

1 **Reducing Emissions by Optimising the Fuel Injector Match with the Combustion**
2 **Chamber Geometry for a Marine Medium-Speed Diesel Engine**

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8

9 **Abstract:** The effects of seven matching parameters of a fuel injector and combustion chamber geometries on
10 nitrogen oxide (NO_x), soot and specific fuel oil consumption (SFOC) were investigated by means of a parametric
11 study. The study was carried out on four different engine loads, i.e. L25 (25%), L50 (50%), L75 (75%) and L100
12 (100%) loads. The injection-related parameters were found to have more prominent influences as opposed to the
13 combustion chamber geometries. Then, a multi-objective genetic algorithm (MOGA) method was proposed in
14 order to identify a set of optimal designs for the L100 load. The emissions and performance of these optimal
15 designs were also examined and compared on the other three engine loads. Finally, an optimal design which meets
16 the IMO (International Maritime Organization) Tier II NO_x emissions regulations (research shows it is impossible
17 to meet Tier III NO_x emissions regulations solely on the basis of the optimisation of the combustion progress) and
18 which has the best fuel economy was singled out.

19

20 **Keywords:** injector; combustion chamber; diesel engine; emission; fuel consumption

Nomenclature			
2D	two dimensional	Simple	semi-implicit method for pressure linked equations
BTDC	before top dead centre	Sobol	quasi-random low-discrepancy sequences
CFD	computational fluid dynamics	SOI	start of injection
CO	carbon monoxide	SCR	selective catalytic reduction
CO ₂	carbon dioxide	SR	swirl ratio
d003	connection length	TC	turbocharging
D2	a test cycle for NO _x emissions	TDC	top dead centre

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DoE	design of experiment	v001	the distance from the centre of toroidal surface to the piston top surface
ECAs	emission control areas	v002	clearance
EGR	exhaust gas recirculation	v003	crown centre height
GA	genetic algorithm		
h001	bowl radius	Functions and variables	
HC	hydrocarbons	x	n-dimensional parameter vector
HPCR	high-pressure common rail	f	function
IMO	international maritime organization	j	variable
KIVA	a Fortran-based CFD software	k	objective
L100	full engine load	N	maximum objective numbers
L25	25% engine load	\vec{x}^*	Pareto design
L50	50% engine load	\vec{x}_j	arbitrary design
L75	75% engine load		
MARPOL	the international convention for the prevention of pollution from ships	Units	
MOGA	multi-objective genetic algorithm	CA	crank angle
NLPQL	non-linear programming by quadratic Lagrangian	deg	degree
NO _x	nitrogen oxides	g/kWh	grams per kilowatt-hour
NPL	nozzle protrusion length	L	litre
Piso	pressure implicit split operator	kW	kilo Watt
r002	toroidal radius	mm	millimetre
SA	spray angle	r/min	rotates per minutes
SFOC	specific fuel oil consumption		

21

22 1 Introduction

23 Marine diesel engines play an indispensable role in shipping. Their extensive application as
24 main propellers or generators mainly relies on their high reliability and fuel economy. However,
25 intolerable pollutions caused by them are gaining increasing focuses worldwide. Compared to
26 automotive diesel engines, marine diesel engines exhaust much lower CO, CO₂ and HC
27 emissions, and conversely generate severely deteriorated NO_x emissions. As a result, the IMO
28 expressly referred to the NO_x emissions in the revised Annex VI of MARPOL (Pueschel et al.,
29 2013), as shown in Table 1. Tier II NO_x emission regulation came into force for engines
30 mounted on a ship constructed on or after 1 January 2011. It stipulated the reduction of NO_x

31 up to 20% by comparing to Tier I regulations in the global area. The more stringent Tier III
 32 regulations were applied for engines installed on a ship constructed on or after 1 January 2016,
 33 operating in the ECAs. It requires a NO_x reduction of 80% from Tier I. Tier II regulations are
 34 still applied for ships operating outside of the ECAs.

35

36 Table 1 IMO NO_x emission regulations

Rated Speed n (r/min)	n<130	130≤n ≤2000	n>2000
Tier I (2000)/ g/(kWh)	17.0	$45 \cdot n^{-0.2}$	9.84
Tier II (2011)/ g/(kWh)	14.36	$44 \cdot n^{-0.23}$	7.66
Tier III (2000)/ g/(kWh) in ECAs	3.4	$9 \cdot n^{-0.2}$	1.97

37

38 In view of the challenge posed by stringent emission regulations, some existing technologies
 39 are applicable, for example, the EG), the SCR, the 2-stage TC system together with an extreme
 40 Miller cycle, the dual fuel engine or the nature gas operation (Christer, 2013; Steffe et al., 2013).
 41 However, some existing marine diesel engines installed on old ships can only meet the Tier I
 42 standard. Traditional mechanical fuel injection systems were widely mounted on these marine
 43 diesel engines. In order to improve their emission levels, a promising modification is to replace
 44 the mechanical injection systems with HPCR fuel injection systems. The flexible control over
 45 engine injection timing and injection quantity disregarding engine speed ensures that the HPCR
 46 systems achieve low emissions at all engine loads. Besides, high injection pressure (over 1000
 47 bar) of the HPCR systems offers a finer fuel atomisation and a homogenous fuel-air mixing,
 48 which is beneficial to improving engine performance.

49

50 When a mechanical fuel injection system is replaced with a HPCR fuel injection system, the
51 top priority is to decide the best match status between the fuel injection system and the
52 combustion chamber. In this study, NO_x emissions, soot emissions and SFOC are selected as
53 the three objectives to be minimised. The GA is frequently used in solving multi-objective
54 problems. Many researchers have already applied this method for diesel engine optimisations.
55 Researchers developed a KIVA code with a GA method in order to successfully study the
56 matching of a variety of engine parameters, from small-bore high-speed direct injection engines
57 to heavy-duty large-bore slow-speed diesel engines, even under different engine operation
58 loads. This significant amount of engine optimisation work was conducted using the automatic
59 grid generation tool and the effective optimisation algorithms (Kim et al., 2005; Genzale and
60 Reitz, 2007; Genzale et al., 2008; Ge et al., 2009; Shi and Reitz, 2008a; Shi and Reitz, 2008b).
61 Recently, Taghavifar et al. (2014) studied the effects of bowl movements and radius on the
62 mixture formation in terms of the homogeneity factor, combustion initiation and emissions for
63 a 1.8 L Ford diesel engine. They indicated that the mixture uniformity increased in line with
64 the bowl displacement toward the cylinder wall, but at the same time also identified a rise in
65 the combustion delay which substantially reduces the effective in-cylinder pressure. They also
66 found that smaller bowl size contributes to a better squish and vortex formation in the chamber,
67 although with lesser spray penetration and flame quenching. Park (2012) used a micro-genetic
68 algorithm coupling with a KIVA code in order to optimise the combustion chamber geometry
69 and the engine operating conditions for an engine fuelled with dimethyl ether. He found that
70 the combustion and emission characteristics of the engine were significantly different from
71 conventional diesel engines because of the properties of the fuel. Taghavifar et al. (2016) used
72 a DoE method incorporated with a Sobol on order to scan through the various design points of
73 a 1.8 L Ford diesel engine, with the purpose of identifying the reduction of NO_x and the
74 enhancement of the spraying characteristics. They indicated that a low spray angle and a small

75 bowl volume are beneficial to lowering emissions. Mobasher and Peng (2012) investigated
76 the influence of a re-entrant combustion chamber geometry on the mixture formation process,
77 combustion process and engine performance of a high-speed direct injection diesel engine.
78 They designed thirteen combustion chambers with different shapes by adjusting the piston
79 geometries, i.e. bowl depth, width, piston bottom surface and lip area. The results indicated
80 that a small bowl diameter leads to high soot emissions, yet also implied that an optimal
81 operating point was obtained with a slightly larger bowl diameter. Chen and Lv (2014) used an
82 orthogonal design method in order to study the injection-related parameters match with three
83 combustion chamber geometries for an 8.9 L Cummins diesel engine. Then, a NLPQL
84 algorithm was adopted in order to optimise the detailed combustion chamber geometries.

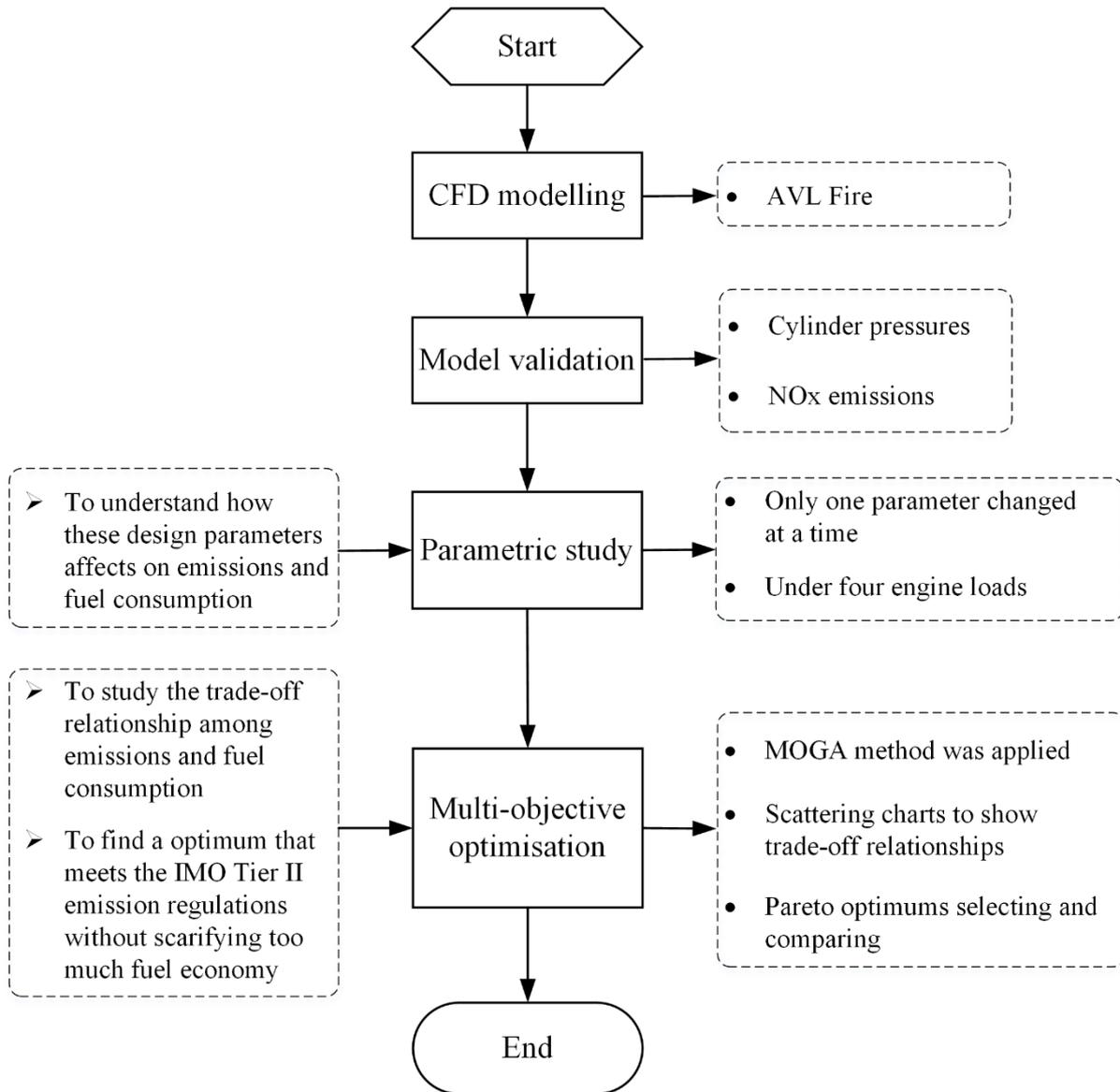
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86 Since most researchers invested their efforts and resources on the optimisation of automotive
87 engines, little work has been conducted in relation to on marine medium-speed diesel engines.
88 The effects of the injection-related parameters and combustion chamber parameters on
89 emissions and fuel consumption were extensively studied, but no feasible solutions were
90 identified on how to find a specific optimum which meets the emission regulations with the
91 best fuel economy. Besides, optimal combustion chamber geometries may vary from engine
92 type to engine type, due to the individual engine specifications and the match status of fuel
93 injection systems with combustion chamber geometries.

94

95 In this paper, the HPCR fuel injection system match with the combustion chamber geometry
96 of a marine medium-speed diesel engine was carefully investigated. The HPCR fuel injection
97 system was designed and produced in order to replace the original mechanical fuel injection
98 system mounted on the case marine medium-speed diesel engine (MAN 6L 16/24). It sought
99 to meet a more stringent emission regulation and to also improve fuel economy. In the first

100 place, a parametric study was carried out in order to get a general idea of how these design
 101 parameters affect the emissions and fuel economy. In the second place, MOGA algorithm was
 102 used in order to employ a set of optimal designs and operational parameters. Finally, an optimal
 103 design which meets the IMO Tier II emission regulations while maintaining a suitable fuel
 104 economy was selected. The complete optimisation scheme is shown in Fig. 1.



105

106 Fig. 1 Scheme of the optimisation process

107 **2 Simulation model**

108 Simulations were conducted by using a series of the AVL FIRE software. Firstly, the
109 combustion chamber shape at TDC was drawn in Fire 2D Sketcher software according to the
110 shape of the upper surface of the piston and the clearance distance between the piston surface
111 and the cylinder head. The combustion chamber geometries were defined in this process.
112 Secondly, the design combustion chamber geometries were loaded in the Fire ESE Diesel
113 software in order to build a CFD model. In this instance, the k-zeta-f (Hanjalic et al. 2004;
114 Popovac and Hanjalic, 2007) turbulent model for high Reynolds numbers is adopted in order
115 to describe the flow field inside the combustion chamber. Simple/Piso algorithm (Versteeg and
116 Malalasekera, 1995; Wanik and Schnel, 1989) is very suitable in order to solve the highly
117 unsteady-state flow of the combustion problem. With regard to the fuel injection, the Dukowicz
118 (Dukowicz, 1979) model is applied for handling the heat up and evaporation of the fuel oil
119 droplets. Moreover, Wave (Reitz, 1987) break-up model and Walljet1 (Naber and Reitz, 1988;
120 Cabrera and Gonzalez, 2003) wall interaction models are used respectively. The Eddy break-
121 up model (Spalding, 1971; Magnussen and Hjertager, 1997) is introduced in the combustion
122 calculation. An extended Zeldovich mechanism (Zeldovich et al., 1947) is adopted for the NO_x
123 emission model while a Kinetic mechanism for the soot emission model (Apple et al., 2000;
124 Balthasar and Frenklach, 2005). When the simulation model of the case engine is validated, a
125 parametric study was conducted by using the CFD model built in Fire ESE Diesel software,
126 where the design parameters need to be set as global variables for multi-objective study.
127 Thirdly, the selected parameters were varied in the Fire DVI software, where the previously
128 calculated CFD model was loaded and the response objectives were defined. Subsequently, the
129 Fire Design Explorer software was invoked, where the design variables and their variation
130 ranges, objectives, constraints and MOGA algorithm were specified. The combustion images
131 were processed in the Fire Workflow Manager software.

132 **3 Engine specifications and model verification**

133 **3.1 Engine specifications**

134 The main geometric and performance specifications of the marine medium-speed diesel engine
135 are presented in Table 2. The engine is an in-line, 6-cylinder and four-stroke diesel engine. Its
136 rated speed and power are 1000 r/min and 540 kW, respectively. The spray orifice distribution
137 of the original injector of the mechanical fuel injection system is 9*0.28 mm. The original fuel
138 injector was replaced by an electronic fuel injector of 9*0.23 mm in the HPCR fuel injection
139 system.

140

141 Table 2 Specifications of the engine and fuel injectors

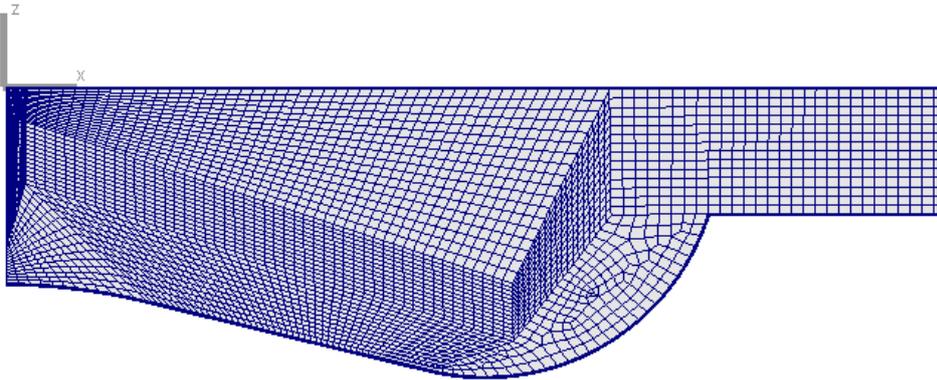
Feature	Value
Engine name	MAN 6L16/24
Cylinder arrangement	In-line
Number of stroke	4
Bore(mm)	160
Stroke(mm)	240
Number of cylinders	6
Rated speed (r/min)	1000
Rated power (kW)	540
SFOC (g/(kW·h))	189
Compression ratio	15.2
Original injector	9*0.28 mm
Electronic fuel injector	9*0.23 mm

142

143 **3.2 Model verification**

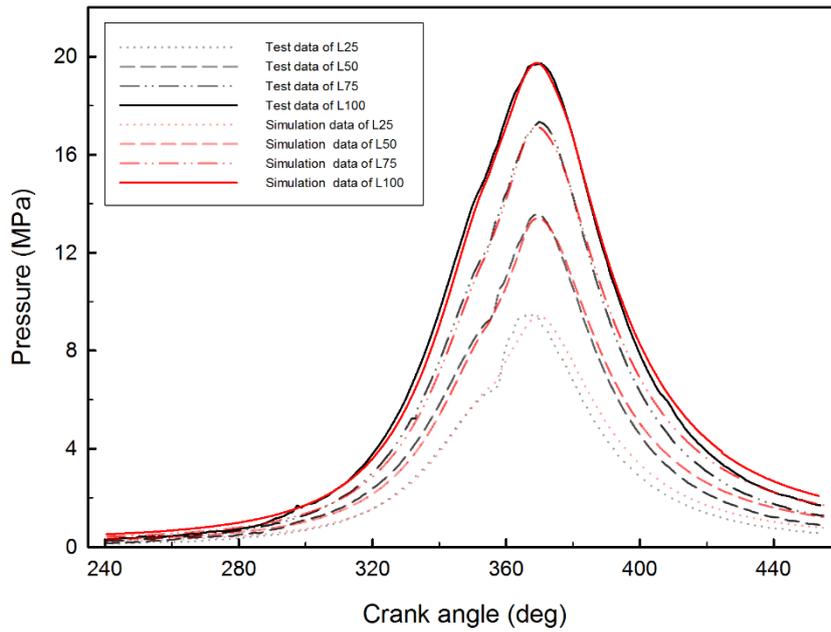
144 The verification was executed at the rated engine speed and under four different engine loads,
145 i.e. under the condition of 1000 r/m at the L25, L50, L75 and L100 loads. In order to improve
146 the convergence at the beginning of the calculation, the initial calculation step is set to 0.2 deg

147 CA. Then, 1 deg CA is adopted at the compression stroke in order to accelerate calculation and
148 save time as well. However, at the injection stage, the precision is emphasised by reducing the
149 calculation step to the 0.2 deg CA again. In the expansion combustion stage, the 0.5 deg CA
150 calculation step is adopted. The mesh of the original combustion shape at TDC is shown in Fig.
151 2.



152
153 Fig. 2 Mesh at TDC

154
155 Fig. 3 shows comparisons of the cylinder pressures between the simulation data and the test
156 data. The cylinder pressure was conveyed into charge signals by a KISTLER 6013C type
157 cylinder pressure sensor and subsequently been conditioned to voltage signals by a charge
158 amplifier before they were acquired by a high-speed data acquisition device. The voltage data
159 was converted back into pressure data in a computer. From the figure, it can be seen that the
160 simulation results match the experimental data well, especially in the combustion stage. In the
161 stages of compression and expansion, the simulation data was a little bit larger than the test
162 data, since the pressure losses induced by leakage were not considered in the simulation model.
163 However, these losses do exist in the authentic diesel engine.

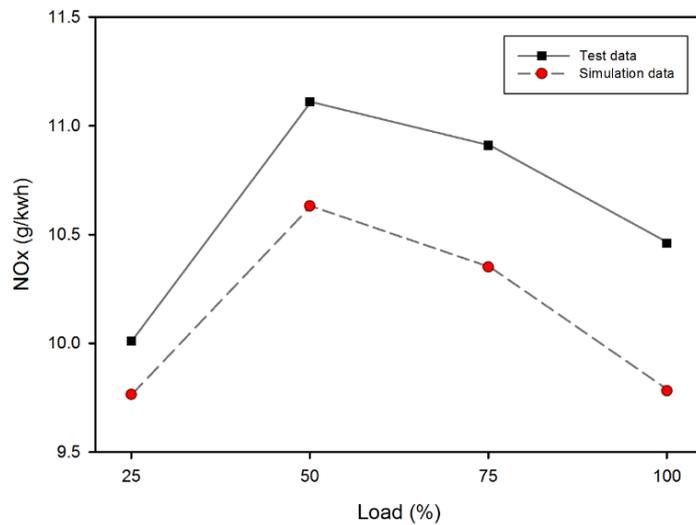


164

165 Fig. 3 Pressure comparisons of the experimental data and the simulation data

166

167 NO_x emissions are also examined at each load. The NO_x experimental data was provided by an
 168 engine producer, who performed the test under the standard D2 test cycle. It can be seen from
 169 Fig. 4 that the main trend of simulation results is corresponding with the test data. The
 170 maximum error between the simulation results and the test data is less than 6.5%, which
 171 occurred at the L100 load. The differences between the experimental and the simulation results
 172 might lie in the effects of test accuracy and test conditions. Sometimes the latter was also
 173 affected by the slight different in the composition of the fuels used in the test and simulation.



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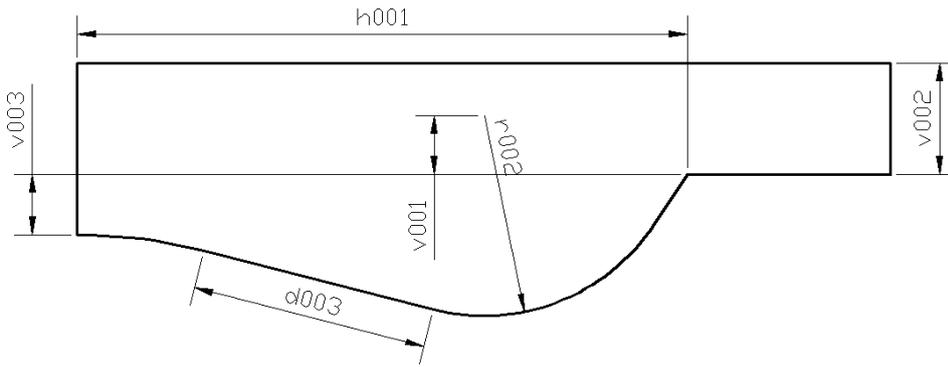
175 Fig. 4 NO_x emissions comparison of test data and simulation data

176

177 The aforementioned discussion indicates that the engine simulation model developed under
 178 FIRE can be used in order to simulate and predict the engine's performance when it is matching
 179 with a common rail injection system.

180 **4 Parametric study**

181 Injection-related parameters refer to the injection timing, the spray angle, the swirl ration and
 182 the nozzle protrusion length, whereas the combustion chamber geometry parameters refer to
 183 the bowl diameter, the toroidal radius and the centre crown height. Fig. 5 demonstrates the
 184 overall shape of the combustion chamber; the bowl diameter is twice the size of the h001. The
 185 toroidal radius is represented by the r002 and the centre crown height is represented by the
 186 v003. Other geometries such as v001, v002 and d003 are adjusted automatically in the software
 187 in order to maintain the same compression ratio.



188

189 Fig. 5 Sketch of the combustion chamber geometries

190

191 The variation ranges of the injection-related parameters and the combustion chamber
 192 geometries used for the parametric study and for the match optimisation are listed in Table 3.

193 The simulation steps are only useful in the parametric study. The baseline design in this
 194 instance refers to the original engine with its mechanical fuel injection system being replaced
 195 by a HPCR fuel injection system. The fuel injector orifice is also changed from 9*0.28 mm to
 196 9* 0.23 mm, whereas other parameters remained the same as in the case of the original engine.

197 The NO_x emissions, soot emissions and SFOC are the three objectives to be minimised.

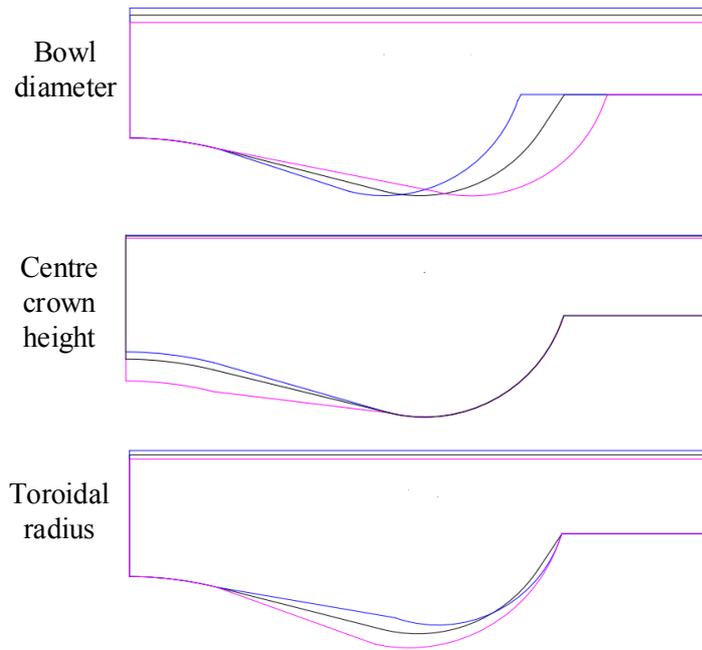
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199 Table 3 Variation ranges of the parameters used for the parametric study and for the match optimisation

Items	Parameters	Baseline	Lower Bound	Upper Bound	Step
Injection-related parameters	SOI, deg BTDC	10	20	0	5
	SR, -	1	0.5	2.5	0.5
	SA, deg	143	131	155	6
	NPL, mm	2.5	1.0	4.0	0.75
Combustion chamber geometries	r002, mm	20	18	22	1
	v003, mm	6	5	9	1
	2*h001, mm	120	108	132	6

200

201 The variation ranges of the three combustion chamber geometries were demonstrated in Fig. 6,
202 where the black line represents the shape of the original and baseline combustion chamber,
203 whereas the green and the pink lines indicate the lower bound and the upper bound of the
204 combustion chamber geometries respectively.



205
206 Fig. 6 Variation ranges of the combustion chamber geometries

207
208 The results of the parametric study are shown in Fig. 7 and Fig. 8. From Fig. 7, it can be seen
209 that the injection timing has the most influence on the objectives. With the increase in injection
210 timing, a monotonic increasing trend of the NO_x emissions is observed. On the contrary, an
211 opposite decreasing trend is observed in the SFOC. The NO_x emissions at 20 degrees BTDC
212 are approximately three times higher than that at the TDC. The SFOC decreases by nearly 20%
213 from the TDC to 20 degrees BTDC. When the injection occurs at the 20 degrees BTDC,
214 sufficient time for fuel vaporisation and fuel-air mixing results in fierce combustion and high
215 temperatures. A high temperature facilitates the generation of NO_x emissions. Fortunately,
216 sufficient mixing is beneficial for a complete combustion, which is good for achieving a high

217 fuel economy and a low SFOC. Conversely, soot emissions, decrease in line with the increasing
218 in injection timing, due to the fact that a complete combustion helps reduce soot formation.

219

220 Inversed impacts at the level of the objectives can be seen with the increase in the spray angle
221 and nozzle protrusion length. In detail, NO_x increases in line with the increase in the spray
222 angle, while soot and SFOC drop at the same time. Larger influences on the soot formation are
223 reported at low engine loads (L25 and L50 loads). When spraying occurred at 131 degrees,
224 most of the fuel was ejected into the bowl area and adhered to the surface of the piston. It was
225 unfavourable for the NO_x formation especially when the piston was going downward, the
226 volume of the combustion chamber expanded and the temperature dropped. Most of the fuel
227 did not burn completely and was exhausted in the form of soot emissions, which explains the
228 higher soot emissions and the deteriorated fuel economy as opposed to the results obtained at
229 any other angles. This kind of phenomenon alleviates greatly with the increase in the spray
230 angle, especially when the injection angle increases to 155 degrees. The fuel was split into the
231 bowl area and the clearance area. A reduced fuel density and enhanced fuel vaporisation
232 contribute to a more homogeneous fuel distribution. Thus, attractive low soot emissions and
233 SFOC were achieved. However, the NO_x emissions were sustained at a high level because of
234 the high temperature under such circumstances.

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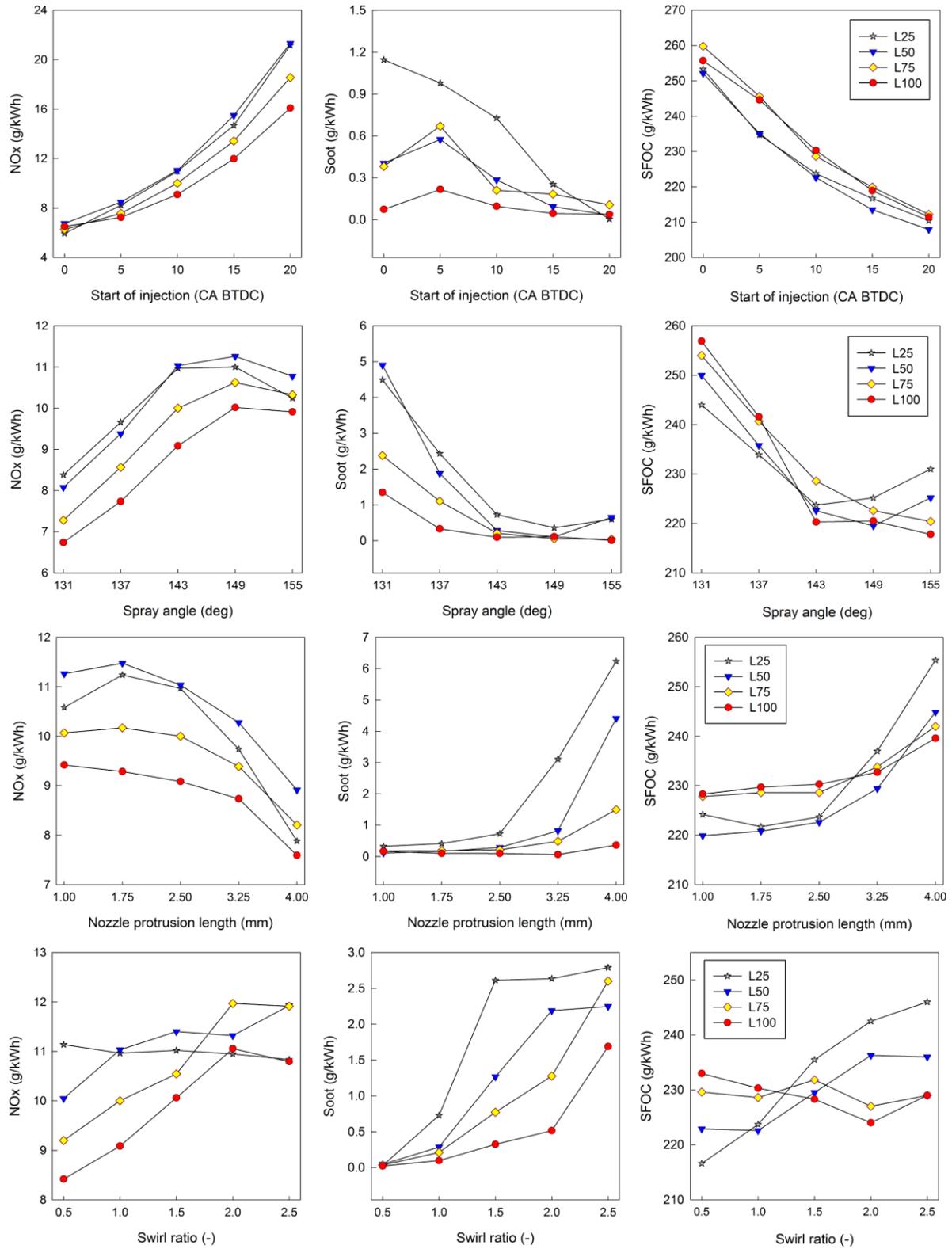
236 As for the influences of the nozzle protrusion length on the objectives, the NO_x emissions
237 decrease along with the increase in the nozzle protrusion length. The lower the load is, the
238 faster the drop rate. The SFOC shows approximately an opposite trend to the NO_x emissions.
239 With regard to the soot emissions, these rise quickly when the nozzle protrusion length
240 becomes larger than 2.5 mm on L25 and L50 loads, while keeps nearly the same on L75 and
241 L100 loads. As the nozzle protrusion length increases, the injection spray targets the bottom

242 area of the bowl. From this point, the effect of increasing the nozzle protrusion length is the
243 same as decreasing the injection angle. More specifically, the distance between the injector and
244 the piston surface exposed to the injection direction becomes shorter, which means that more
245 fuel hits and adheres to the surface of the piston bowl. The fuel on the piston surface is difficult
246 to be burned completely and is then exhausted as soot emissions. Therefore, increasing the
247 nozzle protrusion length increases the soot emissions and the SFOC, but reduces the NO_x
248 emissions slightly, since the low temperature suppresses the NO_x formation in the combustion
249 process.

250

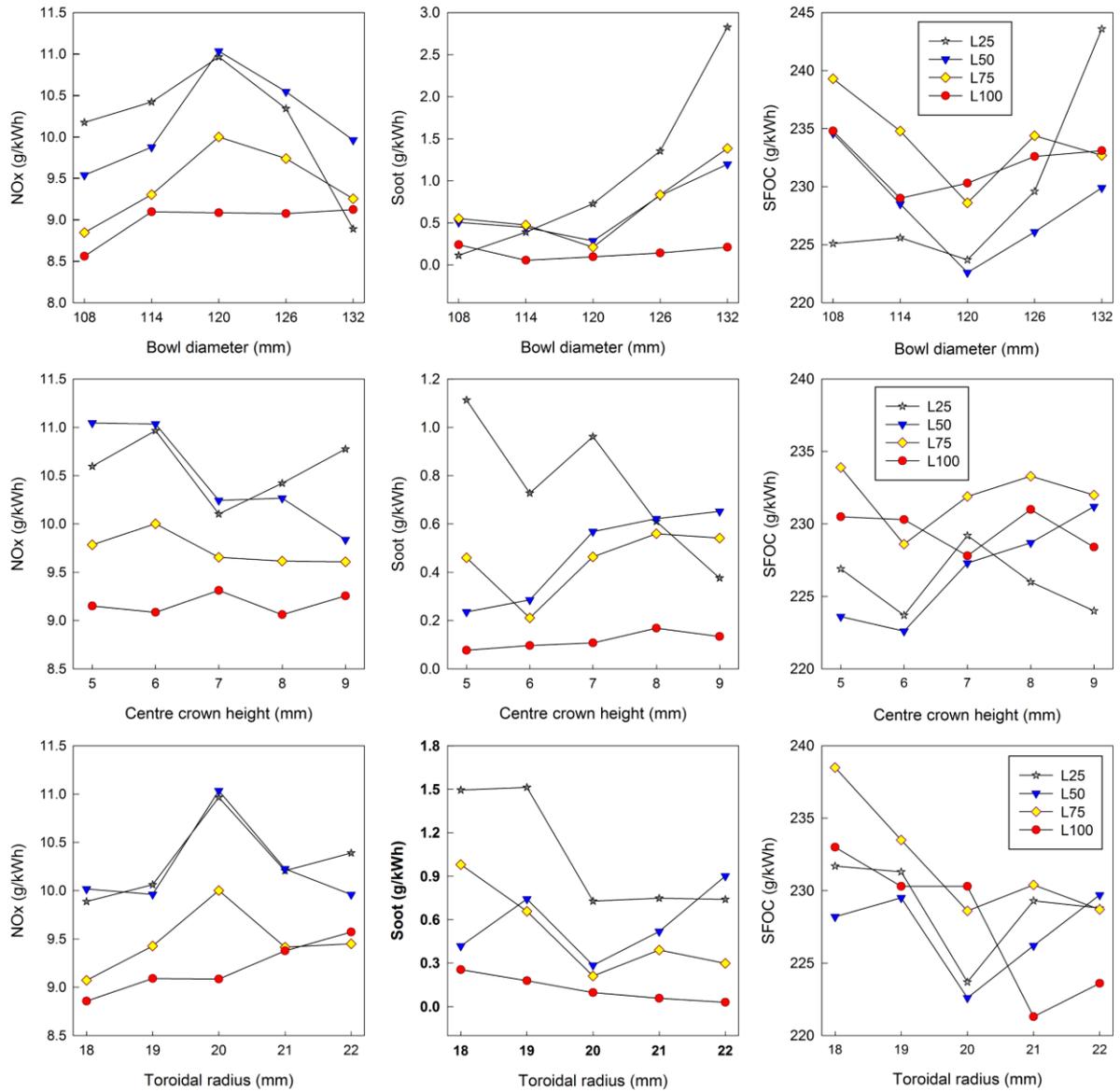
251 The effects of swirl ratio on the emissions and on the fuel consumption are also not negligible.
252 The NO_x emissions increase in line with the increase in the swirl ratio at high loads (L75 and
253 L100 loads). However, the NO_x emissions remain nearly the same at low loads. For soot
254 emissions, an increasing trend is observed as the swirl ratio increases. The SFOC reports an
255 increasing trend at low loads. However, the SFOC is not affected much by the swirl ratio at
256 high loads. In theory, a strong swirl reduces the ability of the fuel penetration, however, when
257 the swirl is too strong, this can be unfavourable for ignition, which in turn delays the
258 combustion process. Thus, some fuel is incompletely burned off before being exhausted, which
259 causes high soot emissions and SFOC. However, a moderate swirl ratio promotes the fuel-air
260 mixing, which is better for reducing soot emissions and SFOC.

261



262

263 Fig. 7 Influences of the injection-related parameters on the objectives



264

265 Fig. 8 Influences of the combustion chamber geometries on the objectives

266

267 From Fig. 8, in general, it may be inferred that the bowl diameter and the toroidal radius have

268 a larger impact on the objectives as opposed to the centre crown height. The bowl diameter

269 mainly affects the objectives under low loads, whereas the NO_x emissions increase in line with

270 the increase in the bowl diameter and reach a peak when the bowl diameter is 120mm before

271 they gradually decline. An opposite trend is witnessed for the SFOC. With regard to soot

272 emissions, they were little affected by the bowl diameter at the L100 load. Soot emissions

273 decrease in line with the increase in the bowl diameter and meets a valley when bowl diameter

274 is 120 mm, then increase to nearly three times of their original value. A small bowl diameter
275 means that more fuel hits on the surface of the piston and adheres hereto, thus, some fuel is not
276 able to evaporate and atomise in time, which leads to an incomplete combustion. This explains
277 why soot emissions and SFOC were high when the bowl diameter was small. At the same time,
278 the low maximum temperature of the incomplete combustion circumstance is unfavourable for
279 the formation of NO_x emissions. When the bowl diameter increases, the incomplete combustion
280 alleviates, the temperature rises, soot emissions and SFOC decrease and NO_x emissions
281 increase at the same time. This trend reverses when the bowl diameter is larger than 120mm.
282 A large bowl diameter implies a longer distance between the fuel injector and the surface of
283 the piston bowl area. Most of the fuel is injected targeting solely the bowl area of the piston in
284 order to form a high-density mixture, which is not favourable for a complete combustion.
285 Meanwhile, it encourages soot formation and leads to high levels of the SFOC. At the same
286 time, a slightly low maximum temperature is achieved in order to generate a reduced number
287 of NO_x emissions, by making a comparison with the moderate bowl diameter case.

288

289 With the increase in the toroidal radius, the NO_x emissions increase slowly, whereas the
290 opposite may be observed in the case of the soot emissions and SFOC decrease slowly. No
291 obvious trends were seen for the influences of the centre crown height on the objectives, and
292 thus, the centre crown height has a limited impact on the objectives.

293

294 From the discussion above, one has to notice that the injection related parameters have a more
295 significant influence on emissions and fuel consumption as opposed to the combustion chamber
296 geometries. It explains why marine medium-speed diesel engines rely on the injection spray in
297 order to improve their fuel-air mixing. This type of features differentiates marine medium-
298 speed diesel engines from the small size engines, in which re-entrant combustion chambers are

299 frequently adopted in order to promote fuel-air mixing during high-speed operations (Wickman
300 et al., 2001 and Taghavifar et al., 2014).

301

302 The parametric study indicates the impacts of the injection-related parameters and the
303 combustion chamber geometries on emissions and fuel consumption independently. It is easy
304 to find the best value for each parameter under such conditions, however, whether these best
305 parameters would form a good design or not still remains uncertain. Under these circumstances,
306 a further study was carried out using a global optimisation method referred to as MOGA in
307 order to seek an optimal design, which meets the IMO Tier II emission regulations and which
308 has the best fuel economy. The optimisation study was conducted only at L100 load due to the
309 time consuming CFD calculation process.

310

311 **5 Optimisation with the MOGA method**

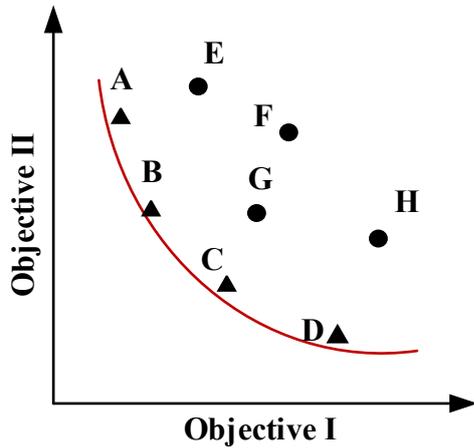
312 **5.1 Optimisation method**

313 The GA is based on the idea of the natural selection which obeys the law of ‘survival of the
314 fittest’. It can continually improve the average fitness level of a population by means of
315 inheritance, mutation, selection and crossover. Eventually, the optimisation process leads to an
316 optimal design (Senecal et al. 2002). MOGA is the modification version of the GA in order to
317 find a set of multiple non-dominated solutions in a single run (Konak et al., 2006).

318

319 The Pareto optimum is often adopted in the case of a multi-objective optimisation process, as
320 shown in Fig. 9. Cases A-D can be considered as Pareto optimal cases due to the fact that none
321 of them outperformed by the other cases. These cases can be grouped together in order to form
322 a Pareto front (Shi and Reitz, 2008). The Pareto optimality can be defined as: For all designs

323 and the corresponding N objectives $f_k(\vec{x}_j)$, where, $K=1, 2, \dots, N$, the Pareto design \vec{x} is defined
 324 as follows: for an arbitrary design j , there is at least one objective, k , which meets the condition
 325 $f_k(\vec{x}_j) \leq f_k(\vec{x}_j)$. MOGA's mission is to find the Pareto front while maintaining diversity in
 326 the results (Salvador et al. 2014; Ge et al., 2009).



327
 328 Fig. 9 Definition of the Pareto optimum

329

330 5.2 Optimisation settings

331 The variation ranges of the parameters are the same with the ones used in the parametric study,
 332 as shown in Table 3. The optimisation settings of the MOGA method are listed in Table 4. The
 333 distribution for the crossover and for the mutation probabilities are both set as the default value
 334 10. The generation number of 10 and the population size of 20 are adopted here. This means
 335 that a total of 200 cases are generated and calculated by means of the MOGA method. Usually,
 336 the crossover probability and mutation probability are set to 0.7 and 0.1, respectively.

337

338 Table 4 Optimisation setting of the MOGA method

Property	Value
Distribution for crossover probability	10.0

Distribution for Mutation Probability	10.0
Number of Generations	10
Population size	20
Crossover Probability	0.7
Mutation Probability	0.1

339

340 **5.3 Results discussion**

341 Fig. 10 and Fig. 11 show the optimisation results of the L100 load by using the MOGA method.

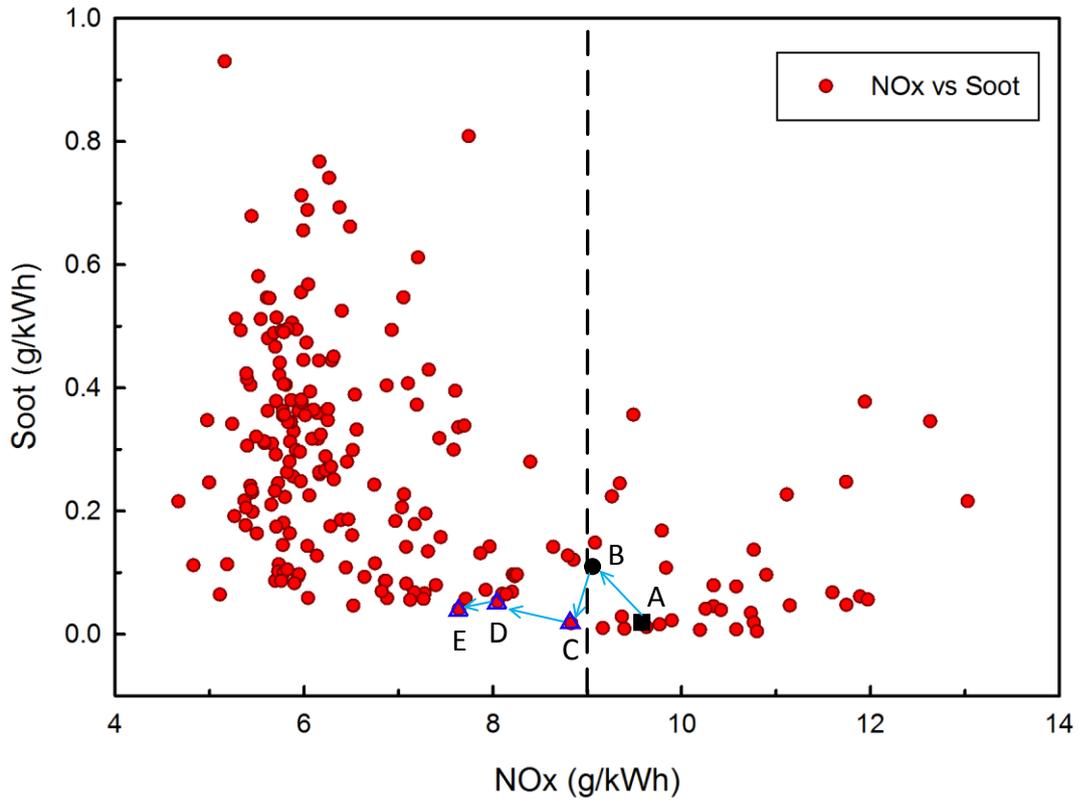
342 The black dot lines indicate the Tier II emission limit for the case engine. The black square
 343 point A represents the original engine, and the black solid circle B represents the baseline

344 engine. The blue hollow triangles marked C, D and E are the selected Pareto optimal designs.

345 From the figure, it can also be noticed that even the best NO_x design point still cannot meet the

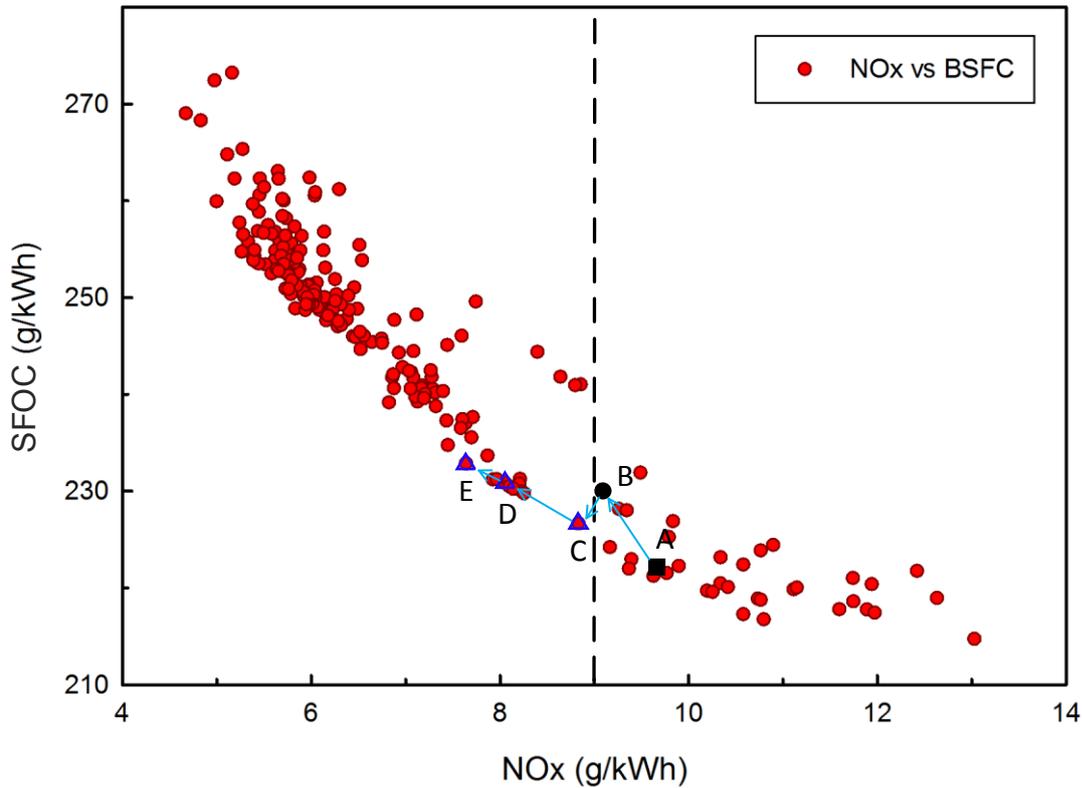
346 IMO Tier III regulation, which requires the NO_x emissions to be lower than 2.26 g/kWh for the

347 case engine.



348

349 Fig. 10 NO_x emissions vs. the soot emissions of the L100 load



350

351 Fig. 11 NO_x emission vs. the SFOC of the L100 load

352

353 Table 5 gives objectives' values of the original engine, baseline and selected Pareto optimal
 354 designs. The corresponding design parameters are shown in Table 6. Compared to the original
 355 engine, it can be seen that the baseline design reduced nearly 7% of the NO_x emissions, but it
 356 still fails to comply with the IMO Tier II regulations. Besides, it has a penalty of a 5 time'
 357 increase of soot emissions and a 2.7% increase of SFOC than the original engine. The Pareto
 358 optimums C, D and E meet the requirement of the IMO Tier II regulations on the L100 load in
 359 addition to also having low soot emissions as well. Comparisons of their performance under
 360 the other three engine loads (L75, L50 and L25 loads) were also carried out for inspection. The
 361 results are shown in Fig. 12, Fig. 13 and Fig. 14.

362

363 Table 5 Comparisons of the optimisation objectives of the L100 load

L100 load	NO _x (g/kWh)	Soot (g/kWh)	SFOC (g/kWh)
Original type	9.78	0.016	224
A			
Baseline B	9.09	0.096	230
Optimum C	8.83	0.017	227
Optimum D	8.05	0.053	231
Optimum E	7.64	0.041	233

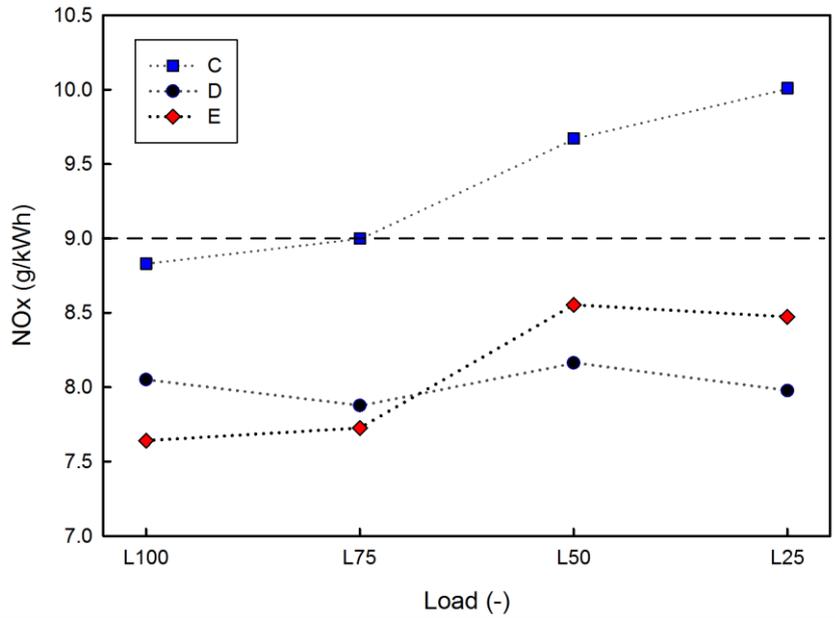
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365 Table 6 Comparisons of the design parameters

Design	SOI (CA)	Swirl ratio	Spray angle (deg)	Nozzle protrusion length (mm)	Bowl diameter (mm)	Height centre crown (mm)	of Toroidal radius (mm)
Original type	10	1	143	2.5	120	6	40
A & Baseline B							
Optimum C	12	0.54	151	2.4	116.64	6.73	40.80
Optimum D	9	0.98	151	3.4	118.41	6.24	40.58
Optimum E	9	0.56	151	3.4	118.28	6.66	40.58

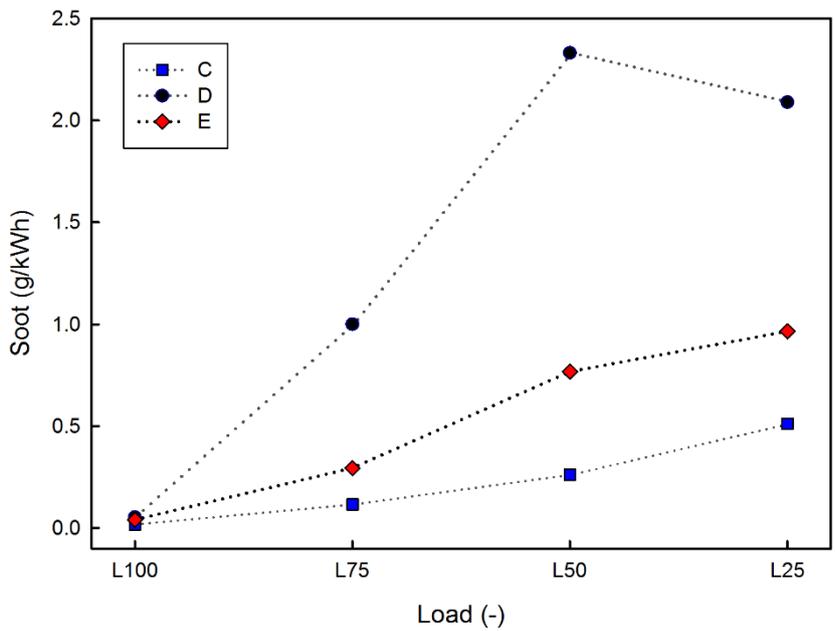
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367 Fig. 12 shows that the optimums D and E perform well in NO_x emissions which meet the IMO
368 Tier II emission regulations. Conversely, the optimum C fails, despite having the lowest soot
369 emissions and SFOC, as shown in Fig. 13 and Fig. 14. Optimum D and optimum E show
370 negligible differences in soot emissions and SFOC at the L100 load, but optimum D performs
371 poorly in other engine loads, i.e., soot and SFOC increase greatly with the decrease in the
372 engine load. On the contrary, optimum E behaves steadily and thus constitutes to be the best
373 choice.



374

375 Fig. 12 NO_x comparisons of the selected Pareto optimums in all four engine loads



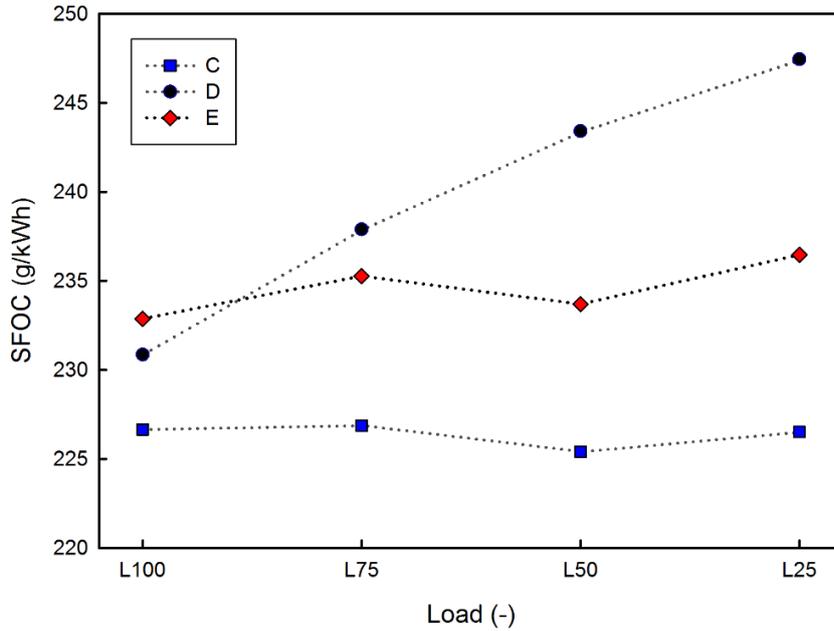
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Fig. 13 Soot comparisons of the selected Pareto optimums in all four engine loads



383

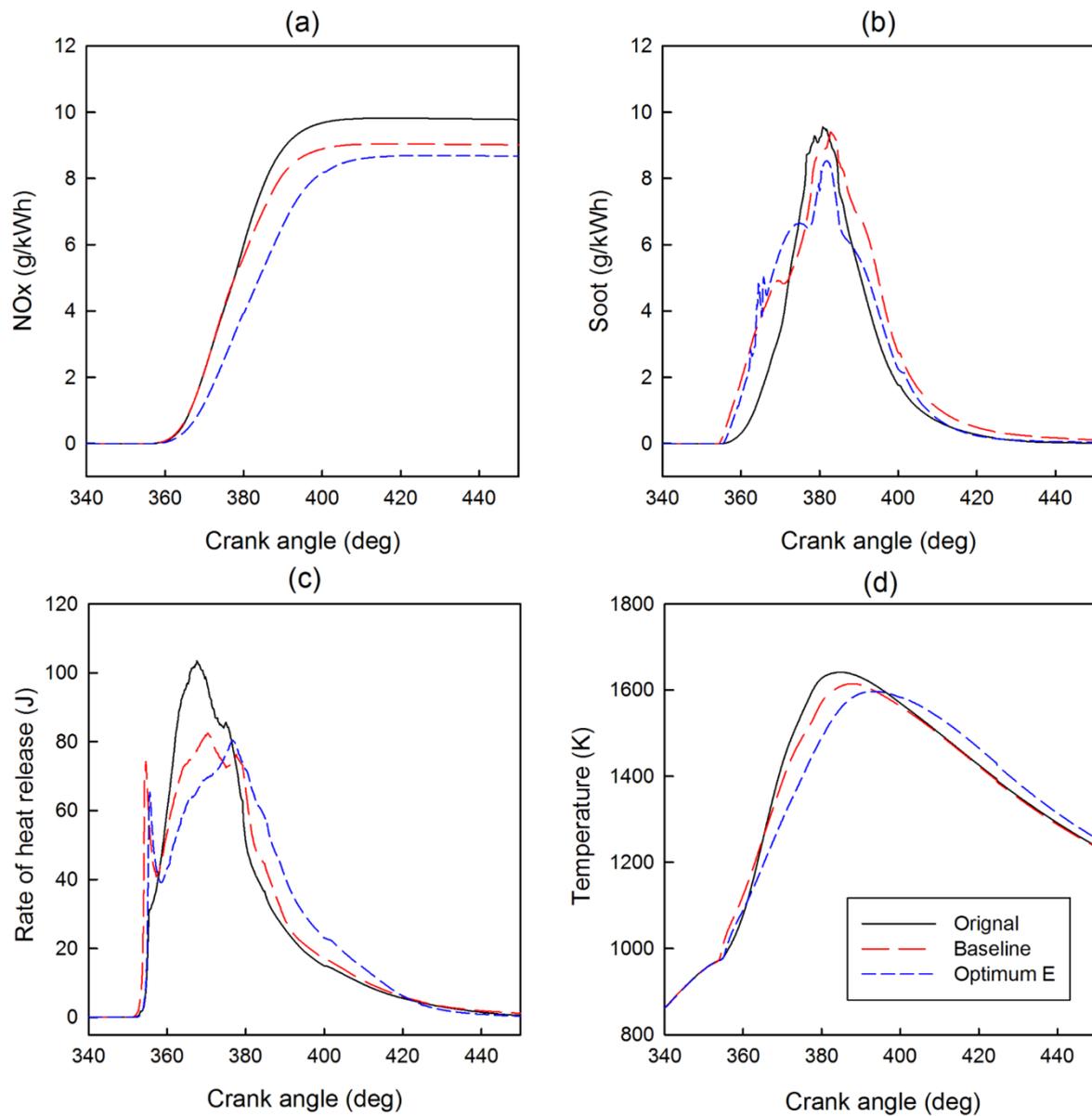
384 Fig. 14 SFOC comparisons of the selected Pareto optimums in all four engine loads

385

386 Fig. 15 gives the detailed information about the combustion progress comparisons. It can be
 387 clearly seen from Fig. 15 (c) that the rate of heat release of the original engine is much higher
 388 than that of the baseline design and of the optimum E. It leads to a higher combustion
 389 temperature which is favourable for the NO_x formation, and thus the NO_x emission level is
 390 higher than the baseline and the optimum E design, as shown in Fig. 15 (a) and (d). In the case
 391 of optimum E, the rate of heat release lasts longer, which means that the highest temperature
 392 in the combustion chamber is lower than the baseline design. Lower temperature suppresses
 393 the formation of NO_x, and as a result, the NO_x emission level is the lowest among the three
 394 designs. The soot formation of the baseline design is much higher than other designs, answers
 395 can be obtained the form Fig. 16, which indicates that at 60 degrees after the TDC, there is still
 396 a large quantity of fuel gathering around the piston bowl area and the top surface of the
 397 combustion chamber. It led to an incomplete combustion, and also to the high soot formation
 398 and high SFOC. On the contrary, optimum E gained a more homogeneous fuel distribution,
 399 which helps reduce the soot formation.

400

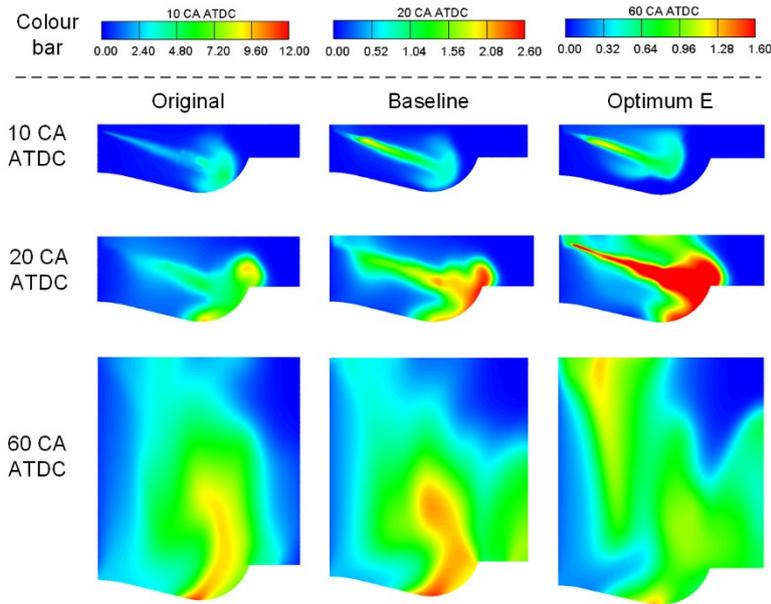
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402

403 Fig. 15 Detailed comparisons of the original, baseline and optimum E designs

404



405

406 Fig. 16 CFD comparisons of the original, baseline and optimum E designs

407 6 Conclusions

408 The parametric study was conducted in order to investigate the effects of four injection-related
 409 parameters and three combustion chamber geometries on NO_x emissions, soot emissions and
 410 SFOC respectively. Then, the MOGA method was introduced in order to find an optimal design
 411 which meets the IMO Tier II emission regulations and meanwhile has the best fuel economy.
 412 In this instance, the performance of three selected Pareto designs C, D and E of the L100 load
 413 were compared and examined under the other L75, L50 and L25 engine loads. The optimum E
 414 outperforms other selected Pareto designs. Finally, the original, baseline and optimum E
 415 designs were extensively compared in details in order to dig the reasons why optimum E
 416 performs better. The main conclusions are listed as follows:

417

418 (1) Injection-related parameters have more significant impacts on the objectives as opposed to
 419 the combustion chamber geometries within the research scope.

420 (2) Injection timing has the greatest impact on the objectives, especially on the NO_x emissions.

421 (3) Low NO_x emissions prefer the late injection and the low swirl.

422 (4) The MOGA method is an effective way to solve the problem of the fuel injector match with
423 the combustion chamber by providing a set of Pareto designs.

424 (5) A routine is presented for finding a Pareto optimum which meets the IMO Tier II emission
425 regulations and also maintains the best fuel economy.

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