

Fault Tolerant Position-mooring Control for Offshore Vessels

Mogens Blanke^{a,*}, Dong T. Nguyen^b

^a*AMOS Centre of Excellence, Institute for Technical Cybernetics, Norwegian University of Science and Technology, NO 7491, Trondheim, Norway, and
Department of Electrical Engineering, Technical University of Denmark, DK 2800, Kongens Lyngby, Denmark*

^b*CeSOS Centre of Excellence, Department of Marine Technology, Norwegian University of Science and Technology, NO 7491, Trondheim, Norway, now
DNV-GL, Vestre Rosten 77, Tiller, Norway.*

Abstract

Fault-tolerance is crucial to maintain safety in offshore operations. The objective of this paper is to show how systematic analysis and design of fault-tolerance is conducted for a complex automation system, exemplified by thruster assisted Position-mooring. Using redundancy as required by classification societies' class notations for offshore position controlled vessels, the paper shows how violations of normal behaviour of main components can be detected and isolated. Using a functional service philosophy, diagnosis procedures are auto-generated based on provable correct graph analysis methods. Functional faults that are only detectable, are rendered isolable through an active isolation approach. Once functional faults are isolated, they are handled by fault accommodation techniques to meet overall control objectives specified by class requirements. The paper illustrates the generic methodology by a system to handle faults in mooring lines, sensors or thrusters. Simulations and model basin experiments are carried out to validate the concept for scenarios with single or multiple faults. The results demonstrate that enhanced availability and safety are obtainable with this design approach. While methods are introduced at a tutorial level, the paper is original by providing a total Position-mooring system design that ensures resilience to any single fault and to selected multiple faults.

Keywords: Safety, fault-tolerant control, FPSO, Position-mooring, active fault isolation, fault diagnosis

*Corresponding author

Email addresses: mb@elektro.dtu.dk (Mogens Blanke), dong.nguyen@dnvgl.com (Dong T. Nguyen)

1. Introduction

Safety and cost effectiveness are primary concerns for positioning control systems for marine vessels [Gray and Macdonald \(1982\)](#); [Chen et al. \(2009\)](#). Frequent shutdowns of the whole control system when simple faults occur are costly and high risk events for humans, for equipment and for environment.

The present approach to fault handling in the marine industry is to call for human intervention when faults occur. The study of [Chen and Moan \(2004\)](#) showed that when faults occur in a positioning control system performing tandem operations, the time window for the operator is less than two minutes to avoid collision. With this time to react, human intervention is likely to fail to recover the system and autonomous handling of faults could enhance safety and availability of offshore operations. Some PM system designs have the ability to handle selected faults of particular high severity, but these designs have been made ad-hoc without a uniform approach to fault handling. Ad-hoc implemented fault handling increases the risk of software faults that could become critical as this part of code is only executed when some failure has happened and handling of a not-normal situation is needed. Tools for systematic analysis and design for fault tolerant control (FTC) are therefore adopted in this paper and used to suggest a complete FTC design and analysis procedure for a thruster assisted Position-mooring system.

Means toward systematic design for fault-tolerant control have been available and have been used for individual subsystems or functions on marine vessels. Fault diagnosis of a diesel-driven propulsion system was the subject of the benchmark in [Izadi-Zamanabadi and Blanke \(1999\)](#), and solutions to the diagnosis part of the problem demonstrated by a sliding mode observer in [Edwards and Spurgeon \(2000\)](#), an adaptive observer in [Blanke et al. \(1998\)](#), and a non-switching detection and accommodation solution in [Wu et al. \(2006\)](#). Larger subsystems were treated in [Blanke \(2005\)](#), for station keeping control, where the structure-graph approach was successfully employed, and fault-tolerant sensor fusion for navigation instruments was treated in [Blanke \(2006\)](#). For Position-mooring, a setpoint chasing control algorithm was made fault-tolerant in [Fang and Blanke \(2011\)](#) and reliability indexes were included in the optimization in [Fang et al. \(2013\)](#). The minimum thruster power position was calculated in [Wang et al. \(2016\)](#), without considering faults or fault-tolerance. Reliability indexes were also considered in [Wang et al. \(2014\)](#) who suggested a backstepping control approach for Position-mooring, but they did not consider faults or fault-tolerance. The earlier reported results, which treated not-normal conditions, looked at selected faults in mooring lines and in [Blanke et al. \(2012\)](#), also on buoyancy element failures. In these earlier studies, fault isolation was made possible by assuming certain parts of the PM system to be healthy. This study will include the possibility that one or more sensors or actuators are faulty and it will include disturbances from sea, wind and current. This makes fault isolation an issue of special concern. The present problem is hence significantly more complex, yet also more realistic than earlier research. The study is made generic and realistic to the maritime industry through considering the instrumentation

46 that is required by classification societies.

47 With the objective of presenting a systematic FTC design that can be con-
48 ducted already at the design stage of a vessel automation system, with limited
49 additional efforts, structural analysis is employed for analysis of fault detection
50 and isolation properties, considering single or multiple-faults. Using standard
51 cases of instrumentation, as advised by classification societies, it is shown that
52 fault isolation cannot always be obtained with traditional methods, but an ac-
53 tive fault isolation technique is then explored with the purpose of isolating faults
54 that are otherwise only detectable. The paper details on how this is done and
55 it shows how, once a fault is isolated, it can be handled fast and predictably
56 without human intervention. The implications for marine operations are em-
57 phasised and aspects of overall safety and availability are considered. The sug-
58 gested techniques are implemented and tested in a model basin demonstrating
59 the suggested approach in a fully autonomous Position-mooring system.

60 The paper is organised as follows. After an overview of prior research in
61 the area, Section 3 introduces the modelling at a control plant level for FTC
62 purposes. Section 4 presents fault diagnosis for fault detection and isolation
63 using structural analysis and extends these with active isolation techniques.
64 Section 5 shows design of controllers to handle the range of faults dealt with
65 and the proposed fault-tolerant DP system design is validated by model basin
66 tests in Section 6. Section 7 concludes the paper. Notations and abbreviations
67 are listed in Tables 1 and 2.

68 2. Background and Previous Research

69 In offshore operations, marine vessels are often required to be kept in a de-
70 sired position using *dynamic positioning* (DP) or *Position-mooring* (PM) sys-
71 tem. The term *positioning control* is commonly used to denote either of these
72 technologies. A DP system exclusively uses thrusters to achieve a desired po-
73 sition and heading. Research on this industrially important subject include
74 Balchen et al. (1980), Selk ainaho (1993), IMO (1994), S orensen et al. (1996),
75 Strand et al. (1998), Strand (1999), S orensen and Strand (2000), Fossen (2002),
76 Lindegaard (2003), S orensen (2005), and Tannuri and Morishita (2006). The
77 history of DP development was excellently described in Breivik et al. (2015).
78 The vigor of the area is evidenced by new ideas being presented to dynamic
79 positioning control, e.g. Hassani et al. (2017), Benetazzo et al. (2015), Wu et al.
80 (2016), use of position estimation techniques when anchor positions are uncer-
81 tain Ren and Skjetne (2016) and study of key performance indicators in Park
82 et al. (2016). Fault-tolerant control for non-moored vessels were presented in
83 Blanke (2005), Benetazzo et al. (2015). Classification society rules for the area
84 are found in DNV (2014).

85 Position-moored systems use a combination of mooring lines and thrusters to
86 maintain the vessel's position, balancing the mean ocean disturbances acting on
87 the vessel. External forces are mainly attenuated by the mooring system while
88 the thrusters are used as dampers to reduce the vessel's dynamical motions.
89 In harsh weather conditions, the use of thrusters is necessary in a PM system

Table 1: Notation

\mathbf{A}_{bt}	thruster force to body force-moment matrix
\mathbf{A}_{bm}	mooring line force to body force-moment matrix
\mathbf{D}	linear damping matrix
$\boldsymbol{\eta} = [\mathbf{p}^\top, \psi]^\top$	position and heading
F_i	thrust from i^{th} thruster
$\mathbf{h} = [z, \phi, \theta]^\top$	heave, roll and pitch of the vessel
\mathbf{M}	body mass matrix including hydrodynamic added mass
N_m, N_t, N_p	number of mooring lines, thrusters and position sensors
N_g, N_v, N_w	number of horizontal -, vertical gyroscopes and anemometers
$\boldsymbol{\nu} = [u, v, r]^\top$	velocity vector of the vessel in the body-fixed frame
$\boldsymbol{\omega} = [p, q, r]^\top$	angular velocity of body
$\mathbf{p} = [x, y]^\top$	North-East position vector in Earth-fixed frame
ψ, r	yaw angle and yaw rate of the vessel
$\mathbf{R}_{nb}(\psi)$	yaw rotation from body to navigation frame
T_j, T_j^{xy}	tension in j th mooring line and its horizontal component
u_i	command shaft speed to i^{th} thruster
$\mathbf{v}_w, \mathbf{v}_c$	wind and current velocity vectors

Table 2: Acronyms and Abbreviations.

ARR	analytical redundancy relation
AUTS, AUT, AUTR	DNV-GL class notations for DP
CUSUM	cumulative sum
DP	dynamic positioning
FTC	fault-tolerant control
FPSO	floating production storage and offloading
GPS	global positioning system
HPR	hydro-acoustic position reference
MSO	minimal structurally overdetermined
PM	Position-mooring with thruster assistance
RPM	revolutions per minute

90 in order to avoid large tensions in mooring lines and to provide compensation
91 of any line break by keeping the vessel at an appropriate setpoint. Switching
92 strategies with a bank of controllers to cope with weather conditions were in
93 particular studied in [Nguyen et al. \(2007\)](#). Setpoint chasing control was sug-
94 gested in [Sørensen et al. \(2001\)](#) and extended in [Nguyen and Sørensen \(2009b\)](#).
95 Using a mooring line reliability criterion as control objective, [Berntsen et al.](#)
96 [\(2008\)](#) showed how to prevent line overload. A semi-static setpoint recalcula-
97 tion approach was suggested in [Fang and Blanke \(2011\)](#) to deal with breakage
98 of one or more lines and protect remaining intact ones. Selected faults, line
99 breakage and loss of an underwater buoyancy element, were demonstrated to
100 be diagnosable in a position-moored system by [Fang et al. \(2015\)](#). This paper
101 considers the much wider scenario of the entire fault-tolerant control problem
102 including failure of any of the key instruments, actuators or mooring lines. Ac-
103 tive fault diagnosis techniques [Niemann \(2006\)](#), [Blanke and Staroswiecki \(2006\)](#),
104 [Poulsen and Niemann \(2008\)](#), [Gelso and Blanke \(2009\)](#) and [Niemann \(2012\)](#) are
105 designed and tested in this paper to isolate faults that are only detectable with
106 conventional diagnostic methods.

107 Being an area of significant industrial importance, fault prognosis and diag-
108 nosis methods have been studied extensively. Methods employing spectral and
109 time-domain properties are extremely useful for diagnosis in rotating machinery
110 [Feng et al. \(2013\)](#) and [Sun et al. \(2014\)](#) whereas model-based diagnosis has been
111 the main focus for process diagnosis. A method that has proven to be useful
112 for analysis of rather complex systems is *structural analysis* where graph-based
113 tools are used to analyse topology while avoiding very detailed modelling. The
114 theoretical foundation was provided in [Dulmage and Mendelsohn \(1959\)](#) and
115 brought to use in fault diagnosis in [Staroswiecki and Declerck \(1989\)](#), [Blanke](#)
116 [et al. \(2015\)](#) and [Travé-Massuyès et al. \(2006\)](#). The structure graph of a system
117 helps discover potential redundancies and shows how to reconfigure the system
118 when a component is disabled, e.g. due to faults. A hypothesis test mechanism,
119 see [Kay \(1998\)](#), [Basseville and Nikiforov \(2002\)](#), and [Travé-Massuyès \(2014\)](#)
120 evaluates whether the system behaviour resembles a faultless or faulty plant
121 model. Successful application have been reported in several studies, see [Noura](#)
122 [et al. \(2009\)](#) and in particular the automotive industry has been very active in
123 this area, see [Svård et al. \(2014\)](#). Once a fault is isolated to be in a specific
124 component of the system, changes need to be made achieve given control objec-
125 tive, perhaps with degraded performance. Further details on FTC can be found
126 in [Blanke et al. \(2015\)](#).

127 **3. Modelling for fault-tolerant control**

128 Modelling of marine systems is based on first principles with addition of laws
129 from hydrodynamics. With a vessel being a body moving in six degrees of free-
130 dom, nonlinear static and dynamic phenomena are present. Hence, models will
131 be nonlinear by nature and they easily become extremely complex. When aim-
132 ing at analysis of features essential for fault detectability and for fault-tolerant
133 control, the very detailed models pose an obstacle rather than a benefit because

134 a first concern in fault-tolerant design is to gain insight in properties at an over-
 135 all level of functionality. The modelling needed for fault-tolerant design is the
 136 topology of the system and descriptions of function blocks. This is done through
 137 formulation of *constraints*.

138 3.1. Using constraints for modelling

When considering fault-tolerant control, we need an answer to the question:
 which overall functions (e.g. actuators and sensors) are healthy and available for
 use by the control system. We are not interested in localization of defects to par-
 ticular sub-components, as is the case for condition monitoring and maintenance
 systems. Modelling therefore need be done at the level of overall functionality.
 Such modelling is conveniently done using the principles of behavioural mod-
 elling [Willems \(1996\)](#), where constraints c describe how certain variables are
 related. To introduce the notation, let variables be x, z and u , and let g_s and
 g_d denote functions; then constrains can be static (c_s) or dynamic (c_d) :

$$\begin{aligned} c_s : 0 &= g_s(x, u) - z \\ c_d : 0 &= g_d(x, u) - \dot{x}, \end{aligned}$$

139 where g_s and g_d can be linear or nonlinear. Derivatives of variables can be
 140 explicit or implicit in the constraints. Behavioural models are not necessarily
 141 continuous, but the framework of static and dynamic nonlinear constraints fit
 142 well with the physical modelling of a marine vessel.

143 While any symbol could be used for a constraint, we use a_i for constraints
 144 related to actuators, c_i for a generic constraints within the system, m_i for mea-
 145 surement constraints and d_i for differential constraints. The

146 3.2. Model of a Position-moored marine vessel

147 Consider a vessel with the thrusts produced by propellers,

$$a_i : F_i = g_p(u_i), \quad (1)$$

148 where $i = 1, \dots, N_t$; N_t is the number of thrusters; u_i is demanded propeller
 149 speed; g_p is the nominal relation between u_i and the thrust obtained. The
 150 thrusters contribute to control forces in surge and sway, and moment in yaw
 151 (hereinafter called *control forces*) according to their position in the vessel and
 152 azimuth (relative direction) of the thruster.

153 For brevity, we define the posture $\boldsymbol{\eta}$ as the vector of the Earth-fixed position
 154 of centre of the ship, $\mathbf{p} \in \mathbb{R}^2$, and its' heading angle, $\psi \in \mathbb{S}$,

$$\boldsymbol{\eta} = [\mathbf{p}^\top, \psi]^\top. \quad (2)$$

155 Horizontal plane forces from the Position-mooring (PM) system are available
 156 via the horizontal components of the tensions in mooring lines and the mooring
 157 system geometry. Tension in line j is a function of position of the turret, hence
 158 a function of the posture vector,

$$c_j : T_j^{xy} = g_j(\boldsymbol{\eta}), \quad (3)$$

159 where $j = 1, \dots, N_m$ and N_m is the number of mooring lines. This constraint is
 160 the elastic catenary equations [Triantafyllou \(1990\)](#) for each mooring line,

$$\begin{aligned}
 x_1 &= \frac{T_i^{xy}}{w_0} \sinh^{-1} \left[\frac{T_i^z - w_0(L-s)}{T_i^{xy}} \right] \\
 &\quad - \frac{T_i^{xy}}{w_0} \sinh^{-1} \left[\frac{T_i^z - w_0L}{T_i^{xy}} \right] + \frac{T_i^{xy}s}{EA_0}, \\
 x_2 &= \frac{T_i^{xy}}{w_0} \sqrt{1 + \left[\frac{T_i^z - w_0(L-s)}{T_i^{xy}} \right]^2} \\
 &\quad - \frac{T_i^{xy}}{w_0} \sqrt{1 + \left[\frac{T_i^z - w_0L}{T_i^{xy}} \right]^2} \\
 &\quad + \frac{1}{EA_0} \left(T_i^z s + \frac{w_0}{2} [(L-s)^2 - L^2] \right).
 \end{aligned}$$

161 Here, L is the un-stretched cable length; s is a parameter running along
 162 the cable from 0 (anchor point) to L (top end point); $x_1(s)$ and $x_2(s)$ are the
 163 spacial horizontal and vertical components along the cable; T_{mo}^{xy} and T_{mo}^z are
 164 the horizontal and vertical tensions at the upper end; w_0 is the weight in water
 165 per unit length; E is Young's modulus of elasticity; and A_0 is the cross-sectional
 166 area. In order to calculate T_{mo}^{xy} , we need to solve the catenary equation with
 167 boundary conditions, details of which are found in [Aamo and Fossen \(2001\)](#),

$$\begin{aligned}
 x_1(0) &= 0, & x_1(L) &= \text{calculated from posture vector } \boldsymbol{\eta}, \\
 x_2(0) &= 0, & x_2(L) &= \text{water depth.}
 \end{aligned}$$

168 We consider a rotatable turret mooring system in this paper. In this system,
 169 the ship can rotate freely around the turret; therefore, manual rotation of the
 170 turret is not considered.

171 Now consider the ocean current and wind disturbances acting on the vessel.
 172 The vector of sea current velocity over ground is $\mathbf{v}_c \in \mathbb{R}^2$, relative wind is
 173 $\mathbf{v}_w \in \mathbb{R}^2$, and $\boldsymbol{\nu} \in \mathbb{R}^3$ is a vector with body-fixed velocities relative to water
 174 in surge, sway and yaw. Roll, pitch and heave are not relevant for a moored
 175 vessel. Wind load is described by a function $\mathbf{g}_w(\mathbf{v}_w)$. The kinetics of the vessel
 176 in surge, sway and yaw is then,

$$\begin{aligned}
 \mathbf{c}_{1+N_m} &: \mathbf{M}\dot{\boldsymbol{\nu}} = \sum_{i=1}^{N_t} \mathbf{A}_{bt}^i F_i \\
 &\quad + \sum_{j=1}^{N_m} \mathbf{A}_{mo}^j(\boldsymbol{\eta}) T_j^{xy} + \mathbf{g}_w(\mathbf{v}_w) - \mathbf{D}(\boldsymbol{\nu})\boldsymbol{\nu}, \quad (4)
 \end{aligned}$$

177 where \mathbf{A}_{bt} is the mapping from individual thrusts to control forces in body
 178 coordinates, \mathbf{A}_{mo}^j transforms the horizontal tension of the j^{th} mooring line to
 179 body-fixed coordinates, and $\mathbf{D}(\boldsymbol{\nu})\boldsymbol{\nu}$ is velocity-proportional damping. This term

180 describes the combination of viscous drag on hull and mooring lines. In the se-
 181 quel, we use $\mathbf{D}\boldsymbol{\nu}$ for brevity for this damping term. In reality, parts of the mooring
 182 lines have velocity through water that deviate from $\boldsymbol{\nu}$, e.g. due to vibrations.
 183 Such dynamic effects constitute, together with other nonlinear hydrodynamic
 184 phenomena and parameter uncertainties, so-called *unmodelled dynamics*. Fault
 185 diagnosis methods are designed such that they minimize sensitivity to unknown
 186 disturbances and to unknown dynamics.

187 The kinematics from body-fixed velocity relative to water, $\boldsymbol{\nu} \in \mathbb{R}^3$, to Earth-
 188 fixed position and angles, $\boldsymbol{\eta} \in \mathbb{R}^3$, is

$$c_{2+N_m} : \dot{\boldsymbol{\eta}} = \mathbf{R}_{nb}(\psi)\boldsymbol{\nu} + [\mathbf{v}_c^\top, 0]^\top, \quad (5)$$

189 where $\mathbf{R}_{nb}(\psi)$ is the horizontal rotation from body to North-East coordinates,
 190 using the approximation that velocities are considered to be horizontal.

191 Using derivatives explicitly in the constraints, the differential operator need
 192 be described as a relation between a variable and its time derivative,

$$d_1 : \dot{\boldsymbol{\nu}} = \frac{d}{dt}\boldsymbol{\nu}, \quad (6)$$

$$d_2 : \dot{\boldsymbol{\eta}} = \frac{d}{dt}\boldsymbol{\eta}. \quad (7)$$

193 3.3. Sensors available

194 The sensor devices onboard are: N_g gyrocompass units for heading measure-
 195 ments; N_p position measurements: GPS receivers and/or hydro-acoustic position
 196 reference (HPR) units; N_r motion reference units (MRU) measuring heave,
 197 roll and pitch; N_w anemometers for wind speed and direction measurements; a
 198 tension sensor for each of N_m mooring lines; N_t thrusters. The constraints that
 199 map the measured variables to the physical system states are,

$$m_k : h_k = \psi, \quad (8)$$

$$m_{N_g+l} : \mathbf{p}_{m_l} = \mathbf{p} + \mathbf{R}(\phi, \theta, \psi)\mathbf{l}_l \quad (9)$$

$$m_{N_g+N_p+m} : \mathbf{h}_{m_m} = [z, \phi, \theta]^\top \quad (10)$$

$$m_{N_g+N_p+N_r+n} : \mathbf{w}_{m_n} = \mathbf{v}_w \quad (11)$$

$$m_{N_g+N_p+N_r+N_w+1} : \mathbf{c}_m = \mathbf{v}_c \quad (12)$$

$$m_{N_g+\dots+N_w+1+i} : u_{m_i} = u_i \quad (13)$$

$$m_{N_g+\dots+N_t+j} : T_{m_j} = g_{mo}(T_j^{xy}), \quad (14)$$

200 where indices $k, l, m, n, 1, i, j$ refer to gyro, position measurement units, vertical
 201 reference units, anemometer(s), current sensor, thrusters and tension measure-
 202 ments, respectively. The associated measurements are denoted $h_k, \mathbf{p}_{m_l}, \mathbf{h}_{m_m},$
 203 $\mathbf{w}_{m_n}, \mathbf{c}_m, u_{m_i}, T_{m_j}$.

204 Transformation of from actual sensor positions to ship's reference position
 205 is based on a rotation matrix, $\mathbf{R} \in \mathbb{R}^{2 \times 3}$, and a local position of the device,
 206 $\mathbf{l}_l \in \mathbb{R}^3$, as shown in Eq. (9).

Table 3: Requirements of system arrangement for different DP classifications [DNV \(2014\)](#).

No.	Component	Minimum requirements		
		AUTS	AUT	AUTR
N_t	Thrusters	No redundancy	No redundancy	Redundant
N_p	Position sensors	1	2	3
N_w	Anemometers	1	1	2
N_g	Heading sensors	1	1	3
N_r	Motion ref. units	1	1	3

207 The actual numbers of thrusters (actuators), sensors and measurement units
 208 depend on the class of the DP system. Table 3 shows the requirements for dif-
 209 ferent classes according to the DNV-GL classification [DNV \(2014\)](#). Equivalent
 210 class notations exist from other classification societies, see [IMO \(1994\)](#) and later.

211 4. Fault diagnosis

212 The essence of analytic fault diagnosis is to establish relations to test whether
 213 measured and other known variables satisfy all relations that describe the sys-
 214 tem’s normal behaviour. If this is not the case, some violation of normal be-
 215 haviour has occurred, i.e. one or more faults are present in the system. Relations
 216 that can be used for such testing are referred to as redundancy relations.

217 Let a system be described by a set \mathcal{X} of unknown variables, a set \mathcal{K} of known
 218 variables and a set of constraints \mathcal{C} on these variables. Then there may exist
 219 a set $\mathcal{C}_m \subseteq \mathcal{C}$ from which all variables in \mathcal{X} can be determined. A system that
 220 has this property is said to have a complete matching on the unknown vari-
 221 ables. If any constraints exist that were not used to obtain such matching, the
 222 set of unmatched constraints $\mathcal{C}_{um} \subset \mathcal{C}$ may be used to test the consistency be-
 223 tween known variables and the system’s normal behaviour. Hence, redundancy
 224 relations are obtained with basis in the unmatched constraints.

225 Solving for unknown variables in a nonlinear system can be rather complex
 226 if done directly on the analytical form of the constraints. *Structural analysis*
 227 offers a significant shortcut. It is a method to determine possible ways to solve
 228 a set constraints without actually doing so. Making a graph representation of
 229 the relations between constraints and unknown variables makes it possible to
 230 seek through a graph to determine how one could solve for unknown variables.
 231 The result of a structural analysis is a receipt that, in symbolic form, describes
 232 how unknown variables could be calculated from known variables, using the
 233 system constraints. Analytical expressions are not used until after a complete
 234 structural solution is found. This dramatically reduces the complexity of finding
 235 redundancy relations for fault diagnosis.

236 The salient feature of the structural analysis approach is that graph theory
 237 exists that can be employed to find all possible ways the set of system constraints

238 can be matched to unknown variables. A theoretic procedure was shown in the
 239 seminal paper [Dulmage and Mendelsohn \(1959\)](#). Later research has resulted in
 240 several algorithms to determine parity relations from structure graph informa-
 241 tion, summarised in [Blanke et al. \(2015\)](#) with significant efficiency improvements
 242 in algorithms reported in [Krysander \(2006\)](#), who finds all Minimally Structurally
 243 Overdetermined (MSO) subgraphs in a structure graph. Structural isolability
 244 properties may differ from residuals found from one complete matching to an-
 245 other, and an overall approach to selection of the sets of residuals was recently
 246 suggested in [Svård et al. \(2013\)](#). This paper employs existing algorithms to find
 247 all complete matchings to revealed that violation in certain constraints in AUTS
 248 and AUT class systems will not be isolable, i.e. there are faults that can not
 249 be isolated. It will then be demonstrated how fault isolation can be achieved
 250 anyway by an active diagnosis approach. When such fault is detected, small
 251 magnitude reference changes to thrusters are used to show which constraints
 252 have become violated. Once the root cause of a fault is isolated, it is shown how
 253 fault-tolerant control is employed to handle the event.

254 4.1. Structural domain analysis

255 In the structural analysis approach, the variables in Eqs. (1) to (14) are
 256 classified as unknown, known input and known measured variables, respectively

$$X = \{F_i, T_j^{xy}, \dot{\nu}, \nu, \dot{\eta}, \eta, \phi, \theta, \mathbf{p}, \psi, \mathbf{v}_c, \mathbf{v}_w\}, \quad (15)$$

$$K_i = \{u_i\}, \quad (16)$$

$$K_m = \{h_k, \mathbf{p}_{m_l}, T_{m_j}, \mathbf{h}_{m_m}, \mathbf{w}_{m_n}, \mathbf{c}_m, u_{m_i}\}. \quad (17)$$

257 The technique analyses the principal relations between these types of vari-
 258 ables. The relations between variables are expressed through a generic model
 259 that explains the topology or *structure* in the set of *constraints* that define a
 260 behavioral model of our plant. The model, referred to as the *structural* model,
 261 of the system $(\mathcal{C}, \mathcal{Z})$ defines as a bi-partite graph $(\mathcal{C}, \mathcal{Z}, \mathcal{E})$, where $\mathcal{E} \subset \mathcal{C} \times \mathcal{Z}$ is a
 262 set of edges defined by $(c_i, z_i) \in \mathcal{E}$ if the variable z_i appears in the constraint c_i .
 263 The structure graph of an AUT class positioning controlled vessel is depicted
 264 in Fig. 1. In this structure graph, a constraint is represented by a bar, an edge
 265 by a line and a variable by a circle.

266 One further defines a complete matching $\mathcal{M} \subset \mathcal{E}$ with respect to unknown
 267 variables as a subset of edges that orientates known variables towards constraints
 268 in order to solve for all unknown variables. It is noted that arrows on edges
 269 imply direction of causality, as illustrated in the structure graph (Fig. 1). The
 270 implication is that a variable must be solved for by following the direction of
 271 the arrow.

272 4.2. What structural analysis offers

273 Structural analysis is in essence a graph theoretical way that advises in which
 274 order a set of equations can be solved, i.e which unknown variable can be deter-
 275 mined from which constraint. When a constraint is constructed such that one

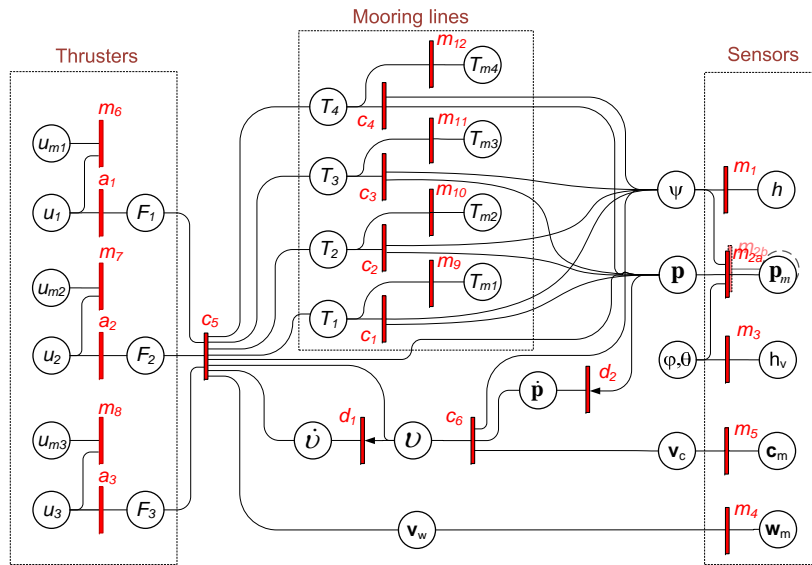


Figure 1: Generic structure graph for vessel configured to class AUT. The case shown has $N_t = 3, N_m = 4, N_p = 2, N_g = 1, N_v = 1, N_w = 1$. An AUTS vessel would have $N_p = 1$.

276 or more of the variables that are included in the constraint cannot be calculated
 277 from the constraint, but others can, we define a direction of calculation in a
 278 graph. As example in $c : x_1 = g(x_2)$, x_2 can only be calculated from c if g
 279 is invertible. If calculation is one-way only, we denote $c : x_1 \leftarrow g(x_2)$ when
 280 performing the structural analysis.

281 4.2.1. Violation of constraints

282 In structural analysis, a fault is defined as a violation of a constraint. Such
 283 violation will affect a parity relation if this parity relation is constructed from
 284 that constraint. If a fault affects the residual vector, it is said to be structurally
 285 detectable. If a fault affects the unique pattern of the residual vector's elements,
 286 it is structurally isolable.

287 It is noted that the results from structural analysis are necessary but not
 288 sufficient conditions for analytical property. E.g. the structural isolability does
 289 not imply the isolability of a real fault while the isolability of a real fault does
 290 imply the structural isolability.

291 4.2.2. Dealing with vector relations

292 Structural analysis was originally developed to deal with sets of scalar vari-
 293 ables and functions. In a marine setting, some variable are conveniently treated
 294 as vectors, e.g position \mathbf{p} has components in North and East of the Earth-fixed
 295 navigation frame, $\mathbf{p} = [p_N, p_E]^T$ and velocity is $\mathbf{v} = [v_N, v_E]^T$. Relating velocity
 296 to position $\dot{\mathbf{p}} = \mathbf{v}$ therefore constitutes two uncoupled linear equations to which
 297 the structural analysis tools immediately apply.

298 Transformation in the horizontal plane from body to navigation frame $c :$
 299 $\mathbf{v}^n = \mathbf{R}_{nb}(\psi)\mathbf{v}^b$ includes the 2×2 rotation matrix $\mathbf{R}_{nb}(\psi)$, both of the veloc-
 300 ity vectors are calculable from c , since the rotation is invertible. Some auto-
 301 mated tools, including SaTool [Blanke and Lorentzen \(2006\)](#), cannot automate
 302 the calculation of the angle of rotation from such constraint. This is a software
 303 technicality that is dealt with by declaring, to the software, that ψ cannot be
 304 determined from c .

305 In some cases, vectors need be written in component form. In a scalar
 306 product between vectors \mathbf{a} and \mathbf{b} $c : 0 = \mathbf{a}\mathbf{b}^T$, one vector cannot be uniquely
 307 determined even if the other is known, since any vector, perpendicular to the
 308 known one, will satisfy the constraint. However, writing the equation in com-
 309 ponent form, $0 = a_1b_1 + a_2b_2 + a_3b_3$, will allow the structural analysis tools to
 310 solve for one element if the others are known.

311 Convenience and concerns for brevity have dictated that vector notation is
 312 used when possible in this paper.

313 4.3. Redundancy relations for class AUT vessel

314 From the discussion above, the entire set of constraints are, for a class AUT
 315 vessel with 4 mooring lines ($N_m = 4$), 3 thrusters ($N_t = 3$) and class AUT
 316 instrumentation:

Table 4: Constraints for AUT class vessel with $N_t = 3$ thrusters, $N_m = 4$ mooring lines and 2 position measurements

a_i	$F_i = \mathbf{g}_p(u_i) \quad \text{for } i = 1 \dots N_t$
c_j	$T_j = \mathbf{g}_{m_j}(\mathbf{p}, \psi) \quad \text{for } j = 1 \dots N_m$
c_5	$\mathbf{M}\dot{\boldsymbol{\nu}} + \mathbf{C}\boldsymbol{\nu} = \mathbf{g}_w(v_w) + \sum_{i=1}^{N_t} (\mathbf{A}_{bt}^i g_p(u_i)) + \sum_{j=1}^{N_m} (\mathbf{A}_{bm}^j T_{m_j})$
c_6	$\dot{\mathbf{p}} = \mathbf{v}_c + \mathbf{R}(\psi)\boldsymbol{\nu}$
d_1	$\dot{\boldsymbol{\nu}} = \frac{d}{dt}\boldsymbol{\nu}$
d_2	$\dot{\mathbf{p}} = \frac{d}{dt}\mathbf{p}$
m_1	$\psi_m = \psi$
m_{2a}	$\mathbf{p}_{m1} = \mathbf{p} + \mathbf{R}((\phi, \theta), \psi)\mathbf{l}$
m_{2b}	$\mathbf{p}_{m2} = \mathbf{p} + \mathbf{R}((\phi, \theta), \psi)\mathbf{l}$
m_3	$(\phi_m, \theta_m) = (\phi, \theta)$
m_4	$\mathbf{w}_m = \mathbf{v}_w$
m_5	$\mathbf{c}_m = \mathbf{v}_c$
m_{5+i}	$u_{mi} = u_i \quad \text{for } i = 1 \dots N_t$
m_{8+j}	$T_{mj} = T_j \quad \text{for } j = 1 \dots N_m$

317 The structural analysis given the constraints in Table 4 with unknown variables
318 listed in Eq.15 and known ones in Eqs. 16 - 17. Analysis is done using
319 the SaTool software [Blanke and Lorentzen \(2006\)](#) where different algorithms are
320 available to find matchings and MSO sets. A set of analytical redundancy relations
321 (AAR) is generated as the result of the structural analysis. Each complete
322 matching or MSO set will define a set of relations, see Table 5, that shows which
323 constraint is used to calculate each of the unknown variables. A 0 in the table
324 indicates an unmatched constraint that can be used as an ARR.

Table 5: A complete matching of the AUT class system in Table 4

a_1	a_2	a_3	c_1	c_2	c_3	c_4	c_5	c_6	d_1	d_2	m_1
F_1	F_2	F_3	0	0	0	0	0	ν	$\dot{\boldsymbol{\nu}}$	$\dot{\mathbf{p}}$	ψ
m_{2a}	m_{2b}	m_3	m_4	m_5	m_6	m_7	m_8	m_9	m_{10}	m_{11}	m_{12}
0	p	(ϕ, θ)	v_w	v_c	0	0	0	T_1	T_2	T_3	T_4

325 The complete matching of Table 5 gives a set of 9 ARRs. Each ARR provides
326 a balance that must be present between left and right hand sides of the ARR.
327 Forming the difference between the two sides of an ARR gives a residual, which
328 is zero, or close to, when no constraint in the ARR is violated; it is non-zero if
329 a constraint is violated.

330 For the AUT class system, the complete matching shown in Table 5, gives
331 ARRs corresponding to the unmatched constraints $\{c_1, c_2, c_3, c_4, c_5, m_6, m_7, m_8\}$.
332 Automated back-tracking [Blanke et al. \(2015\)](#), [Laursen et al. \(2008\)](#), to known
333 variables give an automated procedure to generate the ARRs in symbolic form
334 [Blanke and Lorentzen \(2006\)](#). Using $h_v = (\phi, \theta)$ and $h = \psi$ for convenience, the

335 $N_{arr} = 9$ symbolic ARR's are,

$$\begin{aligned}
arr_1 : 0 &= c_1(m_9(T_{m1}), m_{2b}(p_{m2}, m_3(hv), m_1(h)), m_1(h)) \\
&\vdots \\
arr_5 : 0 &= c_5(a_1(u_1), a_2(u_2), a_3(u_3), m_9(T_{m1}), m_{10}(T_{m2}), m_{11}(T_{m3}), \\
&\quad m_{12}(T_{m4}), d_1(c_6(d_2(m_{2b}(p_{m2}, m_3(hv), m_1(h))), m_1(h), m_5(c_m))), \\
&\quad c_6(d_2(m_{2b}(p_{m2}, m_3(hv), m_1(h))), m_1(h), m_5(c_m)), m_4(w_m)) \\
arr_6 : 0 &= m_6(u_1, u_{m1}) \tag{18} \\
&\vdots \\
arr_9 : 0 &= m_{2a}(p_{m1}, m_3(hv), m_{2b}(p_{m2}, m_3(hv), m_1(h)), m_1(h))
\end{aligned}$$

336 Replacing the left hand side zero in $arr_i : 0 = c_j(\dots)$ by a *residual* r_i provides
337 a basis for diagnosis. A residual remains zero if no violation of any constraint
338 in the associated ARR is present. Structural detectability (SD) and - isolability
339 (SI) follows from the pattern in which constraints participate in the calculation
340 of residuals. SD of c_i follows if c_i participates in the calculation of any of the
341 residuals, $r_j \in \mathbf{r}$. SI follows when c_i has a unique signature in \mathbf{r} , see e.g. [Blanke](#)
342 [and Staroswiecki \(2006\)](#), [Blanke et al. \(2015\)](#) for concise definitions.

343 4.3.1. Structural detectability and isolability

344 The number of AAR's available from one complete matching is less or equal
345 to the number of constraints less the number of unknown variables, hence dif-
346 ferent sets of residuals will be available for different DP class vessels, and de-
347 tectability and isolability properties differ as well. As example, Table 6 shows
348 AUTS and AUT vessels with $N_m = 4$ mooring lines and $N_t = 3$ thrusters.
349 The AUTS vessel has eight ARR relations from one complete matching. AAR's
350 created as MSO sets [Krysander \(2006\)](#) is an alternative where 96 AAR's are
351 generated. In general, detectability will be the same for the two ways of finding
352 ARRs, but isolability can be enhanced by using the MSO solution, at the ex-
353 pense of running more ARRs in parallel than with the single matching set. In
354 the DP case, the use of MSO sets does not improve isolability for this particular
355 system.

356 Table 6 shows the structural detectability and isolability if a constraint
357 should be violated. Constraints are shown in the first row; the correspond-
358 ing physical components in the second; structural detectability d and isolability
359 i are shown in the bottom rows.

360 4.3.2. Results for multiple faults

361 Analysis of cases of multiple faults is important when a DP vessel is desired
362 to continue operation despite the presence of one or more faults in the system.
363 Detectability and isolability are essential for the FTC solution in each case since
364 a controller used in case of fault(s) would be unsafe if it relies on sensors for
365 which a failure could not be detected [Blanke \(2005\)](#).

Table 6: Analysis of single fault cases for vessel of DP class AUTS and AUT.

Constraint	a_i	c_i	c_5	m_1	m_{2a}	m_{2b}	m_3	m_4	m_5	m_{5+i}	m_{5+N_t+j}
Component	thruster	mooring line i	vessel dynamics	gyro	position-1	position-2	MRU	anemometer	sea current measurement	RPM measurement	tension measurement
AUTS	d	i	d	d	d	-	d	d	d	i	i
AUT	d	i	d	d	i	i	d	d	d	i	i

Table 7: Analysis of two simultaneous faults for a DP vessel of AUTS class.

$f_1 \backslash f_2$	a_i	c_1	c_2	c_5	m_1	m_2	m_3	m_4	m_5	m_{5+i}	m_{5+N_t+j}
a_i	-	d	d	0	d	d	d	0	0	i	d
c_1	d	-	i	d	d	d	d	d	d	i	d
c_5	0	d	d	-	d	d	d	0	0	i	d
m_2	d	i	i	d	0	-	0	d	d	i	i
m_3	d	i	i	d	0	0	-	d	d	i	i
m_4	0	d	d	0	d	d	d	-	0	i	d
m_{5+i}	d	i	i	d	d	d	d	d	d	-	i
m_{5+N_t+1}	d	d	i	d	d	d	d	d	d	i	-

366 Table 7 shows the structural results for the AUTS class configuration with
367 a particular fault f_1 already present and a second fault f_2 occurs. As seen
368 from the table, if a fault already occurred in a mooring line (c_1), a further fault
369 in the tension measurement unit (m_9) of this line is only detectable instead of
370 isolable. If a fault already occurred in a tension measurement unit, a fault in the
371 corresponding mooring line would still be structurally isolable. Table 8 shows a
372 few cases of three simultaneous faults.

373 The table illustrates which structural faults are detectable and isolable after
374 two faults have occurred. In the second row block, thruster a_i first failed, then
375 thruster RPM measurement m_{5+i} fails (first line) or tension measurement j
376 m_{5+N_t+j} fails (second line). The consequence of the RPM fault is that further
377 faults in position from current and body velocity c_6 , anemometer m_4 or sea
378 current m_5 could not be detected. The consequence of the second fault being
379 in tension sensor for line 2 is that, furthermore, a line defect in line 2 would be

380 invisible to the fault detection system, when using passive fault detection tech-
 381 niques. Active fault isolation is described later in this paper. These information
 382 are used in the FTC supervisor algorithms that determine which remedial action
 383 should be initiated in each case of single or multiple defects.

Table 8: Analysis of three simultaneous faults for a DP vessel of AUTS class.

f_1	f_2	f_3	a_i	c_2	$c_{j \neq 2}$	c_6	m_1	m_2	m_3	m_4	m_5	m_{5+i}	m_{5+N_t+j}
	a_i		-	-	d	0	d	d	d	0	0	i	0
c_2	m_2		d	-	i	d	0	-	0	d	d	i	d
	m_{5+N_t+j}		0	-	d	0	d	d	d	0	0	i	-
	m_{5+i}		-	d	d	0	d	d	d	0	0	-	d
a_i	m_{5+N_t+j}		-	0	d	0	d	d	d	0	0	i	-

384 This analysis has considered violation of one or more constraints. Some
 385 physical faults may affect more than one constraint. In such cases, the multiple
 386 violations are defined in the SaTool software and re-analysis is done.

387 4.4. Analytical domain analysis

388 This design step includes: obtain residuals in analytical form; ensure residu-
 389 als are causal; model faults as signals; and investigate diagnosability properties
 390 of physical faults.

391 4.4.1. Residuals in analytical form

392 The symbolic form (Eq. 18) advise the way ARRs are to be calculated.
 393 Inserting the analytical form of constraints hence makes it possible to auto-
 394 generate residuals. For the AUT class, $N_r = 9$ residuals are auto-generated
 395 in this way: $r_1 \dots r_4$ express a force balance of each of the mooring lines; r_5
 396 the force balance on the vessel; $r_6 \dots r_8$ the difference between command and
 397 measured rotational speed for each of the thrusters; r_9 the deviation between
 398 the two position sensors.

399

The residuals read, in *analytical form* in the *continuous time* domain,

$$r_j(t) = T_{mi}(t) - (g_{m_j}(\mathbf{p}_{m1}(t) - \mathbf{R}_{nb}(t)\mathbf{l}, \psi_m(t))), \quad j = 1 \dots N_m \quad (19)$$

$$\begin{aligned} \mathbf{r}_5(t) &= \mathbf{M} \mathbf{R}_{bn}(t) \frac{d}{dt} \left(\frac{d}{dt} (\mathbf{p}_{m1}(t) - \mathbf{R}_{nb}(t)\mathbf{l}) - \mathbf{c}_m(t) \right) \\ &\quad - \mathbf{M} \boldsymbol{\omega}(t) \times \left(\frac{d}{dt} (\mathbf{p}_{m1}(t) - \mathbf{R}_{nb}(t)\mathbf{l}) - \mathbf{c}_m(t) \right) \\ &\quad + \mathbf{C} \mathbf{R}_{bn}(t) \left(\frac{d}{dt} (\mathbf{p}_{m1}(t) - \mathbf{R}_{nb}(t)\mathbf{l}) - \mathbf{c}_m(t) \right) \\ &\quad - \left(\mathbf{g}_w(\mathbf{w}_m(t)) + \sum_{i=1}^{N_t} (\mathbf{A}_{bt}^i g_p(u_i(t))) + \sum_{j=1}^{N_m} (\mathbf{A}_{bm}^j T_{m_j}(t)) \right) \end{aligned} \quad (20)$$

$$r_{5+i}(t) = u_{mi}(t) - u_i(t) \quad \text{for } i = 1 \dots N_t \quad (21)$$

$$r_9(t) = \mathbf{p}_{m1}(t) - \mathbf{p}_{m2}(t) \quad (22)$$

4.4.2. Physical faults

A physical fault \mathbf{f}_j impacting one but possibly a subset of the constraints simultaneously,

$$\mathbf{f}_j \Rightarrow \{c_i \neq 0\} \quad i \in [1, \dots, N_{arr}]. \quad (23)$$

In our case, physical faults of interest are: fault in any sensor; fault in any thruster; fault in any mooring line, and according to Table 6, each such component fault origin in a single constraint. Some component faults can be modelled as additive signals, $\mathbf{p}_{mi} = \mathbf{p} + \mathbf{f}_{pi}$, for a position sensor fault, others as multiplicative, $g_p(u_i) = (1 - \mathbf{f}_{pi})g_p(u_i)$, for a thruster force generation defect.

Common mode fault originating from faults in power system or physical infrastructure (fire, partial flooding, partial loss of power, local area network disruption) are possible to model and analyse but this has not been within the scope of this study.

4.4.3. Fault detectability and isolability

Using the definitions in Blanke et al. (2015), a fault $f(t)$ occurs at $t = t_0$ and has bounded magnitude, $|f(t)| \leq \bar{f}$. This fault is *strongly detectable* in the residual vector if a stable residual generator exists with the property:

$$\forall t \geq t_0, \quad 0 < |f_j(t)| \leq \bar{f} \implies |r(t)| \neq 0, \forall t \geq t_0$$

A fault is *weakly detectable* if a stable residual generator exists with the property:

$$\exists t_0 < t_1 < t_2 : \forall t \geq t_0, |f_i(t)| \neq 0 \implies \exists t_1, t_2 : |r(t)| \neq 0 \text{ for } t_1 < t < t_2.$$

Table 9 shows the relation between defects in constraints, each representing a physical component, and residuals in a *dependency table*. The following symbols are used: detectability, d ; isolability, i ; strong, s ; and weak, w . The table shows that all faults are strongly detectable, the majority are furthermore strongly isolable, but thruster faults are only detectable.

Table 9: Residuals' dependency of individual violation of constraints for AUT class with $N_t = 3, N_m = 4, N_p = 2, N_g = 1, N_v = 1, N_w = 1$

-	a ₁	a ₂	a ₃	c ₁	c ₂	c ₃	c ₄	m ₁	m ₂ ^a	m ₂ ^b	m ₃	m ₄	m ₅	m ₆	m ₇	m ₉	m ₉	m ₁₀	m ₁₁	m ₁₂
Comp	thr 1	thr 2	thr 3	line 1	line 2	line 3	line 4	gyro	pos 1	pos 2	MRU	wind	cur	RPM 1	RPM 2	RPM 3	tens 1	tens 2	tens 3	tens 4
r ₁				s				s	s		s						s			
r ₂					s			s	s		s							s		
r ₃						s		s	s		s								s	
r ₄							s	s	s		s									s
r ₅	s	s	s						w	w	w	s	s				s	s	s	s
r ₆														s						
r ₇															s					
r ₈																s				
r ₉									s	s										
d/i	d	d	d	i	i	i	i	d	i	i	d	d	d	i	i	i	i	i	i	i
w/s	s	s	s	s	s	s	s	s	s	s	s	s	s	s	s	s	s	s	s	s

4.4.4. Causality of residuals

ARRs in general contain derivatives, in this case Eq. 20, and filtering may need be employed to reach a causal implementation of a residual generator; either through linear lowpass filtering of appropriate order or by using a model-based feedback structure, an observer or a Kalman filter.

Applying a simple linear filter $H(s)$ Eq. 20 gives the modified (filtered) residual, $\mathbf{r}_5^f(t)$, with the Laplace domain equivalent,

$$\mathbf{r}_5^f(s) = H(s)\mathbf{r}_5(s). \quad (24)$$

The reduction in variance due to filtering is easily calculated using standard methods, either by finding the resulting variance through integration,

$$\sigma_{r_{5,f}}^2 = \int_{-\infty}^{\infty} H(j\omega)H(-j\omega)S_{\mathbf{r}_5\mathbf{r}_5}(j\omega)d\omega$$

where $S_{\mathbf{r}_5\mathbf{r}_5}$ denotes the spectrum of the unfiltered residual, or by solving the Lyapunov equation if the filter and any non-whiteness in the residual are represented as a state-space form, Blanke et al. (2015). The resulting variance and correlating structure are important for the change detection properties.

4.5. Discussion

The approach to design residual generators, as outlined above, is comparable with other methods for generating residuals for fault diagnosis. FDI observers for linear systems, see Garcia and Frank (1997) and references herein, or for nonlinear systems Persis and Isidori (2001), Besançon (2003) and later extensions, obtain dynamic filters as generators of residuals. These observers mask

439 a disturbance from the residual. The residuals obtained from structural anal-
 440 ysis have the same property since, by including a disturbance as an unknown
 441 variable, the obtained matching will use one of the constraints to match this
 442 unknown variable, and the AARs will be independent of the unknown input.

443 4.6. Change detection

444 Once the residuals are obtained, a change detection algorithm decides whether
 445 a change can be confirmed, the \mathcal{H}_1 hypothesis, or the normal case can be con-
 446 firmed, the \mathcal{H}_0 hypothesis. If a fault causes a known change in the residuals
 447 a classical cumulative sum (CUSUM) test, [Basseville and Nikiforov \(1993\)](#), is
 448 a simple and efficient means for hypothesis testing. For the further analysis,
 449 let the *discrete-time* equivalents to the residuals Eqs. 19 - 22 be the sampled
 450 versions of $r_i(t)$. With sampling time T_s , these are denoted $r(kT_s)$ or $r(k)$, for
 451 brevity.

452 With strong detectability of faults in residuals, change from normal \mathcal{H}_0 to
 453 not-normal \mathcal{H}_1 , is seen as a change in mean from $\boldsymbol{\mu}_0$ to $\boldsymbol{\mu}_1$ for the i^{th} residual,

$$\mathcal{H}_0 : \mathbf{r}(k) = \boldsymbol{\mu}_0 + \mathbf{w}(k) \quad (25)$$

$$\mathcal{H}_1 : \mathbf{r}(k) = \boldsymbol{\mu}_1 + \mathbf{w}(k). \quad (26)$$

454 A recursive form of the CUSUM test for each of the i components of the residual
 455 vector, the *scalar test* case, gives the test statistics,

$$g_i(k) = \frac{\Delta\mu_i}{\sigma_i^2} \max\left(0, g_i(k-1) + r_i(k) - \mu_{0i} - \frac{\Delta\mu_i}{2}\right), \quad (27)$$

456 where μ_{0i} and σ_i^2 are the mean and variance, respectively, and $\Delta\mu_i = \mu_{1i} - \mu_{0i}$
 457 is the change of the mean of the Gaussian sequence to be detected. When the
 458 decision function $g_i(k)$ exceeds a threshold h , \mathcal{H}_1 is assumed and an alarm is
 459 triggered.

460 A very useful measure for design of a CUSUM test is the average run length
 461 (ARL), see [Basseville and Nikiforov \(1993\)](#). The ARL tells two essential things.
 462 First, under \mathcal{H}_0 (no fault), how long is the average time until the test statistics
 463 $g(k)$ exceeds a threshold h . This is the mean time between false alarms. Second,
 464 under \mathcal{H}_1 (fault is present), which is the average time until $g(k)$ exceeds h . This
 465 is the average time to detect. The important parameters in the ARL test are
 466 the change magnitude of the test statistics divided by its' standard deviation
 467 $\frac{\mu_s}{\sigma_s}$, and the threshold h for the test. Filtering of the residual will impact the
 468 variance of the test statistics. Therefore filtering is used as a means to make
 469 CUSUM tests more sensitive. Fig. 2 shows the calculated time to detect and
 470 time between false alarms for the residual r_5^f , using the test statistic Eq. 27. To
 471 design the detector, the filter cut-off frequencies were set to $\omega_c = 1.6, 2.0$ and
 472 2.4 rad/s in the theoretical calculation. The variance on residuals was measured
 473 under nominal conditions of wave load and sensor noise by running a simulation
 474 of a vessel, and subsequently by running model tests under the same conditions.
 475 The simulation and experiment setup are described in Section 6.

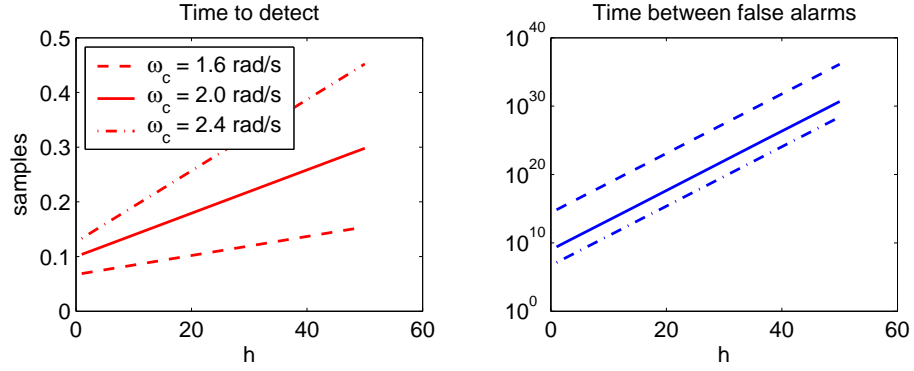


Figure 2: Time to detect and time between false alarm according to the ARL for r_5^f as function of threshold h if a second order low-pass filter $H(s)$ is used with two co-located eigenvalues at $s = j\omega_c$. Time to detect will be one sample in all cases within the range of the nondimensional threshold, h plotted along the abscissa axis.

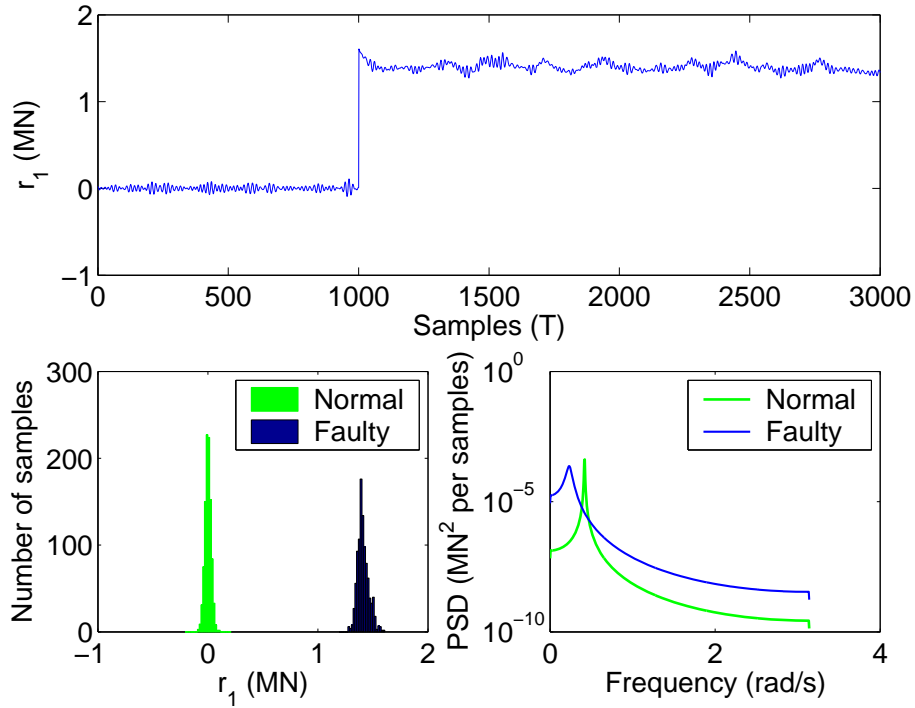


Figure 3: Residual r_1 and its histogram and power spectrum.

476 Fig. 3 shows the time history of r_1 and its histogram and power spectrum
 477 when a line break occurs in mooring line 1. It was observed that the distributions
 478 of r_1 in faultless and in faulty conditions can be assumed to be Gaussian with
 479 different means and the same variance.

480 4.7. Active isolation

481 Once a fault is isolated, the system has to handle the fault with appropriate
 482 control actions. Since thruster faults could only be detected, and such fault
 483 could only be isolated to the group of thrusters, other means are needed to
 484 isolate a faulty thruster and accommodate for the fault in the control system.

485 The concept of *active fault isolation* can obtain this. To exemplify the con-
 486 cept, consider thruster faults, that can only be groupwise isolated. If a fault is
 487 isolated to be within either of the thrusters, but a specific thruster cannot be
 488 identified as faulty, small dedicated test signals are added to thruster setpoint.
 489 When possible, such perturbations are chosen such that the resulting thrust
 490 would be in the nullspace of the thruster configuration matrix \mathbf{A}_{bt} . With this
 491 choice of perturbation, the resulting motion would be zero if all thrusters were
 492 fault-free. A small vessel motion will be the result when one of the thrusters has
 493 a defect, i.e. thrust produced differs from thrust demanded. This vessel motion
 494 will be correlated with the perturbation signals. Simultaneously, elements in
 495 the residual vector will have a variation that is correlated with the perturba-
 496 tion signals. In order that active fault isolation can be achieved, the behaviour
 497 of input to output and input to residuals propagation of signals need to have
 498 certain properties, that can be described through structural properties.

499 A generic approach to analyse the possibility of active isolation, in a struc-
 500 tural domain setting, was treated in [Blanke and Staroswiecki \(2006\)](#), and specific
 501 algorithms were provided in [Gelso and Blanke \(2009\)](#). The main idea is that
 502 in order to be structurally isolable, at least two different paths should exist in
 503 the structure graph from input to output or to residuals, in which a violated
 504 constraint participate in one path but not in the other. The input-output or
 505 input-residual behaviour will then be normal for the second path but not for
 506 the first.

507 Figure 1 shows that alternating paths: $u_i - a_i - F_i - c_5$ for $i = \{1, \dots, N_t\}$,
 508 and $u_i - a_i - F_i - c_5 - T_j - m_{8+j} - T_{m,j}$ for $i = \{1, \dots, N_t\}$ and $j = \{1, \dots, N_m\}$
 509 will give such paths.

510 The test signal applied can be a short harmonic sequence, long enough to
 511 enable certain discrimination from wave and wind disturbances in the signals.

512 Active isolation for linear systems was treated in [Niemann \(2006\)](#), who in-
 513 troduced a \mathcal{H}_∞ setup for generic design and [Poulsen and Niemann \(2008\)](#), who
 514 analysed a CUSUM detection scheme in relation to active diagnosis.

515 5. Controller design

516 As described above, control actions could be fault accommodation or control
 517 reconfiguration. Before addressing the fault accommodation for mooring line
 518 faults, controller design in faultless conditions is first reviewed.

519 *5.1. Controller design in faultless conditions*

520 Active control is performed by the thrusters of the vessel. The primary
 521 objective of a positioning control system is to keep the vessel in a fixed position,
 522 \mathbf{p}_d , and heading angle, ψ_d . In case of a PM system, the secondary objective
 523 is to keep the line tensions within a limited range to prevent line break. The
 524 second objective is usually achieved by the criterion that the distance between
 525 the desired position of the vessel and the field zero point, \mathbf{p}_0 , is less than a
 526 critical value. The objectives are given as,

$$O : \begin{cases} |\psi - \psi_d| < \psi_w, \\ |\mathbf{p} - \mathbf{p}_d| < p_w, \\ |\mathbf{p}_d - \mathbf{p}_0| < p_{\text{crit}}. \end{cases} \quad (28)$$

527 For PM system, the following definitions are made for convenience. A field
 528 zero point is defined as the position of the moored vessel where there is no
 529 environmental load acting on the vessel. An equilibrium position is defined
 530 as the position where the mean environmental loads acting on the vessel are
 531 balanced by the mooring forces.

532 The surge and sway control and heading control are usually done by an
 533 output-PID control law, according to

$$\begin{aligned} \boldsymbol{\tau}^{xy} &= -\mathbf{K}_p^{xy} \mathbf{R}_{nb}(\psi) \tilde{\mathbf{p}} - \mathbf{K}_i^{xy} \mathbf{R}_{bn}(\psi) \int_0^t \tilde{\mathbf{p}} dt \\ &\quad - \mathbf{K}_d^{xy} \tilde{\boldsymbol{\nu}}, \end{aligned} \quad (29)$$

$$\tau_c^\psi = -K_p^\psi \tilde{\psi} - K_i^\psi \int_0^t \tilde{\psi} dt - K_d^\psi \dot{\tilde{\psi}}, \quad (30)$$

534 where $\tilde{\mathbf{p}} = \hat{\mathbf{p}} - \mathbf{p}_d$; $\tilde{\boldsymbol{\nu}} = \hat{\boldsymbol{\nu}} - \boldsymbol{\nu}_d$; \mathbf{K}_p^{xy} , \mathbf{K}_i^{xy} , and \mathbf{K}_d^{xy} are the non-negative P,
 535 I, and D controller gain matrices; $\tilde{\psi} = \hat{\psi} - \psi_d$; $\dot{\tilde{\psi}} = \dot{\hat{\psi}} - r_d$; ψ_d and r_d are the
 536 desired heading and yaw rate, respectively; and K_p^ψ , K_i^ψ , and K_d^ψ are the non-
 537 negative P, I, and D controller gains. The states with the hat ($\hat{\cdot}$) are estimations
 538 from an observer, not discussed in this paper, which is used to filter the wave-
 539 induced motion and estimate velocity from the measured position. More details
 540 on design for positioning control can be found in [Sørensen et al. \(1996\)](#) and for
 541 position mooring control and observer design in [Nguyen and Sørensen \(2009a\)](#).

542 *5.2. Control architecture to obtain fault-tolerant Position-mooring*

543 A fault-tolerant control architecture for the PM system requires a control
 544 architecture that is implemented as shown in Fig. 4. In the Figure, solid purple
 545 lines indicate signals used in the closed loop control. Solid red lines show signals
 546 that are sent to residual generator and evaluation in the change detection func-
 547 tion block. Signals on solid lines are transmitted with the sampling frequency
 548 of the control system. Dashed lines indicate signals that are event driven, i.e
 549 are sent when a fault is evaluated and a change needs to be made in either of
 550 the function blocks that execute the real time control. The function blocks are:

551 **Controller** Input: position, heading, setpoints for position and heading, es-
552 timated velocities and turn rate. Calculates desired thrust and moment
553 vectors and makes thruster allocation. Output: thrust commands.

554 Thrust allocation Comprises and updated thrust configuration matrix for the
555 vessel and calculates the thrust demand from individual thrusters to ob-
556 tain the desired \mathbf{X} , \mathbf{Y} forces and yaw moment \mathbf{N} [Fossen and Johansen](#)
557 (2013). The thrust configuration matrix reflects which thrusters are de-
558 clared healthy by the hypothesis test function.

559 **Observer** Estimates velocities and turn rate. Filters first order wave effects
560 from signals to controller. Observer instance will change according to
561 which signals are declared healthy.

562 **Sensors select** Selects the set of healthy sensor signals that are passed on to
563 the relevant observer.

564 **Setpoint generator** Calculates the desired position \mathbf{p}_d . Position reference can
565 be changed if breakage of mooring lines is at risk.

566 **Residual generator** Calculates residual vector. The generation of residuals
567 changes when the set of healthy components / signals change.

568 **Change detector** Performs a hypothesis test about which components and
569 signals can be considered healthy.

570 **FTC supervisor** This function block keeps an account of the state of sensors
571 and actuators, and of system parameters. It comprises computational log-
572 ics and algorithms to determine which remedial actions are need to handle
573 specific defects in the system. It signals an abstract system description
574 to the remedial actions block, which implements the necessary actions in
575 lower level software. In short, it assesses which components are healthy.
576 Using this information, it ensures that only actuators, other components
577 and signals are used that have been declared healthy. It avoids control
578 schemes that use components or signals for which failure / faults would
579 not be detectable.

580 **Remedial actions function block** Fault handling is performed. Mooring line
581 failure typically by change of setpoint [Fang and Blanke \(2011\)](#); Thruster
582 failure or glitch is typically handled in the thrust allocation calculation;
583 Sensor faults are typically handled by estimating missing signals.

584 The generic architecture shown in Figure 4 is commonly applied for marine
585 systems fault-tolerant sensor fusion and fault-tolerant control. Virtual
586 Sensor or Virtual Actuator approaches could be alternatives to sensor
587 and actuator fault handling when the required assumptions for the virtual
588 approach holds [Richter et al. \(2011\)](#), [Seron et al. \(2013\)](#).

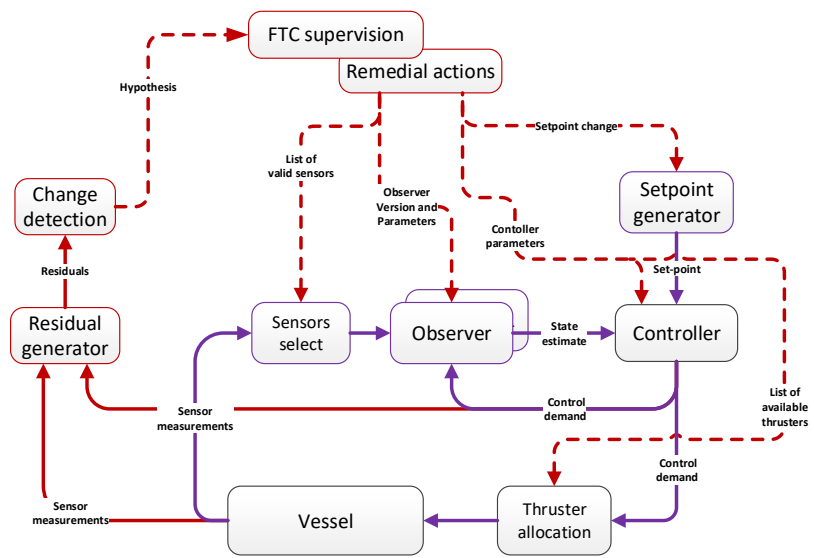


Figure 4: Control diagram of fault-tolerant positioning mooring control.

589 *5.3. Faults in mooring lines*

590 We assume that in faultless conditions the thruster assistance only keeps the
 591 vessel's heading and adds damping in surge and sway, according to,

$$\tau^{xy} = -\mathbf{K}_d^{xy} \tilde{\mathbf{v}}, \quad (31)$$

$$\tau_c^\psi = -K_p^\psi \tilde{\psi} - K_i^\psi \int_0^t \tilde{\psi} dt - K_d^\psi \dot{\tilde{\psi}}, \quad (32)$$

592 When faults as line breakage or wrong pretension occur in a mooring line,
 593 the vessel will have another equilibrium position, and a minimum risk \mathbf{p}_d can be
 594 calculated, see Fang et al. (2015). If the vessel's drift is small, the controller in
 595 Eqs. (31)–(32) should be redesigned with the updated plant by considering the
 596 updated mooring loads in the vessel's dynamics in Eq. (4). If the vessel's drift
 597 is large, the vessel needs to be kept in the position as in the faultless conditions.
 598 Necessary control forces may be obtained by calculating adequate feed forward
 599 during transient conditions following diagnosis of a mooring line breakage.

600 *5.4. Faults in sensors and sensor systems*

601 Physical faults in sensors and in inertial measurement units include fluctua-
 602 tion / jumps in signals, slow drift, bias, frozen signal or temporal unavailability.
 603 A jump in a measurement signal is rather easy to detect whereas incipient
 604 faults are more difficult. A strain gauge which is used to measure the tension in
 605 a mooring line often experiences a permanent drift after some time in service.
 606 Positioning devices may experience jumps and random drift for various reasons.
 607 For GNSS (global navigation satellite system) receivers when clock updates are
 608 made to satellites and when satellites in view change. Hydrophone position
 609 readings are influenced by temperature and salinity profiles in the water. Inertial
 610 measurement units suffer from time-varying bias in accelerometer and turn
 611 rate readings.

612 With the control system using the measurements for real time feedback, con-
 613 sequences of sensor faults can be serious. Therefore, the safe reaction to a device
 614 being declared faulty by the change detection is to disable the device suspected
 615 to be faulty. If there is physical redundancy of the devices, healthy devices are
 616 used instead. Without physical redundancy, the model based observer estimates
 617 the missing measurements.

618 *5.5. Faults in thrusters*

619 Faults in thrusters usually include temporal loss of power, failure to zero,
 620 failure to full, shaft speed freeze or reduced thrust generation due to sea weed.
 621 An azimuth thruster may experience fixed angle or loss of hydraulic pressure
 622 causing frozen azimuth or slow rotation.

623 If a thruster fails to follow a commanded thrust, it must be disabled and
 624 thrust allocation must be redesigned for the healthy thrusters. If an azimuth
 625 thruster fails to stay at the desired angle, the thrust allocation is redesigned

626 with the consideration of this fixed angle. Such fault tolerant control actions
627 are part of the system reconfiguration.

628 The advantage of the approach we use is that we do not need to specify
629 the physical nature of particular faults. The methodology detects deviation
630 of normal behaviour of components. Therefore, the remedial action will be
631 to disregard a faulty component from a control solution when doing the re-
632 configuration needed to handle a failure.

633 *5.6. Role of single input-output sanity check*

634 In any automated system, the first row of defence against failures is always
635 sanity check of input and output signals. The standard approaches include to
636 have supervised input-output to protect against cable failures, to have double
637 supervised digital switches signalling safety related binary information, to have
638 watchdog software supervising that local area network transmission of signals
639 is alive, etc. These sanity check types of supervision of single input-output are
640 well documented in standards to meet functional safety requirements, which are
641 prerequisites to obtain equipment approval by classification societies. Common
642 source failures, i.e. loss of power to sensors and or actuators, are detected by
643 similar means. Absence of live signal feedback from sensors are hence always
644 detected as failures in automated systems. The treatment in this paper deals
645 with the more subtle failures, where analytical redundancy checks are needed
646 to isolate the faulty component(s).

647 **6. Validation**

648 *6.1. Overviews*

649 An FTC structure for positioning control systems is proposed in Fig. 4. All
650 the signals from sensors and measurement units are checked before entering the
651 fault detection block. If a fault is detected, the supervisor will take appropriate
652 actions in sensors and measurement units, controlled plant or reallocation of
653 thrusters to handle this fault.

654 The purpose of this Section is to validate the FTC designs by comparing
655 the performances of the vessel with and without FTC when faults occur. Both
656 simulations and experiments are used for validation. The simulation was carried
657 out with a turret moored FPSO operating in 380-meter depth at Norwegian
658 Sea. The FPSO has a mass, $m = 166 \times 10^3$ tons, length, $L = 271$ m, breadth,
659 $B = 41$ m and draft, $D = 15.5$ m. The turret mooring system consists of twelve
660 lines ($N_m = 12$, see Fig. 6) each of which has three segments. The parameters
661 of the mooring lines are presented in Table 10. The simulations was carried out
662 using the Marine System Simulator (MSS) developed in NTNU.

663 The experiments were carried out using the model vessel, Cybership III
664 (Fig. 7), which is a 1 : 120 scale model of the FPSO of the simulation, having
665 a mass, $m = 75$ kg, length, $L = 2.27$ m, and breadth, $B = 0.4$ m. The turret
666 mooring system consists of four lines (Fig. 6). The vessel is equipped with two
667 main azimuth propellers, one tunnel thruster and one front azimuth thruster.

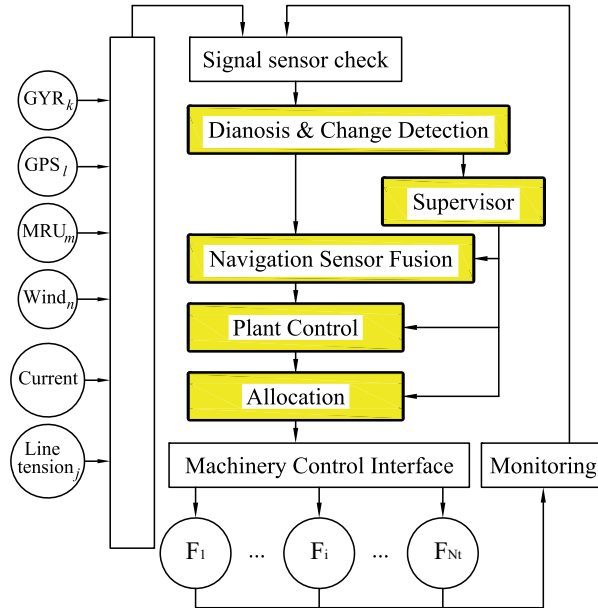


Figure 5: Structure of fault-tolerant control software for positioning control.

668 The internal hardware architecture is controlled by an onboard computer which
 669 can communicate with an onshore PC through a WLAN. An onshore 4-camera
 670 measurement system provides Earth-fixed position and heading. A wave maker
 671 system was used to simulate JONSWAP-distributed waves. The experiments
 672 were performed in the Marine Cybernetics Laboratory (MCLab) at NTNU. The
 673 experimental results presented are converted into full scale. In the experiments,
 674 a pulley system was used to simulate the effects of mean loads due to wind and
 675 current, as illustrated in Fig. 7.

676 In the simulations and experiments, the environmental load direction was
 677 collinear and 15° relatively to the bow of the vessel (Fig. 6). The simulation
 678 and experiment were performed with a significant wave height, $H_s = 10\text{m}$,
 679 wave period, $T_p = 14.18\text{s}$ (JONSWAP distributed wave), wind velocity, $v_{10} =$
 680 22.41m/s , and current velocity, $v_c = 0.5\text{m/s}$.

681 The following subsections will present the simulation and experimental re-
 682 sults for the cases of real faults. We considered the single fault scenarios with
 683 step and slowly-varying additive faults, i.e. a mooring line break and a mea-
 684 surement drift in a position measurement unit, and with failure to zero fault in
 685 a thruster. A multi fault scenario was also considered with two simultaneous
 686 faults, one which is a wrong pretension in a mooring line and another, occurring
 687 later, is a jump in GPS position measurement.

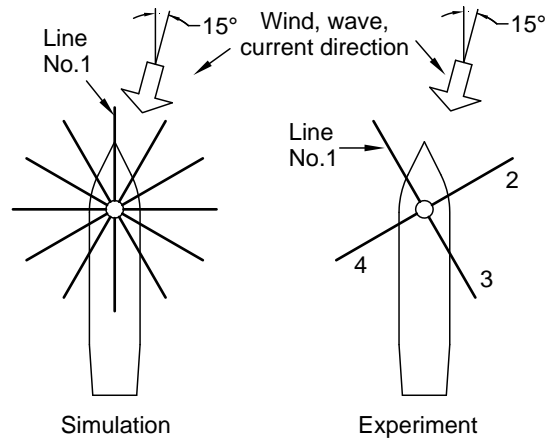


Figure 6: Mooring systems and direction of environmental loads.



(a) CS3



(b) Loads

Figure 7: The Cybership III (left) and the pulley system to simulate mean wind and current loads (right).

Table 10: Parameters of the mooring lines.

	Segment 1 (near turret)	Segment 2	Segment 3
E modulus (10^8N/m^2)	838.5	1126	979.7
Unstretched length, $L(\text{m})$	1060	380	80
Diameter, $D(\text{m})$	0.137	0.121	0.114
Cable density, $\rho_c(\text{kg/m})$	1178	1265	1178
Added mass coef., C_{mn}	1.5	1.5	1.5
Normal drag coef., C_{dn}	2.5	2.5	2.5

688 6.2. Line breakage

689 The vessel was first operated with a faultless mooring system and then with
690 a line breakage occurring in the mooring line 1 (Fig. 6). We will, in this
691 subsection, show only the experimental results since the simulation results are
692 similar.

693 Fig. 8 shows North-East position of the vessel and parity relation r_1 with
694 the corresponding fault detection signal. The figure shows that when line 1
695 broke, the mean of the residual r_1 changed. When the fault occurred, the drift-
696 off of the vessel without FTC was to the South causing large tensions in the
697 mooring lines 2 and 4 (Fig. 9). We observe that the vessel with FTC performed
698 similarly to the faultless scenario meaning that the vessel's drift was reduced
699 and the tensions in mooring lines were maintained within a normal range (Figs.
700 8 and 9). The FTC in this experiments is mooring line fault accommodation
701 presented in Section 5.3.

702 6.3. Wrong pretension and position measurement jump

703 This subsection will show the experimental results for two simultaneous
704 faults. The vessel was first operated in faultless conditions. After a while line 1
705 was loosened to simulate a wrong pretention and then a sudden jump in position
706 measurement for a short duration of time. Figures 10 and 11 show the vessel's
707 position and the tensions in mooring lines with and without FTC. The results
708 show that the effect of FTC for wrong pretension was similar to that for line
709 breakage. The effect of the subsequent jump in position measurement would
710 be further drift of the vessel in addition to the drift due to loosening in line 1,
711 when there was no FTC. The FTC handled the jump in position measurement
712 by reconfiguring the control system such that the position prediction from
713 the observer replaced the faulty measurement. Consequently, the vessel was
714 still kept in the position and the tensions of the mooring lines were in a normal
715 range.

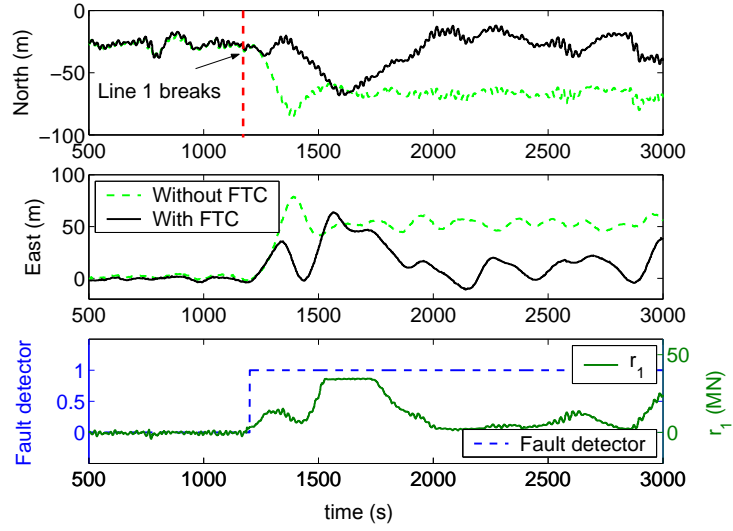


Figure 8: North-East position of the vessel and parity relation r_1 and fault detection signal.

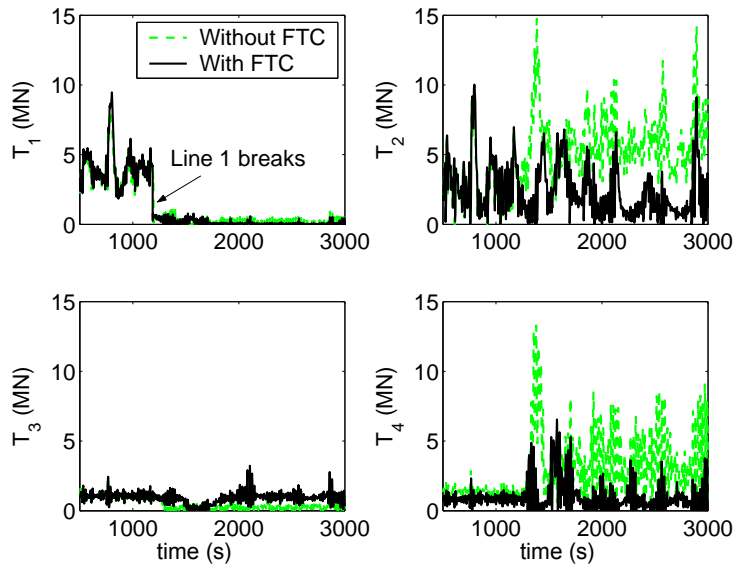


Figure 9: Tensions of mooring lines.

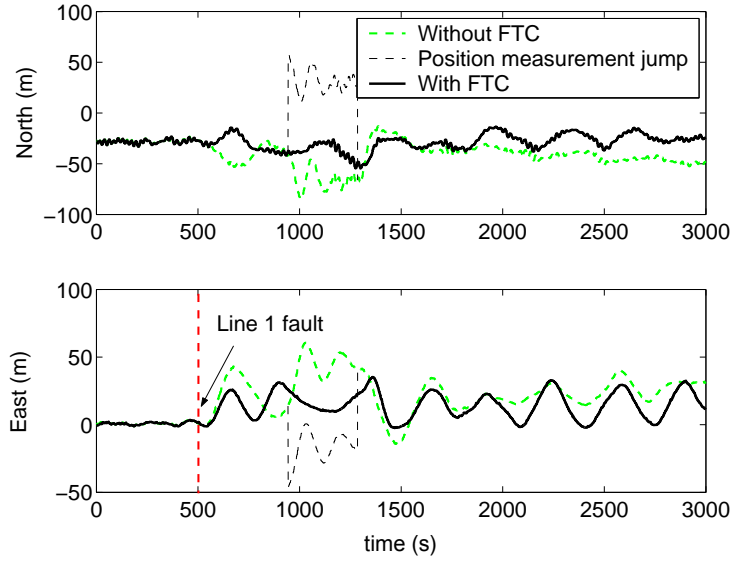


Figure 10: Vessel's position of vessel subjected to wrong pretension and later a jump in position measurement.

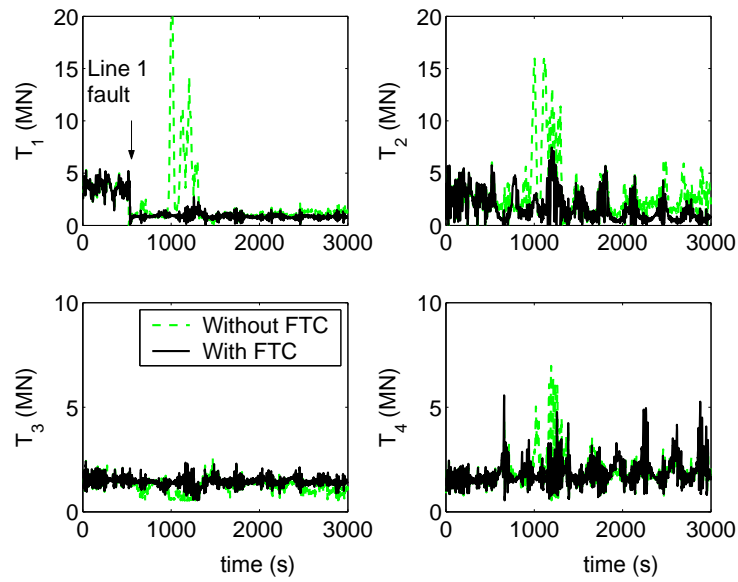


Figure 11: Tensions subjected to wrong pretension and later a jump in position measurement.

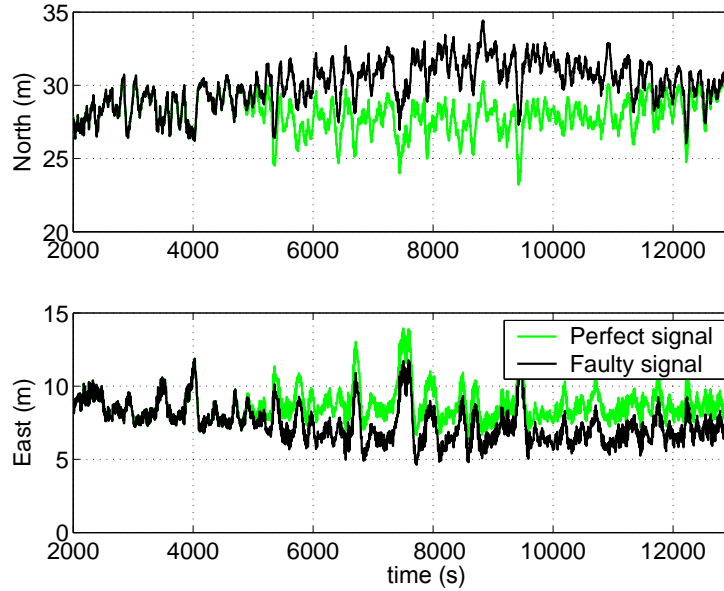


Figure 12: Perfect and faulty signals of GPS receiver 1.

716 *6.4. Slow drift in position measurement*

717 Firstly, we performed an experiment with two GNSS (GPS) receivers which
 718 were fixed on the ground by recording the measurements from the two receivers.
 719 With receivers' positions known, we can calculate the deviations in the mea-
 720 surement data. Secondly, these deviations after properly scaled were used as
 721 perturbations to the perfect signals of two virtual GPS receivers on the Cyber-
 722 ship III performing a DP operation with AUT class. The perfect signals of the
 723 virtual GPS receivers were calculated from the vessel position obtained by the
 724 four-camera system (see Section 6.1) and the virtual locations of the receivers
 725 on the vessel. The vessel was first operated in the condition of perfect position
 726 measurements. After a while, the measured position for feedback was the per-
 727 fect position perturbed by the deviations from the real GPS receivers. Figs. 12
 728 and 13 show the perfect and faulty position measurements of the two virtual
 729 GPS receivers on the vessel without FTC. It is observed that the quality of the
 730 GPS receiver 2 was better than that of the receiver 1.

731 Fig. 14 shows the position of the vessel with and without FTC. We observe
 732 that the vessel's drift without FTC was approximately 1m to South and 1m to
 733 East while that with FTC was almost unnoticeable. This is explained by the fact
 734 that the FTC detected slow drift in the signal from the receiver 1; consequently
 735 FTC disabled the GPS receiver 1 and used the receiver 2 for feedback.

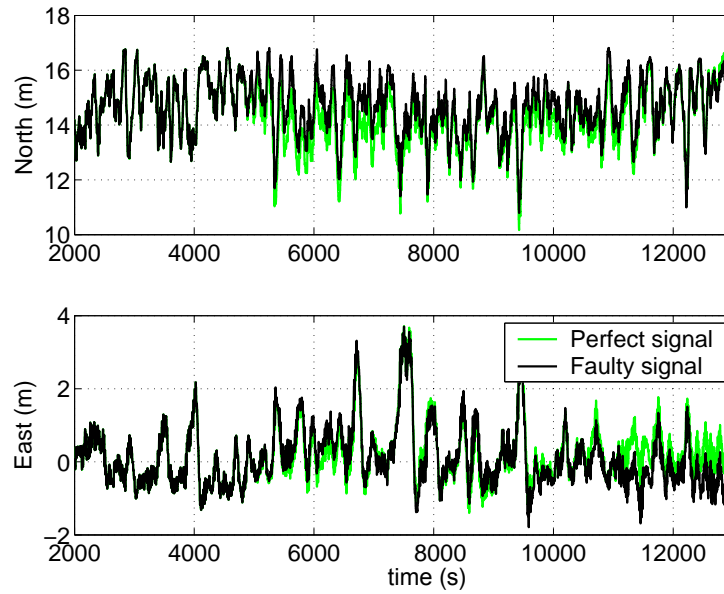


Figure 13: Perfect and faulty signals of GPS receiver 2.

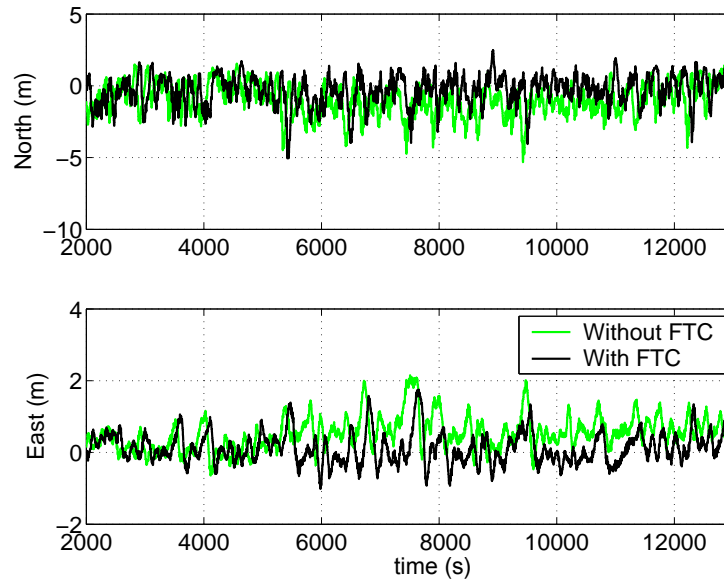


Figure 14: Vessel's position when the signals from GPS receivers is subjected to slowly-varying additive faults.

Table 11: Active isolation dependency matrix.

	T_{m_1}	T_{m_2}	T_{m_3}	T_{m_4}
u_1	x_{11}	x_{12}	x_{13}	x_{14}
u_2	x_{21}	x_{22}	x_{23}	x_{24}
u_3	x_{31}	x_{32}	x_{33}	x_{34}
u_4	x_{41}	x_{42}	x_{43}	x_{44}

736 6.5. Thruster failures

737 From the structural analysis with the assumption of disregarding fault detector
738 signal from the thruster, faults in thrusters are only structurally detectable
739 and not structurally isolable. The active isolation can be used to deal with these
740 detectable faults. In this technique, we will perturb the system with a sinusoidal
741 signal from a thruster. From the structure graph (Fig. 1), we know that tensions
742 in all mooring lines will be affected if a perturbation signal is added to a
743 normal thrust demanded by the positioning control system. The amplitudes of
744 the tension responses at the frequency of the sinusoidal perturbations are estimated
745 for faultless conditions in advance. If the online estimations are not as
746 those in faultless conditions, the fault can be isolated based on a so-called *active*
747 *isolation dependency matrix* Blanke and Staroswiecki (2006), which structurally
748 maps the thrust inputs, u_i , to the tension outputs, T_{m_j} . Such matrix for a PM
749 vessel with four mooring lines and four thrusters are shown in Table 11. The
750 element of this matrix is x_{ij} which reads $x_{ij} = 0$ if an online estimation of a
751 tension is similar to that in faultless conditions and reads $x_{ij} = 1$ if not. If a
752 row of the matrix is one then the corresponding thruster is faulty. If a column
753 of the matrix is one then the corresponding tension measurement unit is faulty.

754 Simulations with a ‘failure to zero’ in thruster 1 is shown to validate the
755 active isolation and to demonstrate the thrust reallocation. There are three
756 cases in the simulations, a healthy and two faulty cases. The simulations and
757 model tests include cases with and without active isolation. The active isolation
758 was activated when a fault was detected but could not be isolated by the passive
759 diagnosis approach. The perturbations used for active diagnosis are here
760 sinusoidal signals. The dependency matrix was determined (see Table 12). The
761 active isolation dependency matrix shows that the fault was in thruster 1.

762 Figs. 15 and 16 show the vessel’s position and mooring line tensions in
763 no-fault condition and then in ‘failure to zero’ fault in thruster 1. For the
764 faulty condition cases, it was observed that the performance of the system with
765 FTC was not improved right after the occurrence of the fault compared to that
766 without FTC. This is due to the fact that the active isolation took some time to
767 actively diagnose the fault in thruster 1. Once the fault was isolated, the FTC
768 switched to the allocation with three thrusters. Consequently, the performance
769 of the PM vessel was back to normal in terms of position and tensions.

Table 12: Active isolation dependency matrix for simulation.

	T_{m_1}	T_{m_2}	T_{m_3}	T_{m_4}
u_1	$x_{11} = 1$	$x_{12} = 1$	$x_{13} = 1$	$x_{14} = 1$
u_2	$x_{21} = 0$	$x_{22} = 0$	$x_{23} = 0$	$x_{24} = 0$
u_3	$x_{31} = 0$	$x_{32} = 0$	$x_{33} = 0$	$x_{34} = 0$
u_4	$x_{41} = 0$	$x_{42} = 0$	$x_{43} = 0$	$x_{44} = 0$

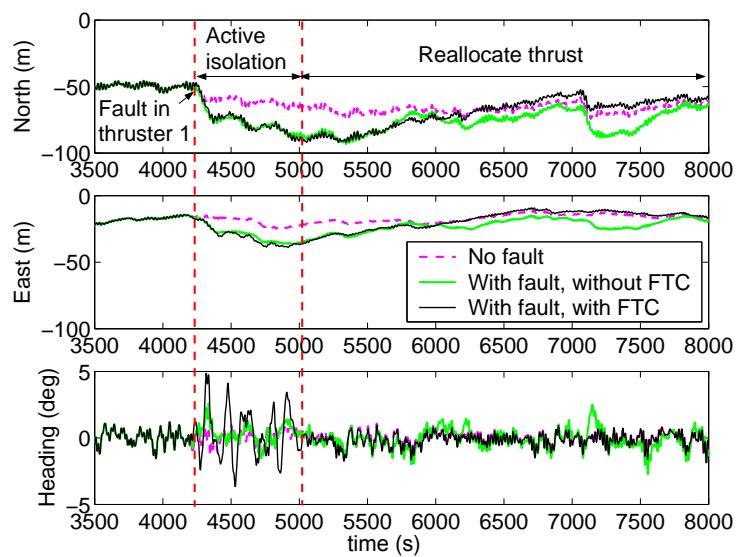


Figure 15: Vessel's position subjected to failure to zero fault in thruster 1.

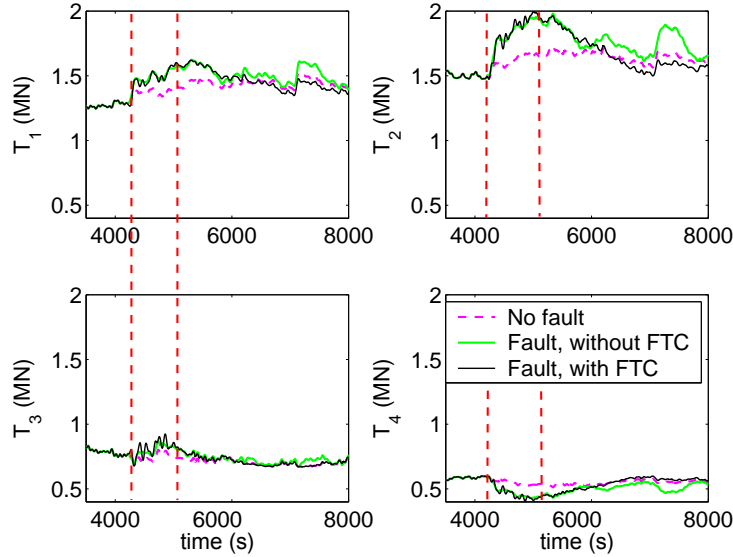


Figure 16: Mooring line tensions subjected to failure to zero fault in thruster 1.

770 **7. Concluding remarks**

771 This paper addressed fault-tolerant control for positioning control systems
 772 of vessels in general and Position-moored vessels in particular. A methodology
 773 was presented that allowed assessment of safe Position-mooring control under
 774 single and multiple faults. Fault diagnosis was designed through structure graph
 775 analysis of a model of a vessel expressing overall normal behaviours. Analysis of
 776 residuals showed that several faults, including mooring line breakage or mooring
 777 line tension sensor failure, were only detectable, whereas isolation is required to
 778 make the control system take the correct remedial actions to faults.

779 Active isolation of faults was introduced to alleviate this problem. Statistic
 780 al change detection was applied to determine when a fault had happened. Time to
 781 detect and time between false alarm were used as design criteria for change
 782 detection design in the presence of significant wave disturbances in the
 783 signals. Fault accommodation and system reconfiguration methods were developed
 784 for the different types of faults and control actions to handle faults were
 785 demonstrated by model basin tests for selected faults with high severity.

786 Simulations and experiments were carried and multiple faults in mooring
 787 lines, position measurement units and thrusters, and showed that FTC could
 788 improve the performance and increase the safety of the vessel in the faulty
 789 conditions.

790 The topic presented in this paper is essential for the design of autonomous
 791 vessels since the principles presented are fundamental to achieve fault-tolerant
 792 behaviours. Analysis of overall safety and analysis of risk related to such designs

793 will be interesting topics of further research.

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