

1 Word count: 7721

2 **Optimization of Tugboat Propulsion System Configurations: A Holistic** 3 **Life Cycle Assessment Case Study**

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11 **ABSTRACT**

12 The International Maritime Organization has initialized a strategy to reduce 30% and 50% of
13 carbon dioxide emissions from marine activities by 2030 and 2050 respectively. It is extremely
14 challenging to achieve but innovative cleaner technologies are under research and development
15 to help control and reduce maritime carbon emission. One fact is that the usage of tugboats has
16 been increasing in recent years as huge demands of marine offshore activities (construction,
17 installation and maintenance of renewable islands and wind farms); therefore, the performance
18 of tugboats should be well-evaluated which could be a valuable contribution to maritime
19 emission reduction. This paper focuses on investigating a tugboat's life cycle performance,
20 specifically comparing different configurations of the propulsion system and selecting an
21 optimal system with the lowest emissions release, costs and hazard impacts. A case study was
22 carried out comparing five different engine configurations with the help of commercial and in-
23 house developed life cycle assessment software in order to comprehensively evaluate the ship
24 performance. Three main life phases, three evaluation flows, four emission categories and three
25 criteria, were under consideration in this study. The results indicate LCA method and the in-
26 house software could help to compare and determine optimal configurations and the engine
27 configuration with three medium size engines is the optimal one which generated lowest
28 emissions equivalent to 15.5 million euros, invested 14.2 million euros and occur a risk impact
29 equivalent to 1.01 million euros. This paper not only provides a case study for the tugboat
30 configuration assessment but also recommends LCA methodology as a general evaluation
31 method for emission reduction technologies who have to meet the extreme requirements of
32 emission control in the next few decades.

33 **KEYWORDS:**

34 Emissions control; Life Cycle Assessment; tugboat performance; propulsion system
35 configuration.

ABBREVIATIONS

AP	Acidification potential
B	Breadth
C	Consequence
CAPEX	Capital expenditure
CML	Institute of Environmental Sciences
CO	Carbon monoxide
CO ₂	Carbon dioxide
COD	Chemical oxygen demand
CH ₄	Methane
€	Euro
EP	Eutrophication potential
eq.	Equivalent
F	Frequency
FSA	Formal Safety Assessment
GE	Generator engine
GHG	Greenhouse gases
GWP	Global warming potential
HCL	Hydrochloric acid
IPCC	Intergovernmental Panel on Climate Change
ISO	International Organization for Standardization
kg	kilogram
kW	kilo-watt
kWh	kilo-watt hour
LCA	Life cycle assessment
LCCA	Life cycle cost assessment
LCI	Life cycle inventory
LCIA	Life cycle impact analysis
LOA	Length overall
M	Mitigation
ME	Main engines
M _i	i th machinery
NH ₃	Ammonia
NO _x	Nitrogen oxides emission
NSGA-II	Non-dominated sorting genetic algorithm II
OPEX	Operational expenditure
PO ₄ ³⁻	Phosphate
RA	Risk assessment
RPN	Risk priority number
SHIPLYS	Ship Life Cycle Software Solutions
SOGA	Single-objective genetic algorithm
SO _x	Sulphur oxides emission

1. INTRODUCTION

39 For quite some time, environmental protection has attracted the attention of researchers and
40 scientist due to the severity of environmental impacts that have greatly increased in recent
41 years. One of the impact is the global warming effect which is mainly caused by CO₂ from the
42 consumption of fossil fuels. In addition to CO₂, acid gases has drawn the attention from
43 scientists, such as SO_x and NO_x which will lead to acid rains after released into the atmosphere.
44 All these pollutions are a result of burning fossil fuels; therefore, the control and reduction of
45 emissions from human activities is one of the most interesting topics all over the world.

46 Emissions from international shipping is expected to grow between 50% and 250% by 2050
47 due to the growth of world maritime activities (Smith et al., 2015). The IMO has set up a goal
48 by 2050 to reduce the total annual greenhouse gases from international shipping by at least
49 50% (IMO, 2018a). There are many solutions proposed or tested to meet these demands, such
50 as alternative fuels, hybrid systems and route optimisations. These all are aimed to increase
51 energy efficiency and reduce the emissions generated and released: the selection of alternative
52 fuels with a reduced content of sulphur will generate a smaller amount of SO_x; similarly, the
53 usage of liquefied natural gas will help reduce emissions too, such as NO_x, SO_x and CO₂; some
54 researchers intend to apply bio-fuel on board which is able to reduce the carbon emissions as
55 the fuel is generated from the plants who are continuously absorbing CO₂ from the atmosphere;
56 the hybrid system is another way to mitigate air pollution, as it combines the use of batteries
57 with the conventional system and the batteries can be re-charged by using renewable energy or
58 power from the power plant (bulk energy provider) whose emission will be much lower than
59 traditional on-board power systems; with the increasing in forecasting technologies and
60 databases, the sea conditions of vessel route (wind, wave, tidal) can be predicted and the
61 optimal route with lowest fuel consumption but an acceptable schedule can be determined. All
62 these technologies have been developed and will help mitigate the current global warming trend
63 and acidification situations. However, there are only a few discussions or research work carried
64 out on the ship propulsion power management from the perspective of emissions control and
65 environmental protection. As a growing offshore activities due to the applications of renewable
66 islands and wind farms, the demands of tugboats are increasing rapidly recently but there are
67 only a few studies on enhancing the tugboat performance. Therefore, this paper will focus on
68 a tugboat power output management to find out the optimal engine configurations and engine
69 output according to the power demand of the vessel. The optimal configurations will enable
70 the engine to be operated under the most effective loads with the lowest fuel consumption and
71 emissions. To expand the analysis and consider the whole life span of a vessel, a life cycle
72 assessment will be carried out to indicate the performance of ship power output management
73 through the vessel's whole service life. With the consideration of ship life span and finding the
74 optimal engine configurations, the emission release from tugboat operation could be quantified
75 and minimized, which will become an indispensable contribution to fulfil the severe emission
76 control requirement of marine industry.

77 2. LITERATURE REVIEW

78 There are many applications of emission control technologies on marine vessels but only a few
79 of them focused on tugboat. Some research worth mentioning which considered the analysis
80 on tugboats activities and their performances are mentioned in this section. In recent work,
81 Yang has conducted a process-based LCI for the first offshore wind power plant in China (Yang
82 et al., 2018) and the materials and equipment supply of the power plant were mainly relied on
83 barges, tugboats, and deck barges. However, although tugboat transportation is a significant
84 way for offshore applications such as wind farms, there is a few research studies about tugboats:

85 Gökalp applied kerosene fuel blended with aspire methyl ester on a tug boat and carried
86 out exergy analysis on the vessel to determine the environmental impacts of this
87 application (Gökalp, 2018). The results indicated that biofuel could help reduce the CO
88 emissions but as a drawback, the NO_x emissions will be higher. Overall, the usage of
89 bio-fuels is a good way to reduce the emissions but his study only focuses on the
90 operation phase and as such lacks of the complete view over the life cycle of the vessel.
91 The economic analysis was also not under consideration which means this is not a
92 comprehensive study.

93 Research has also been conducted (Zhu et al., 2018) on the tug ship equipped with a
94 hybrid system and it considers both the impacts of environment and cost. This was a
95 comparative study in which different optimisation methods were used to determine the
96 optimal operation performance of the hybrid propulsive system (a combination of
97 battery with conventional system) on the tug ship. However, the study shortens the life
98 cycle to construction and operation only and disregards the maintenance and
99 scrapping/dismantling phases of the vessel. The focus of the study was also to prove
100 the excellence of non-dominated sorting genetic algorithm II (NSGA-II) from the
101 single-objective genetic algorithm (SOGA).

102 Additionally, Zhen's team (Zhen et al., 2018) focused their research on the tug ship but
103 only on its scheduling which was optimised barge assignments of the tugboat to
104 minimise the required tugs. The model established was validated by experiments. This
105 work was also a good start to assess the performance of tugboats operation schedule
106 which is aimed to minimize the number of tug vessels involved as well as to reduce the
107 operational costs and related emissions release.

108 Therefore, one main purpose of this paper is to investigate the tugboat from a more
109 comprehensive point of view. A large number of research has been performed using life cycle
110 assessment to help the marine industry select optimal solutions: examination of the economic-
111 environmental effects of two different hull coating methods and three different types of Ballast
112 Water Treatment Systems were carried out from the perspective of life cycle impacts (Blanco-
113 Davis et al., 2014; Blanco-Davis and Zhou, 2014); LCA method was applied to a case study

114 for evaluating the economic-environmental benefits of a hybrid power system on a Ro-Ro
115 vessel (Ling-Chin and Roskilly, 2016a, 2016b) and on marine propulsion systems (Ling-Chin
116 and Roskilly, 2016c); They concluded that LCA was an effective process for proper decision
117 making as it could aid evaluating the holistic impact on the environment, human beings and
118 natural reserves. Another research about application of solar panels on board a short route ferry
119 adopted LCA method, which carried out a performance comparison between the new solar
120 panel application and the original ferry, and indicated the environmental and economic benefits
121 of the application (Wang et al., 2019). Ship retrofitting processes were explored in the LCA
122 aspects by Koch et al. (Koch et al., 2013), specifically focusing on the work load, labour and
123 facility arrangement optimisation in the shipyard. There is also a research study about the steel
124 recycling from ships in Indian shipyard which applied life cycle assessment (Rahman et al.,
125 2016). It covered the evaluation of recycle performance (both energy use and emissions), from
126 transporting from the originating country to dismantling in Chittagong, to the final recyclers in
127 Dhaka. It also discovered most of the environmental damage happened when rerolling the steel.

128 As presented here, recent research focusing on tug vessels gives very good insight into
129 environmental and cost impacts for this type of vessels, but it clearly lacks a full and
130 comprehensive analysis. In Favi's study, they were striving to develop an assessment approach
131 and data framework to evaluate the complex marine vessels based on design information in
132 order to make LCA and LCCA compatible with existing standard (Favi et al., 2018). However,
133 the study was highly depending on the design information and the ship types under
134 considerations are yachts, ferries, cruise ship, merchant ships, fishing vessels and pipe laying
135 vessel. Hence, this paper strives to assess the performance of a tugboat from the perspective of
136 environmental, risk and cost assessment. As the on-board propulsion system configuration is
137 one way to reduce the energy consumption, it will lead to the result in the reduction of
138 emissions from the ship exhaust gas. However, since the lack of evaluation method for marine
139 vessels, their performances are unavoidable underestimated or misevaluated. Life cycle
140 assessment is a comprehensive methodology which considers from the cradle to grave life of a
141 system or product to quantify its impact on the environment. This paper will apply LCA on
142 tugboat to discover the performances of the selected case study ship and compare different
143 engine configurations to determine an optimal one with most desirable performances from the
144 point view of environmental protection, cost saving and risk reduction.

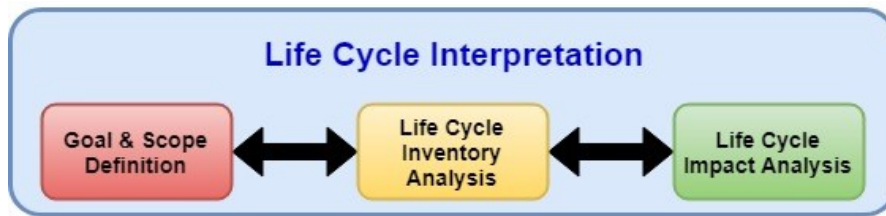
145 There are several commercially available software packages that can be used for life cycle
146 analysis, but at present none of them is specifically developed for the marine/ship building
147 industry, which leads to time consuming, difficult and incomplete life cycle assessments. This
148 paper will also validate the in-house software developed by comparing the results with those
149 from commercial software.

150 **3. METHODOLOGY**

151 The section of methodology will both state the processes of life cycle assessment and the
152 related formula which will support the evaluation of a case ship study.

153 **3.1. LIFE CYCLE ASSESSMENT METHOD**

154 The ISO standards indicate that LCA analysis should fundamentally include four processes:
155 the definition of research/analysis objectives and boundaries, Life Cycle Inventory Analysis
156 (LCI), Life Cycle Impact Analysis (LCIA) and life cycle interpretation (ISO, 2006a, 2006b).
157 Figure 1 presents the flowchart and relationships between these processes.

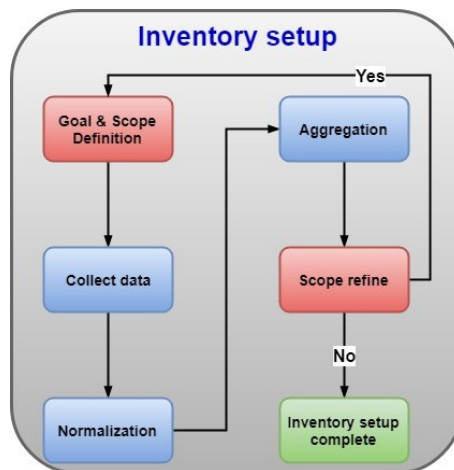


158 Figure 1 The schematic chart of life cycle assessment
159
160

161 To conduct an LCA analysis, the first step is to define the objectives and boundaries. A typical
162 objective of research study is to determine a specific performance or cost of a system or product
163 and similarly, LCA study is to obtain the environmental impact. There are a huge amount of
164 different environmental impacts that can be considered, for example, Global Warming
165 Potential (GWP), Acidification Potential (AP) and Eutrophication Potential (EP); hence it is
166 essential to set up the purpose of the study and its main targets. The scope and boundaries
167 should also be considered and as the goal is set up, the selection and consideration of certain
168 types of potential (e.g. GWP, AP or EP) should be carried out based on the goal. There will be
169 many emissions and pollutants under evaluation, hence some have been neglected as they have
170 insignificant impacts on the primary goal. After the potentials selected, a functional unit should
171 be set up as a standard to carry out the evaluation and comparisons of different scenarios. A
172 normalisation process will be conducted, which converts considered emissions from different
173 potentials into one indicator (selected pollutant). According to the CML database (CML, 2016),
174 all the emissions that contribute to global warming will be normalized and converted into an
175 equivalent quantity of CO₂ and the unit is kg CO₂ equivalent. Similarly, for AP and EP, the
176 fundamental pollutants are sulphur dioxide and phosphate (SO₂ and PO₄³⁻). Usually, a
177 functional unit could be the quantified ship performance during its service, but they can always
178 be set up by the end-users based on their objective. The normalisation process helps simplify
179 the set up process which usually is based on the normalised units. Definition of the system
180 boundary is an important part as well. Not only constraining the scope by the relevant
181 emissions, but also identifying the differences between alternatives could help limit the LCA

182 scope which can be extremely complex, so that a compact but adequate LCA model can be
183 established without considering repeated, redundant and less effective parts of the system or
184 product. Therefore, a reasonable scope should be made in order to neglect these unnecessary
185 parts. Furthermore, assumptions should be made as well in order to progress the analysis as
186 sometimes real data cannot be retrieved or provided. These assumptions should be made or
187 advised by the system or product owners, manufacturers and operators.

188 After the definition of goal, scope and boundaries, the life cycle inventory analysis can be
189 conducted as shown in the schematic diagram in Figure 2. It starts with the defined goal and
190 scope in the previous step where an initial LCA plan has been selected and determined. With
191 this plan, data involved in the plan can be collected, normalised and aggregated so that initial
192 outcomes could be determined. However, the scope of the LCA analysis will be expanded or
193 reduced based on the availability of relevant data. After adjusting the scope based on data
194 availability, similar processes of data collection, normalisation and aggregation will be
195 conducted so that a modified but complete inventory of an LCA analysis can be obtained.



196
197
198 Figure 2 Schematic chart of life cycle inventory analysis

199 The LCI analysis will be used as a fundamental part of the LCIA which consists of three main
200 steps:

- 201 a. Selection: impact categories chosen including indicators and characterization models;
- 202 b. Classification: LCI results assigned to the selected impact categories;
- 203 c. Characterization: calculation using LCI results as input and characterization models to
204 determine results based on category indicator.

205 In the last phase, life cycle interpretation, a sensitivity analysis will be carried out to evaluate
206 impacts of the selected inputs on the established LCA processes and results, i.e. mid-term and
207 end-term results. These inputs are selected based on their significance, availability, and
208 uncertainty.

209 The results will indicate the significant performances based on the LCI and LCIA analysis
210 which usually provide end-users recommendations on the selections of different alternatives.
211 Furthermore, the conclusions, limitations and recommendations of the LCA analysis should be
212 provided in this interpretation processes which illustrate not only the decisions made but also
213 the constraints of the analysis.

214 **3.2. FORMULA GOVERNING**

215 As this paper will mainly focus on the main engine and its related activities, the fuel oil
216 consumption during the operation phase of the vessel is considered and a general equation is
217 used to calculate the fuel oil consumption for these activities Equation (1):

$$218 \quad FC = \sum_{i=1}^n Pe_i \times SFOC_i \times H_i \times LS \quad (1)$$

219 Where,

220 FC is the annual fuel consumptions [g];
221 Pe is the power requirement during vessel operation [kW];
222 SFOC is the specific fuel oil consumptions of the engine under specific engine output [g/kWh];
223 H is the number of operation hours in a year [hours];
224 LS is the number of years of the vessel life span [years];
225 N is the total number of operation conditions under consideration;
226 i represents the number of different vessel operation conditions under different engine loads.
227

228 Due to engine load variation under different operating conditions, the SFOC adjustment for the
229 engine will be considered based on the engine project guide data shown in Figure 3. Equation
230 (2) gives the interpolation curve of this figure (Dedes, 2013):

$$231 \quad SFOC = 378.8 - 387.2 \times EL^3 + 880.2 \times EL^2 - 657.3 \times EL \quad (2-1)$$

$$232 \quad Q_{NO_x} = 8.56 - 9.392 \times EL^3 + 8.522 \times EL^2 + 4.235 \times EL \quad (2-2)$$

233 Where,

234 SFOC is the specific fuel consumption under a certain engine load [g/kWh];
235 Q_{NO_x} is the specific NO_x emission under a certain engine load [g/kWh];
236 EL is the engine load under one operation condition [%];
237

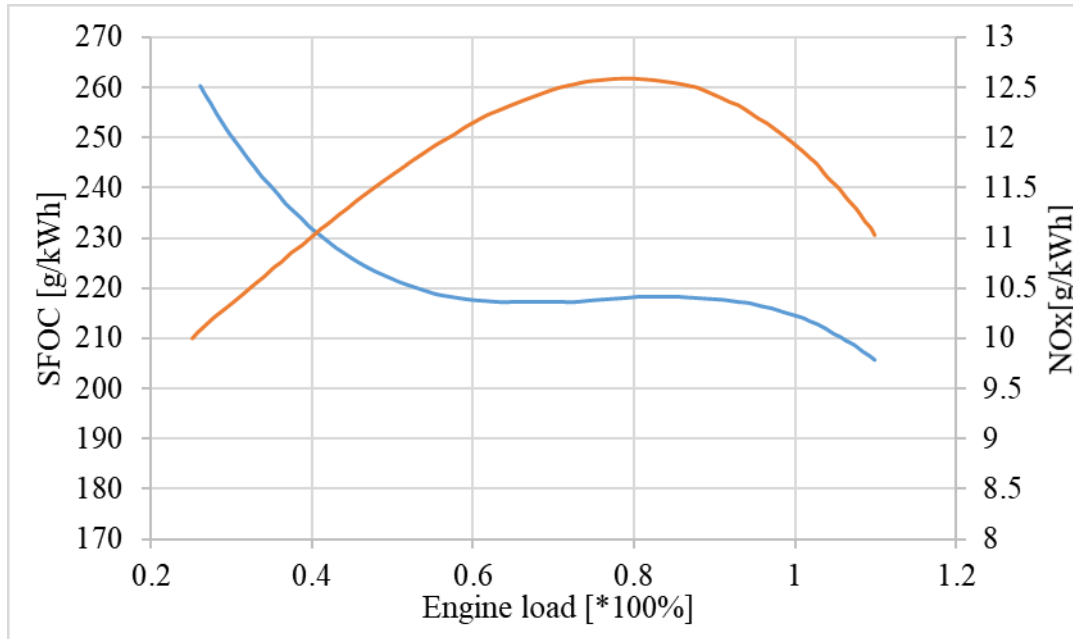


Figure 3 Typical SFOC curves and NO_x emission curves for diesel generators

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241 Emissions can be theoretically estimated based on emission factors and fuel consumption in
242 Equation (3):

$$243 \quad Q_e = C_f \times FC \quad (3)$$

244 Where,
245 Q_e is the quantity of emission from engine operation [g];
246 C_f is the emission factors of fuel burnt in the engine [g/g];
247 FC is the annual fuel consumptions [g].

248

249 **4. LCA ANALYSIS AND DISCUSSION**

250 The LCA analysis will be performed following the methodology described in Section 3,
251 starting from the aim and scope definition, followed by a life cycle inventory setup and impact
252 assessment.

253 **4.1. AIM AND SCOPE**

254 The aim of this research has been stated in the introduction and it is to explore the impact of
255 different engine configurations on a tugboat taking into account fuel savings and emission
256 reduction performance. The details for the case study ship selected for this purpose are shown
257 in Table 1 and Table 2.

258 The research focuses on the engine configuration and the following assumptions are made
259 before carrying out the analysis:

- 260 a. Only the main engines and their related activities are involved (Figure 4): engine
 261 installation (purchase, transportation and installation), operation (fuel production,
 262 transportation and consumption) and scrapping (transportation, cutting and recycling);
 263 b. Carbon emissions from engine fuel consumption are calculated based on emission
 264 factors provided by the International Maritime Organization in the Third Greenhouse
 265 Gas Report (Smith et al., 2015);
 266 c. The scrapping processes are referred from Ling-Chin and Roskilly's research (Ling-
 267 Chin and Roskilly, 2016b);
 268 d. The manufacturing process of engines are regarded as out of scope;
 269 e. The changes in fuel consumption due to engine load variation are estimated using the
 270 relationship for typical engines shown in Figure 3;
 271 f. Properties of electricity and transportation are determined based on published papers
 272 and GaBi database (GaBi, 2018); fuel price is referred to online source (Bunkerworld,
 273 2017);
 274 g. Machinery maintenance is regarded as out of scope;
 275 h. The environmental impact assessment is limited to the GWP and AP that are regarded
 276 as the most crucial marine contributors to deteriorating the global environment.

277 The maintenance phase is a significant focus as the numbers, hours and loads of engine
 278 operation are varied greatly. Therefore the maintenance activities (emission and cost) will give
 279 a new angle to investigate the optimal alternatives.

280 In this case, the maintenance phase is considered as out of scope and will be investigated in the
 281 future. It is because the software could estimate the engine running hour related maintenance
 282 cost, but the database is based on a short route ferry and may not be compatible with tug vessel.
 283 Also, the focus of tug vessel maintenance will be different from ferry because tug vessel
 284 operates in different sea states, but ferry operates between two destinations. However, if
 285 historical data is ready, the estimation of maintenance cost for tug vessel will be completed.

286 In the next section, the LCA model for this ship is established and presented which will be used
 287 as a benchmark in the life cycle impact analysis.

288 Table 1 Case study vessel information

Vessel specification		
Name	Salvation 21	
Flag	Korea	
LOA	32.3	meter
B	10	meter
Gross tonnage	156	tonne
Fuel type	HFO	
Annual operation days	313	days
Engine power	1518×2	kW

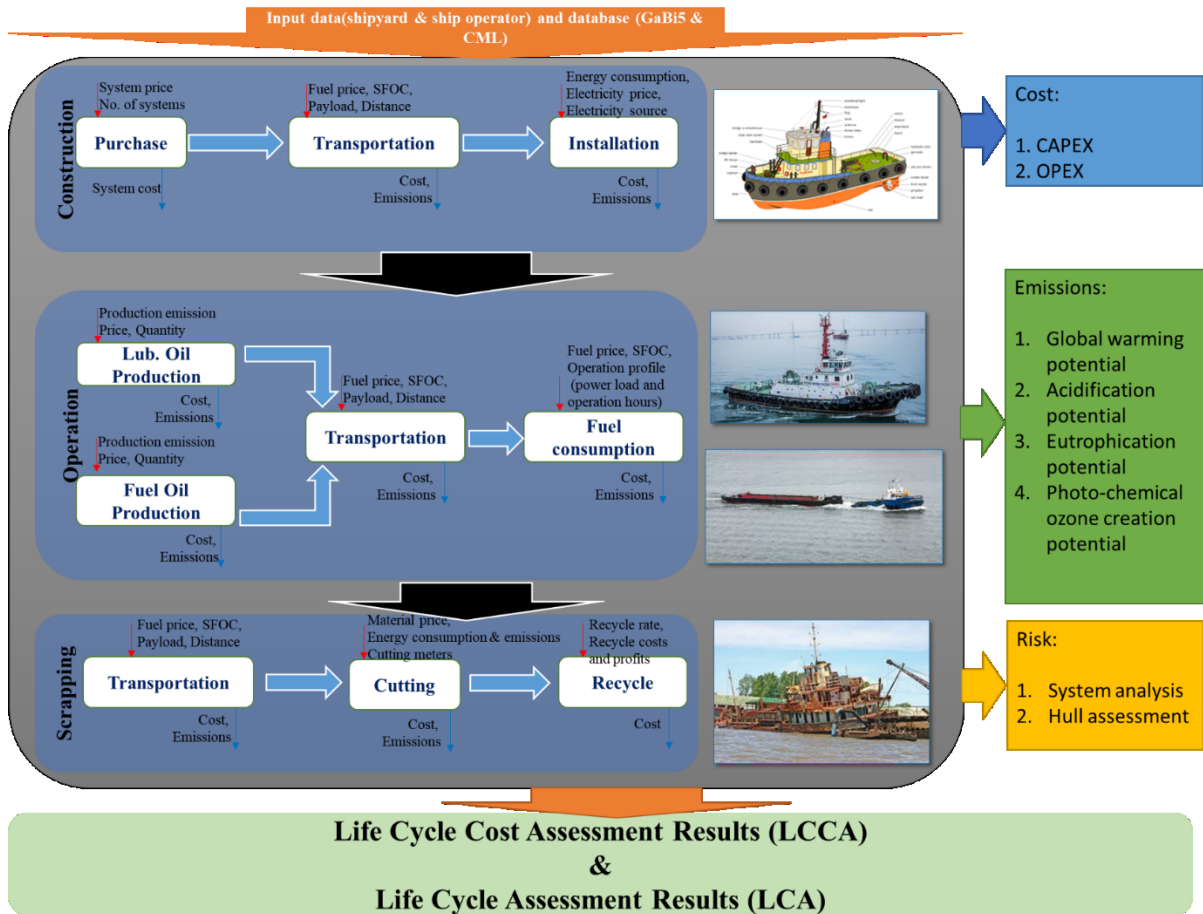
Life span	30	year
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Table 2 Case study vessel operational profile

Category	Sailing	Manoeuvring	Port	Unit
Operation profile	6	0.6	3	hours
Engine Load	74%	33%	0	percentage
Power required	2250	1000	0	kW
SFOC	191	214	0	g/kWh

291



292
293

Figure 4 Main engine related activities consideration and flow

294 4.2. LIFE CYCLE INVENTORY ANALYSIS

295 4.2.1. LCA model - commercial software GaBi

296 Based on the aim and the scope established in the previous section, an LCA model was built
 297 and is presented in Figure 5. This figure includes the activities of the main engine from
 298 construction (purchase, transportation and installation), to operation phase (fuel consumption
 299 and transportation) and to scrapping of engine (disassembling, transportation, recovery etc.).

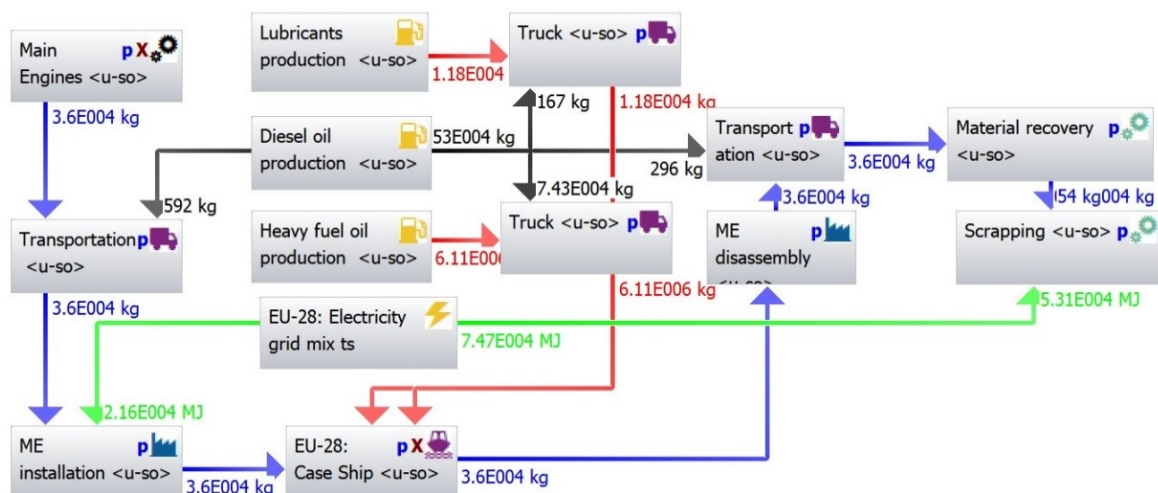
300 The blue arrows represent the flow of engines; the fuel for ship operation is highlighted in red
 301 colour and fuel for transportation is in black; green arrows show the supply of electricity.

302 With this model (includes ship particulars, operational profiles, etc.) and the application of
 303 GaBi software and database, the emissions inventory is set up and shown in Table 3. As two
 304 environmental impact categories are considered in this study (GWP and AP), the emission
 305 release breakdowns are presented in the table. It is apparent that the operation of the vessel
 306 contributes the most of emission through the life span.

307 The way to estimate the emissions (apart from ship operation) is based on the database and
 308 empirical equations from GaBi which estimates the material used and emissions generated for
 309 many activities (not usually considered in ship industry), such as fuel oil production and
 310 transportation.

Propulsion system LCA (tug)

Process plan: Reference quantities
 The names of the basic processes are shown.



311
 312
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Figure 5 GaBi LCA model of the case ship

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Table 3 Emission inventory of life cycle assessment

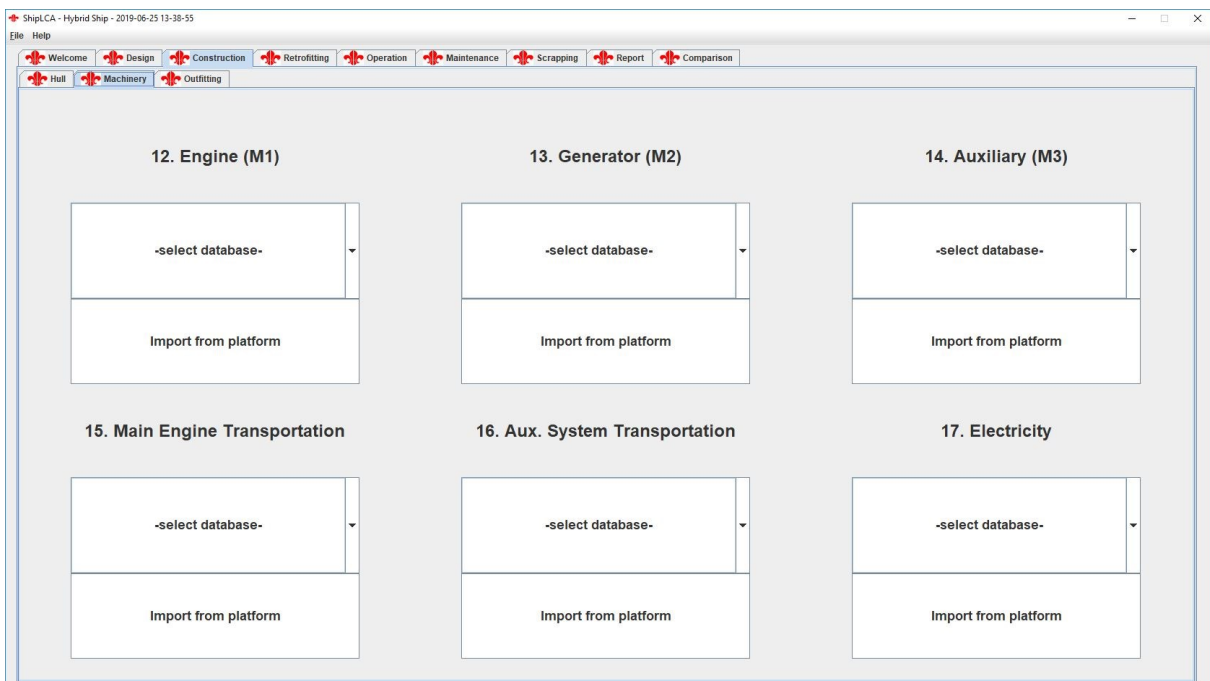
Module name	Emission category	
	Global Warming Potential (kg CO ₂ eq.)	Acidification Potential (kg SO ₂ eq.)
Transportation	9.32×10 ⁵	1.11×10 ³
Heavy Fuel oil production	1.14×10 ⁷	4.94×10 ⁴
Lubricating oil production	9.14×10 ⁴	393
Diesel oil production	1.48×10 ⁵	590
Tug ship operation	7.92×10 ⁷	2.70×10 ⁶
Other activities	1.24×10 ⁴	23.2
Total	9.17×10 ⁷	2.76×10 ⁶

315

316 4.2.2. Developed ShipLCA software and verification

317 The ShipLCA software was developed to focus on the life cycle assessment of ships, machinery
318 system as well as other applications in the marine industry (Bharadwaj et al., 2016). The scope
319 of the software includes the construction, operation, maintenance and scrapping phase of the
320 ship life. In each phase, activities can be defined and considered to estimate the energy
321 consumption, emissions release and related costs (Jeong et al., 2018).

322 At present there is no life cycle software specific for the marine/ship building industry, and it
323 becomes very time consuming and difficult to carry out the whole life cycle assessment. The
324 ShipLCA software fills the gap on existing LCA software with the consideration of ship life
325 stages and various activities. Within ShipLCA the three most significant impacts are included:
326 cost, environment and risk (machinery systems), and the software can be used to help
327 shipyards, ship owners and operators, and policy makers to estimate the life cycle impacts
328 during the early design stage (Figure 6). The software will help to determine optimal
329 alternatives while selecting engines, configuring systems or applying different sources of
330 electricity; an example of ShipLCA result plot is shown in Figure 7 together with elements
331 under consideration.



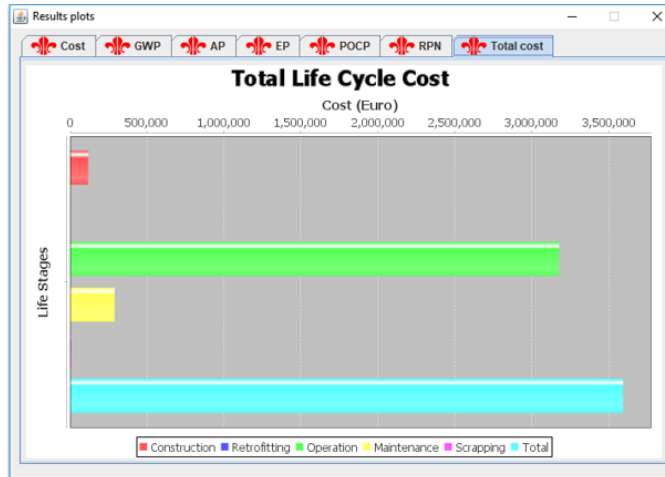
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Figure 6 Insight of the software interface

CAPEX:
investment and
energy
consumption/cost

OPEX:
operation,
maintenance,
scrapping cost

Qualitative RA
RPN=
Frequency×
Consequence×
Mitigation



Global warming potential (GWP):
CO₂, CH₄, CO, N₂O, etc.

Acidification potential (AP):
SO_x, NO_x, HCL, NH₃, etc.

Eutrophication potential (EP):
PO₄³⁻, NO_x, NH₃, COD, etc.

Photochemical ozone creation potential (POCP):
C₂H₄, C₂H₆, C₇H₈, CO, etc.

334
335
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Figure 7 Example of software results and considered elements

337 The way to verify the results from ShipLCA software is following the procedures:

338 1. Setting up the same goal and scope for the case study;

339 Similarly to Section 4.1, the goal and scope of the tugboat assessment is to determine the
340 environmental impact during the construction, operation, maintenance and scrapping phases of
341 the vessel; among these phases cash flow, energy flow and emission flow will be considered;
342 similarly some assumptions will be taken into account: a) only propulsion system under
343 consideration; b) carbon factor is applied to estimate; c) some phases will be disregarded as
344 irrelevant or minor impact; d) engine output variable follows the same relationship; e) GaBi
345 database will be applied where no data available from shipyard or operators.

346 2. Modelling the case in ShipLCA software;

347 Similar to GaBi model, a model will be established in ShipLCA software following the
348 specification of the vessel: a) ship in Table 1; b) operational profile in Table 2; c) available
349 data from shipyard; d) data exploited from GaBi. Within ShipLCA software, all the activities
350 and phases are pre-defined for the marine industry and this is the greatest different between
351 ShipLCA and GaBi.

352 Data collection required for ShipLCA software covers the ship particulars, engine specification
353 and operational profile; to be specific, the required and considered data are: ship geometry
354 parameters, engine weights and maximum power output, cost and emissions related to
355 transportation, cost and emissions related to electricity use, annual operation days, daily
356 operation hours, power required and specific fuel oil consumption. The main equations
357 involved are derived by the ones in GaBi but further details were added based on the
358 requirements of ship building industry.

359 For life cycle analysis, environmental impact is under investigation: mainly emission from fuel
360 generation and consumption, electricity generation and transportation. The environmental
361 impact categories under considerations are: Global warming potential (CO₂, CH₄, CO, N₂O,
362 etc.), Acidification potential (SO_x, NO_x, HCL, NH₃, etc.), Eutrophication potential (PO₄³⁻,
363 NO_x, NH₃, COD, etc.) and Photochemical ozone creation potential (C₂H₄, C₂H₆, C₇H₈, CO,
364 etc.). The quantities of these emissions could be determined by collecting historical data and
365 calculation. The emission databases from Gabi to predict the emission quantity are referred to
366 for transportation, electricity generation and fuel generation. Regarding the fuel consumption
367 related emissions, IMO's report is referred to (the same as the assumption in Section 3.1.).

368 The quantities of these emissions will be converted to different potential indicators to quantify
369 the impact because different emission has different lifetime and ability to affect the
370 environment. The different potential indicators are selected for different impacts for different
371 characterisation methods in order to provide a final impact value through the lifetime of product
372 or system. This paper will use CML 2001 method for characterisation; therefore, the indicators
373 of GWP, AP, EP and POCP are CO₂, SO₂, PO₄³⁻ and C₂H₄ respectively. These are selected
374 because they have either the largest quantity or could cause most severe consequence or well
375 known in the impact potential.

376 For the life cycle cost assessment, similar activities and life stages are considered. With the
377 required costs collected from the relevant consultant websites, the overall cost can be
378 determined, such as fuel cost, transportation cost, electricity cost and so on.

379 The risk assessment calculation follows the Formal Safety Assessment (FSA) (IMO, 2018b).
380 The procedures are:

- 381 a. Identify hazards within the goal and scope of the study;
- 382 b. Use engineers' judgement to determine the frequency (F) and consequence (C);
- 383 c. Determine risk mitigation method level (M);
- 384 d. Determine the risk priority number to present the risk level: $RPN = F \times C \times M$.

385 The ShipLCA software also includes a decision making process which converts all the impacts
386 (environmental, economic and risk) into monetary terms for comparison. This will allow the
387 comparison of different alternatives from the perspective of not only individual impact and life
388 phase but also the holistic lifetime.

389 3. Comparing the results between software;

390 The results from GaBi mainly focus on environmental impacts and Table 4 shows the results
391 from both software (ShipLCA and GaBi).

392

393 Table 4 Emission inventory: comparison between operation phase and the total lifetime

Module name	Emission category	
	Global Warming Potential (kg CO ₂ eq.)	
	ShipLCA	GaBi
Operation phase	9.40×10 ⁷	9.06×10 ⁷
Total	9.73×10 ⁷	9.17×10 ⁷

394

395 4. Determining the variation between results;

396 While verifying the model, the way to check whether the model is acceptable is by comparing
 397 the results between the two models. As the models are setup based on different database, an
 398 acceptable variation should be determined for variation.

399 5. Remodelling the case in ShipLCA to achieve an acceptable level of result variation;

400 If the variation is not in this range, the model will be modified, and the evaluation will be
 401 conducted again. Since this case is more focusing on Global Warming Potential, it is obviously
 402 the variations of GWPs are about 4% and 6% from the perspective of operational and life cycle
 403 total results.

404 6. Determining a verified ShipLCA model for tugboat case.

405 4.3. LIFE CYCLE IMPACT ANALYSIS

406 To test and analyse the impact of different engine configurations on the vessel performance,
 407 five scenarios are under assessment based on the model established and mentioned in the
 408 previous section. Five scenarios with Niigata engines (Niigata, 2019) are listed below:

409 a. Scenario 1 (original): two large engines running – 1518kW×2

410 The vessel as described in the inventory setup is used as the basis for the first scenario. The
 411 engines are operated at 74% engine load (at sea) and 33% (manoeuvring);

412 b. Scenario 2: three medium engines running – 1062kW×3

413 In scenario 2, 3 medium engines replace 2 large engines. The engines are operated at 71%
 414 engine load (at sea) and 31% (manoeuvring);

415 c. Scenario 3: two medium engines running – 1062kW×2

416 This scenario has the same engine type as Scenario 2 but there are only 2 medium engines
417 running other than 3. The engines are operated at 106% engine load (at sea) and 47%
418 (manoeuvring); under the sailing condition, the engines are overloaded. The operation concept
419 suggests this as infeasible already, but it is still under consideration to find out whether
420 emission released will be improved.

421 d. Scenario 4: four small engines running – 761kW×4

422 In scenario 4, 4 small engines are equipped on the vessel. The engines are operated at 74%
423 engine load (at sea) and 33% (manoeuvring);

424 e. Scenario 5: three small engines running – 761kW×3

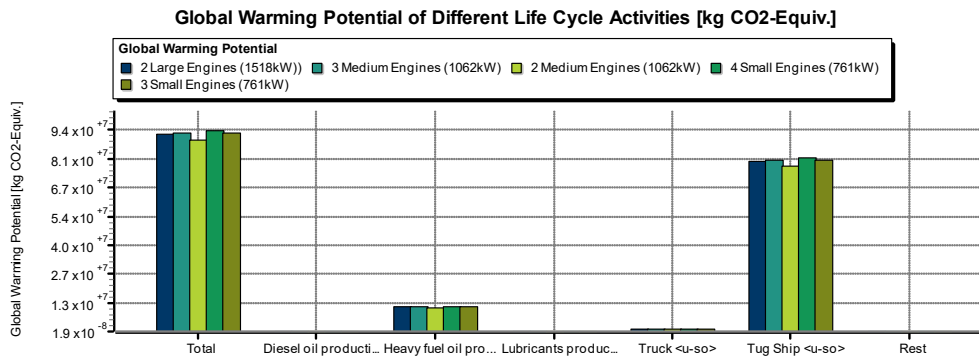
425 This scenario has the same type of engine as Scenario 4 but only 3 small engines are running.
426 The engines are operated at 99% engine load (at sea) and 44% (manoeuvring); under the sailing
427 condition, the engines are nearly fully loaded.

428 4.3.1. GaBi LCA results

429 With the help of the LCA model, the emission potentials are determined and shown in Figure
430 8 and Figure 9. From the results, it can be seen that the vessel operation phase is still the largest
431 contributors under all scenarios. It is also reasonable to consider the reduction of emission/fuel
432 consumption during the operation phase to achieve better environmental protection.

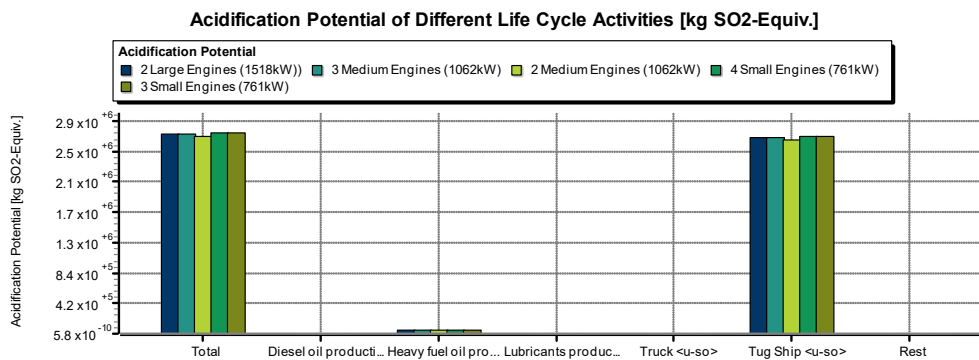
433 Among the five scenarios, scenario 3 has the lowest emission for both GWP and AP: 8.93×10^7
434 kg CO₂ eq. and 2.73×10^6 kg SO₂ eq.. Scenario 4 has the highest emission for both as well:
435 9.36×10^7 kg CO₂ eq. and 2.77×10^6 kg SO₂ eq.. It is because the engines were operated under a
436 more efficient range of engine load which requires less fuel consumption when providing the
437 same power output. Furthermore, comparing the five scenarios, it is apparent that different
438 engine configurations will result in different emission release, and as such various
439 configurations should be assessed and compared from the aspects of environmental potential
440 in order to determine the optimal engine configuration for any new vessel.

441



442
443
444

Figure 8 Global Warming Potential vs Life Cycle Activities [kg CO₂ eq.]



445
446
447

Figure 9 Acidification Potential vs Life Cycle Activities [kg SO₂ eq.]

448 The fuel oil consumption for 30 years of operation was also determined through the LCA model
449 and the results are presented in Table 5. It shows that applying the third configuration the
450 overall fuel oil consumption is the lowest.

451 Table 5 Fuel oil consumption for five scenarios/configurations

Scenario	1	2	3	4	5
Fuel oil consumption (thousand tonne)	25.36	25.61	24.68	25.89	25.56

452

453 However, under the condition of scenario 3, the engines are operated under abnormal
454 conditions as the overloaded by 6%. It is not suggested to be run the engines under this
455 operation condition which may increase risk and maintenance of the engines. Among five
456 scenarios, there are three of them which have their engine running at normal conditions:
457 scenario 1, 2 and 4. Among these three, the first configuration with two large engines has the
458 best performance (lowest emission and fuel consumptions).

459 4.3.2. ShipLCA results

460 a) Life cycle analysis results
 461 To estimate the environmental impact, the processes mentioned in Section 3.2.2 were applied.
 462 The emission quantities were collected and calculated and then converted into the indicators.
 463 The life cycle environmental impacts from ShipLCA are given in the following table.

464 Table 6 Life cycle inventory of original case: emission from different stages and categories

Life stage	Construction	Operation	Scrapping	Total
GWP (tonne CO ₂ eq.)	3321.33	93944.16	2.82	97268.31
AP (tonne SO ₂ eq.)	9.50	1325.49	0.00065	1334.99
EP (tonne PO ₄ ³⁻ eq.)	0.86	172.78	0.00016	173.64
POCP (tonne C ₂ H ₆ eq.)	0.61	61.75	0.00010	62.36

465

466 b) Risk assessment (Formal Safety Assessment (FSA))
 467 With the application of FSA, the following hazards were identified and judgement on
 468 frequency and consequence are made. Then mitigation methods were investigated to prevent
 469 the hazard from happening or correct the hazard after happening. The total RPN number from
 470 the table is 84 and with an assumption of vessel price of €12 million, the estimated risk cost is
 471 €1.01 million.

472 Table 7 FSA risk assessment on engine operations for original case

Risk hazards	Frequency	Consequence	Mitigation
No.1 G/E fails	2	2	1
No.2 G/E fails	2	2	1
No.3 G/E fails	2	2	1
No.1 Motor Fails during normal operation	2	6	2
No.2 Motor Fails during normal operation	2	6	2
No.1 DC Variable speed drive fails during operation	1	6	2
No.2 DC Variable speed drive fails during operation	1	6	2

473

474 c) Life cycle cost analysis and total cost:
 475 LCCA considers the following aspects: engine configurations, such as engine price, fuel price,
 476 transportation fees, etc.. As the previous estimation of environmental impact and risk costs, the
 477 life cycle total cost can be determined. The following table presents the costs from different
 478 life stages and impacts.

479 Table 8 Cost assessments from the perspective of economy, environmental, risk and overall
 480 level

Life stages	Construction	Operation	Scrapping	Total cost
Life cycle cost (Euro)	104,058	13,924,544	210,036	14,238,638
Environmental converted cost (Euro)	1,608	15,602,419	73	15,604,099
Risk converted cost (Euro)	0	1,008,000	0	1,008,000
Total life cycle cost (Euro)	105,666	30,534,963	210,109	30,850,737

481

482 d) Comparison of various scenarios
 483 Three reasonable cases are scenario 1, 2 and 4 which equip 2 large, 3 medium and 4 small
 484 engines on board. This section will compare the results from ShipLCA for these three scenarios
 485 to determine the optimal alternatives. The results are presented in Table 9:

486 Table 9 Cost, environmental and risk results for three reasonable scenarios

Scenarios	Cost	Environmental		Risk	Total cost
		GWP	AP		
Scenario 1	14,238,638	103,765	1,684	84	30,850,737
Scenario 2	14,194,906	103,403	1,678	84	30,752,468
Scenario 4	14,264,951	103,854	1,685	84	30,890,324
Unit	€	tonne CO ₂ eq.	tonne SO ₂ eq.	RPN	€

487

488 When considering cost alone (no environmental or risk cost), the cost results are all around
 489 €14.2 million for all scenarios. This is because the difference between them is the engine prices
 490 due to different engine types. Risk level is the same for different cases as the total operating
 491 hours and power output are the same.

492 When considering the environmental impact, the fuel consumption is estimated first and the
 493 emissions release is then derived based on the amount of fuel consumed and emission factors,
 494 such as carbon conversion factor, sulphur content and NOx emission curve from Section 3.2.
 495 The results show that Scenario 2 has the lowest emissions released from the perspective of
 496 GWP and AP potential. The emission credits for CO₂ and SO₂ used in the software are 24 and
 497 7,788 € per tonne respectively (Maibach et al., 2007). With these values, the equivalent costs
 498 for environmental impacts can be calculated and are €2.48E+6 and €1.31E+7. However, based
 499 on the report from World Bank, the carbon credit was predicted to be €36-72 per tonne CO₂ in
 500 2020 but according to IPCC, it would be increased to €122-5,456 in 2030 and 221-12,897 per
 501 tonne CO₂e (Berg et al., 2019; Rogelj et al., 2018). The damage cost of SOx is estimated by
 502 EU to be €10,900 per tonne SOx in 2016 (European Commission, 2019). Therefore, the
 503 environmental impact will become more and more dominate as the emission credits growing
 504 rapidly. In this study, for the purpose of verification, same credit factors were adopted and
 505 since they were used in a linear function: Environmental impact (€) = Emission quantity (tonne)
 506 x emission credits (€/tonne), there will be no effect to the verification result. Since all the
 507 impact results can be expressed in monetary terms, an optimal solution can be obtained just by
 508 adding all values for each scenario. In this case, the results indicate that the configuration with
 509 3 medium size engines is the most cost effective and environmentally friendly among three
 510 scenarios.

511 5. CONCLUSIONS AND FUTURE WORK

512 This paper carried out an analysis on a tugboat's life cycle performance specifically estimating
 513 and comparing different propulsion system configurations to select the optimal one with lowest

514 emissions release, cost and hazard impacts. Five different engine configurations were selected
515 and assessed with the help of life cycle assessment software, GaBi and ShipLCA, which
516 holistically evaluates the select ship with varied configurations. The results indicate the optimal
517 engine configuration is to equip the tugboat with three medium engines which generated
518 emissions equivalent to the cost of 15.5 million euros, invested 14.2 million euros and has a
519 risk impact equivalent to 1.01 million euros. This paper not only provides a case study for
520 tugboat configuration assessment but also supports the life cycle assessment methodology as a
521 general evaluation method for carbon emission reduction technologies to meet the extreme
522 requirement of emissions control in the next few decades.

523 At present there is no life cycle software specific for the marine/ship building industry, and it
524 becomes very time consuming and difficult to carry out the life cycle assessment. The ShipLCA
525 software fills the gap on existing LCA software with the consideration of ship life stages and
526 various activities. Within ShipLCA the three most significant impacts are included: cost,
527 environment and risk, and the software can be used to help shipyards, ship owners and
528 operators, and policymakers to estimate the life cycle impacts during the early design stage.
529 The software will help to determine optimal alternatives while selecting engines, configuring
530 systems or applying different sources of electricity.

531 According to the analysis and evaluation with a limited scope in this paper, we could conclude:

- 532 a. The operational phase contributes the most emission (about 85% of overall emissions)
533 in the tug boat life span;
- 534 b. Changing the engine configuration has an impact on ship life cycle performances such
535 as fuel consumption and emission release;
- 536 c. A life cycle assessment could be applied and will help to determine the impacts of
537 different alternatives so that the optimal alternative could be obtained; this can be more
538 accurate if holistic ship life and comprehensive activities are considered.
- 539 d. ShipLCA proved to be able to evaluate the ship life cycle impact by assessing the
540 performances for the tug vessel and comparing with the commercial model;

541 There are still further work to improve the study:

- 542 a. The maintenance phase could be considered comprehensively to achieve a full LCA
543 assessment; more details of manufacturing and scrapping phase will be helpful to
544 achieve this full assessment;
- 545 b. More environmental categories and emission credits could be included; in this study,
546 only four emission potentials categories and two emission credits are under
547 considerations;

548 c. The risk assessment is performed in a simplistic way; a quantitative risk assessment
549 using historical data collected from ship operators will increase the content and
550 accuracy of the overall assessment.

551 **6. ACKNOWLEDGEMENT**

552 The authors gratefully acknowledge that the research presented in this paper was partially
553 generated as part of the HORIZON 2020 SHIPLYS (Ship Life Cycle Software Solutions)
554 Project, Grant agreement number 690770.

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