

- Building the SHM-system is greatly affected by the set initial requirements and regulations concerning the instrumentation usage and the available analysis methods, e.g. hydromechanic responses and methods for fatigue calculations.
- Constructing a real-time fatigue monitoring system requires the collection of other reference data to unlock the full potential of such system. Damage outputs combined to further information, such as speed, heading and wave form provides deeper insight for the operator on which actions are harmful for the hull integrity. The entirety of this insight is known as hull structural health monitoring.
- The topic of structural health monitoring is broad and particularly divided between actual and simulated responses. Real-time calculation discussed in this study focused on the vessel responses directly measured from the actual vessel and available for the user in a short span of time.

The methodology overall focuses on the real-time aspect of continuous data set collection and on the use of real-world responses of the hull structures. The provided options are those of regulatory parties, such as standards and design codes, and previous studies on the subject. When a previous study and its findings are discussed, clear remarks are given. The information used in this study is up-to-date and from reputable sources.

The subject of structural health monitoring for ships in the case of real-time fatigue monitoring is a broad topic and requires more research. In addition to this concept methodology, further studies should focus on creating the individual methods for different ship types, e.g. bulk carriers, cruise ships etc. based on the concept provided here. This methodology is generally also applicable for steel ships, providing that the design procedures are similar.

Further studies are needed also for the individual analysis methods discussed by this study. The creation and testing of a robust cycle-counting method for hull responses from high stresses to smaller effects such as whipping and springing by slamming is needed. Although, a cycle-counting method is presented, its uses in highly oscillating loads is not verified. For expansion of this method, a reliability program plan should be constructed alongside it to further understand the impact of various failures.

The natural continuum for the case study of this research is the additional development of the FSI method for state-of-the-art wave response simulations. The automation of such process enables faster recognition of critical hull details and possibly a hydroelastic simulation capable of whipping and springing responses.

For the case study briefly analysed here, further study into the device fitting and actual real-time response calculations are needed. The information of the capability for running multiple fatigue calculations aboard this vessel is important for assessing the need of instrumenting every structural hot-spot found. The further research for this case example could also study the possibility of using response expansion methods.

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Tabular specifications for hull monitoring systems by class societies. (Hess, et al., 2018, p. 408)

Year	ABS 2015	ABS(ice) 2011	BV 2017	CCS 2015	DNVGL 2017	KR 2017	LR 2012	NK 2017
Notation	HM1 (motion) HM2 (stress) HM3 (Voy. Data)	ILM	MON-HULL	HMS	HMON	HMS	SEA(HSS) SEA(ICE)	HMS
Strain Range	x	x	±2000µ	x	±2000µ	x	x	x
Acc range	x	x	±2G	±2G	±2G	±1G	±2G	±2G
Angle range	x	x	x	-90°~+90°(roll) -45°~+45°(pitch) -180°~+180°(yaw)	-90°~+90°(roll) -45°~+45°(pitch) -180°~+180°(yaw)	x	-30°~+30°(roll) -10°~+10°(pitch)	
Frequency Range (Strain/Acc)	0-5Hz/0-5Hz	0-150Hz	0-1Hz/ 0.2Hz-1Hz	0.01-3Hz(motion) 5-100Hz(slammng) 30-1200Hz(sloshng)	0.01-5Hz(motion) 5-100Hz(slammng) 30-1000Hz(sloshng)	0-5Hz/ 0-5Hz	0-5Hz/ 0-5Hz	0-5Hz/ 0.5Hz (fw.0~100Hz)
Sampling Rate	3 times the maximum F.R.	More than 150Hz	20 times the low-pass filtering freq.	20Hz(motion) 500Hz(slammng) 3000Hz(sloshng)	20Hz(motion) 300Hz(slammng) 2000Hz(sloshng)	3 times max F.R.	4 times max F.R.	x
Accuracy St./Acc/ang. Setting/ Calibration	5µ/±0.01G in a known LC/ annually	1µ/x in a known LC/ annually	20µ/x in a known LC/-	x/0.01G/0.5° in a known LC/-	5µ/±0.01G/0.5° in a known LC/ annually	20µ/1% in a known LC/ annually	5µ/0.02G in a known LC/ annually	10µ/0.01G in a known LC/-
UPS	4h	30 min	30 min	10 min	10 min	10min	x	x
VDR	IMO Res.A.861(20)	x	IEC61162	IEC61162	IMO Res.A.861(20) IEC61162	x	IEC61162	x