



NTNU – Trondheim
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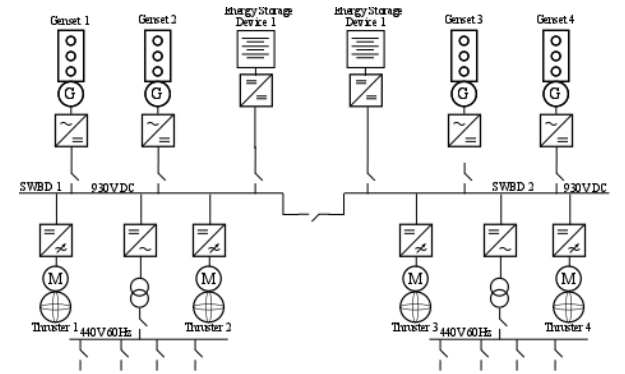
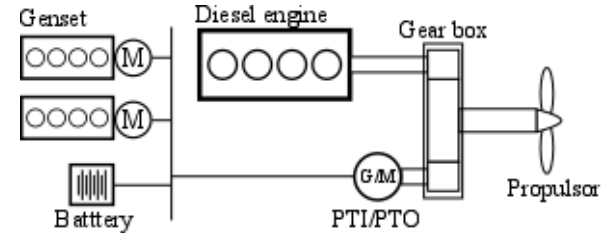
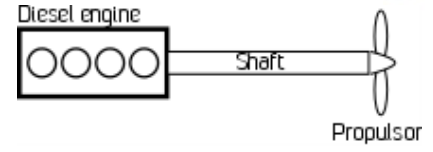
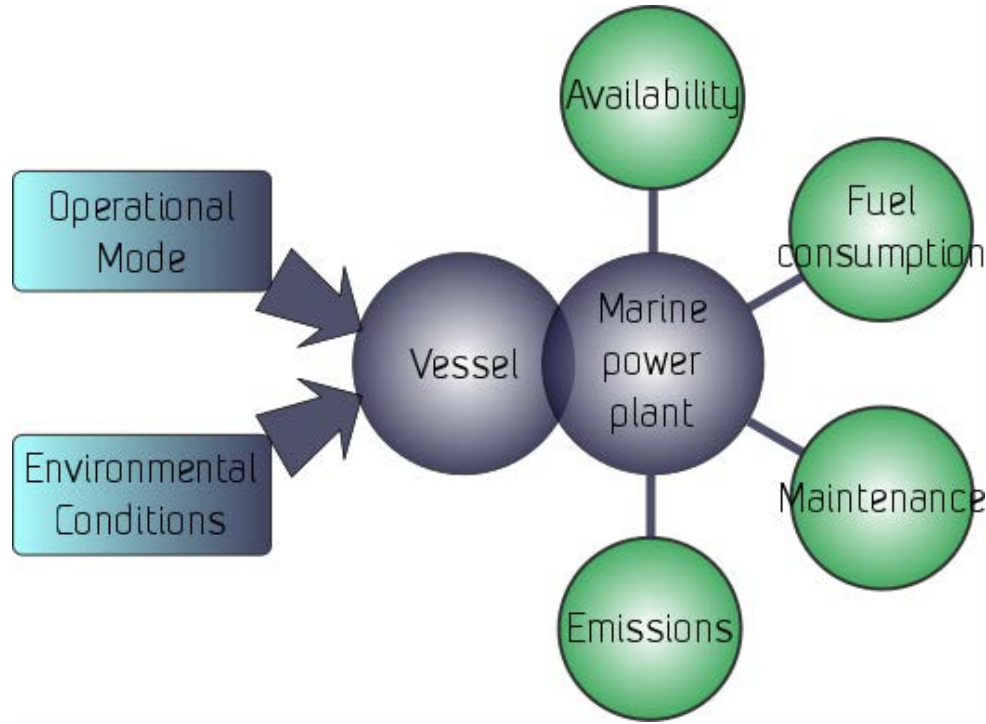
Transient Performance and Emissions of Turbocharged Diesel Engines for a Marine Power Plant

Numerical Simulation and Experimental Investigation

Introduction

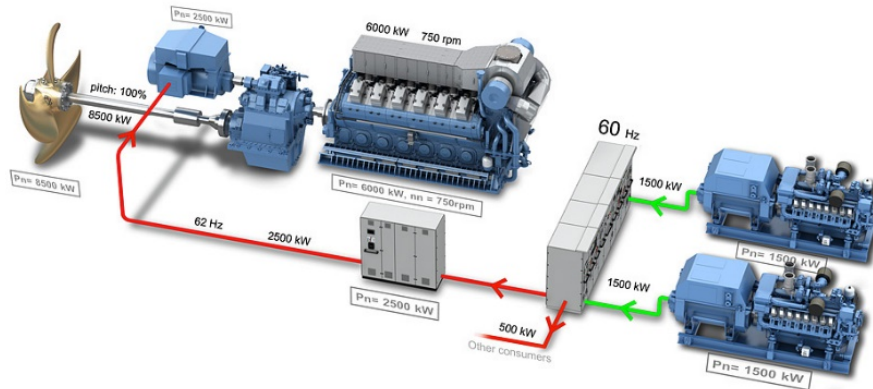


Marine Power / Propulsion Plant



Industry and Research Trend

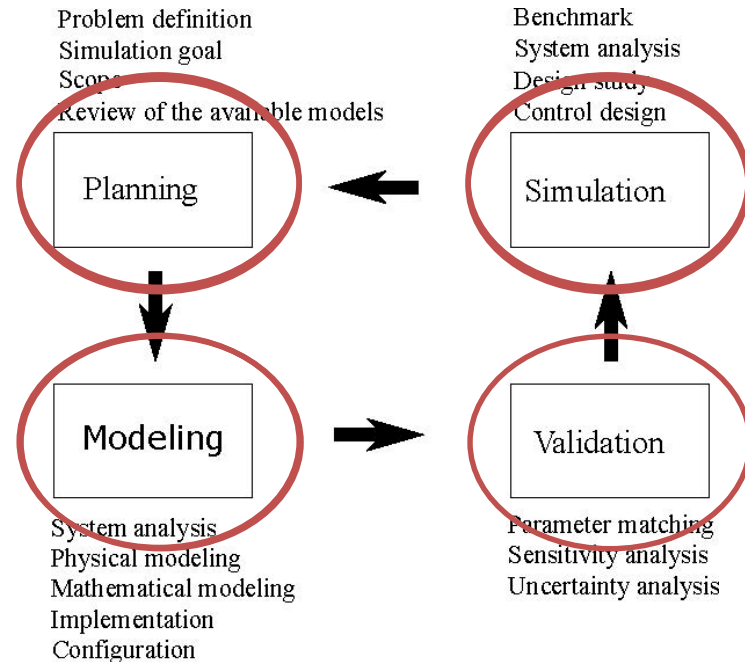
- Hybrid Power System
- System integration
- Simulation based design and analysis



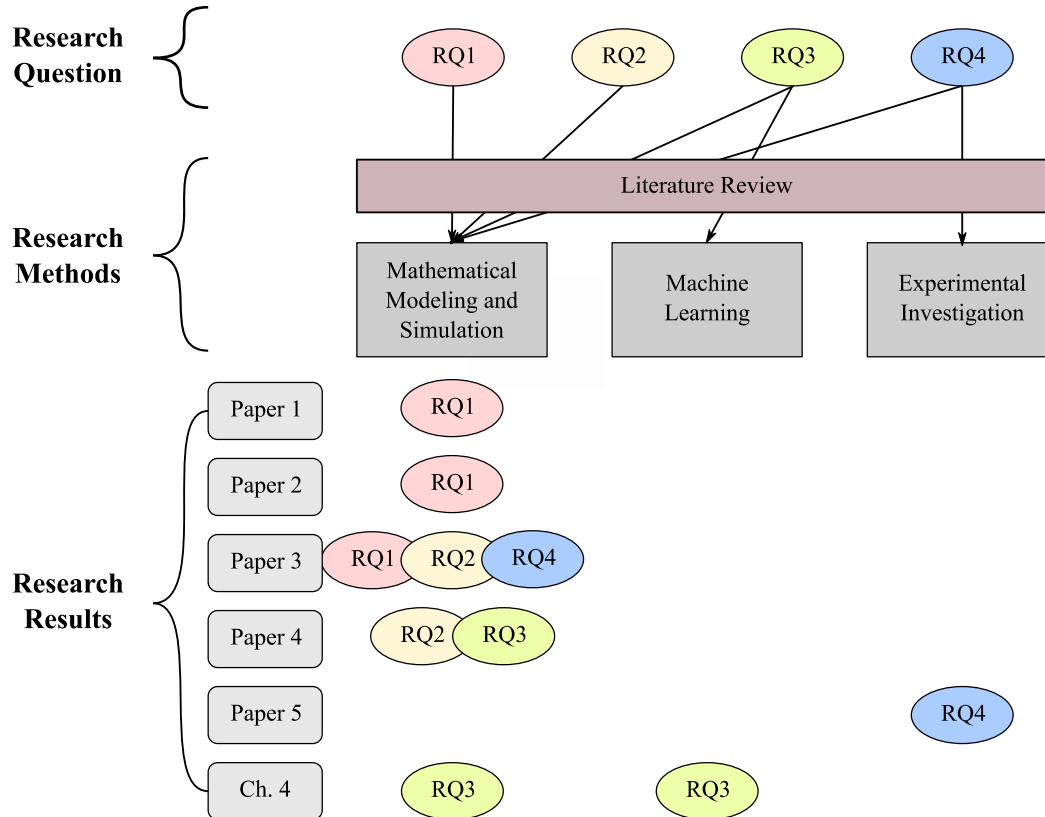
Research Questions

How can one build a mathematical model of a turbocharged diesel engine for various contexts of marine propulsion or power systems?

What are the practical and theoretical aspects of the development of a mathematical model of a turbocharged diesel engine for various contexts of marine propulsion or power systems?



Research Methods and Results

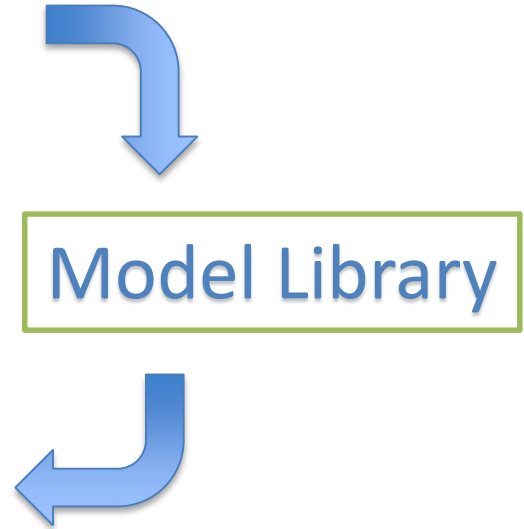
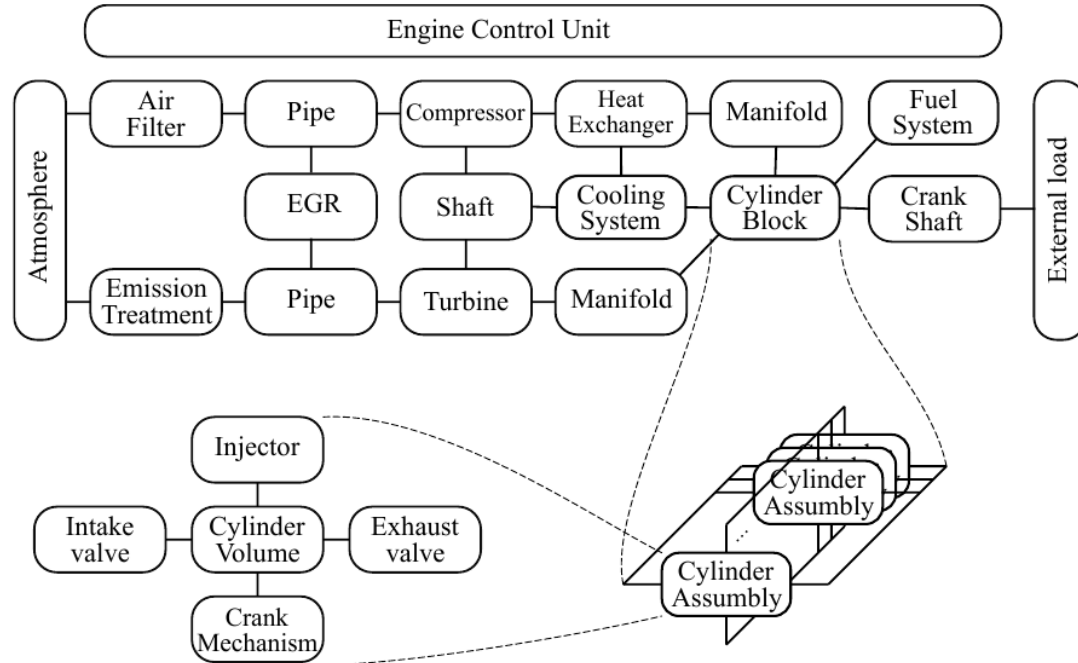


Modeling Framework for a Turbocharged Diesel Engine



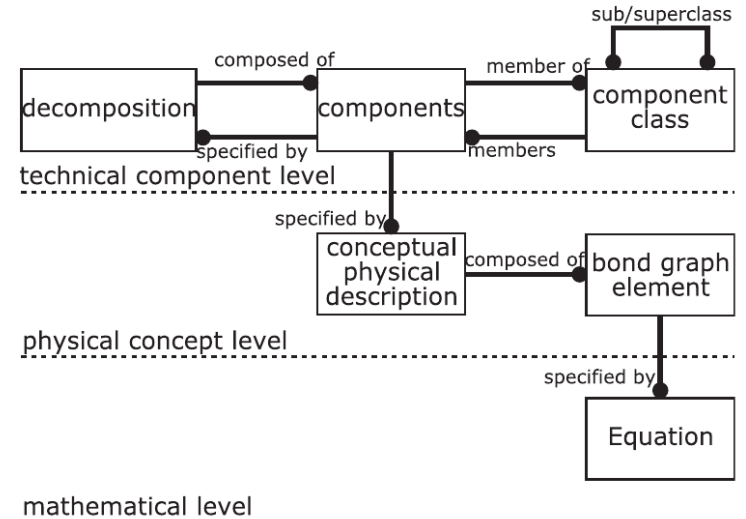
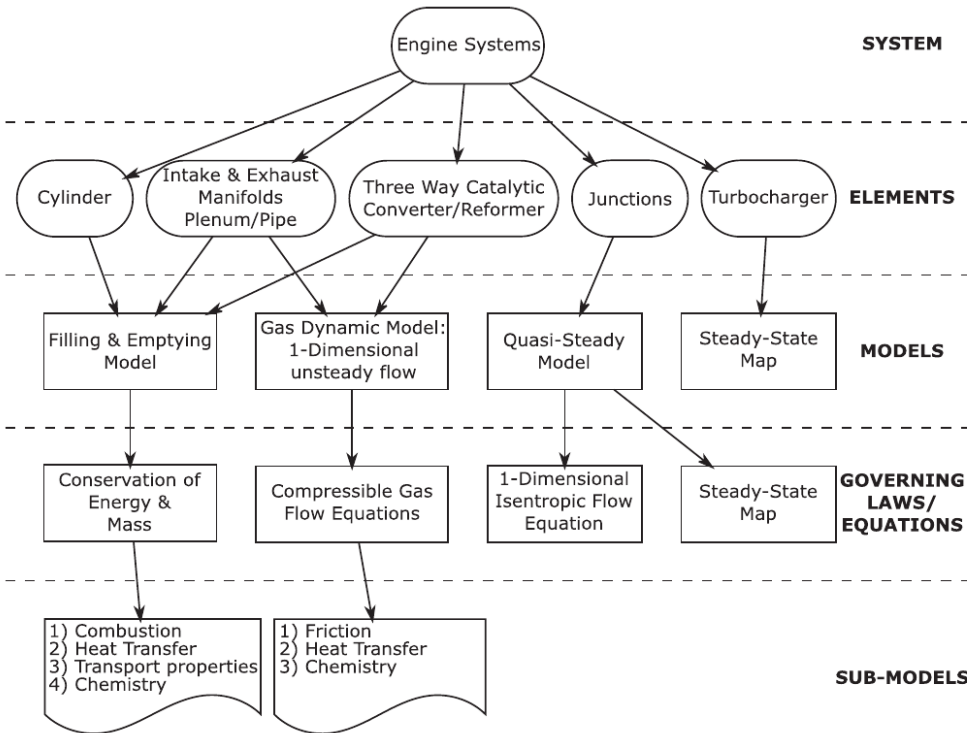
Hierarchical Structure of System Models

- Technical composition

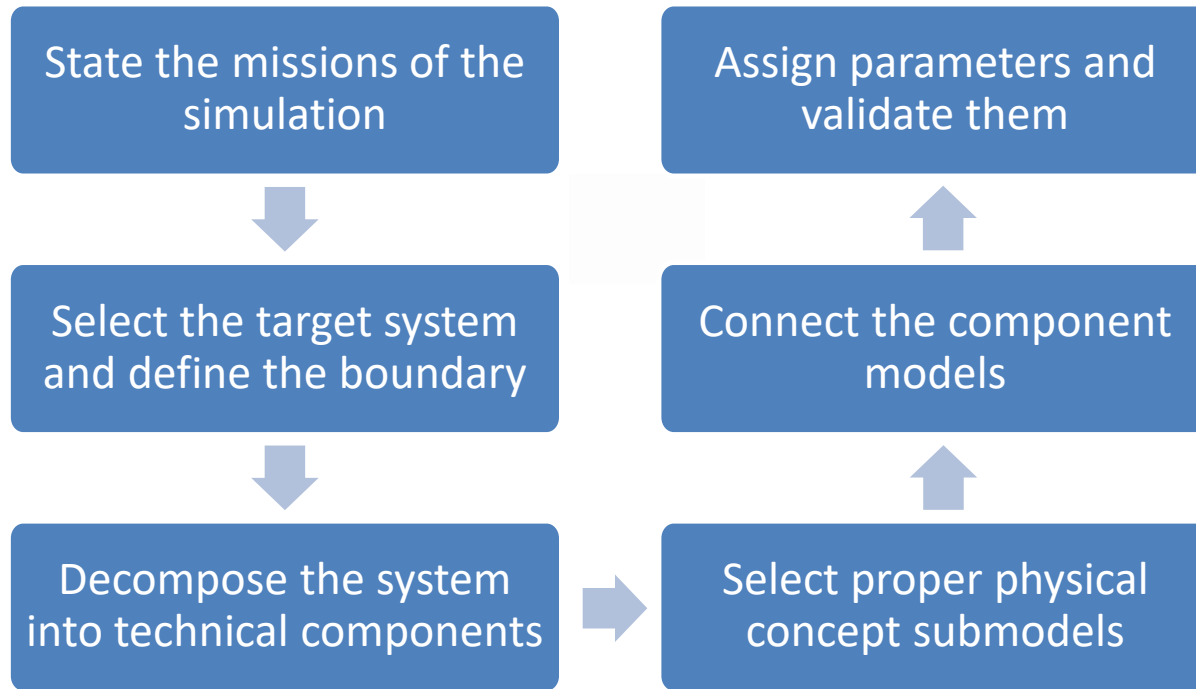


Hierarchical Structure of System Models

- Level of Abstraction



Procedure for building a system model from the model library

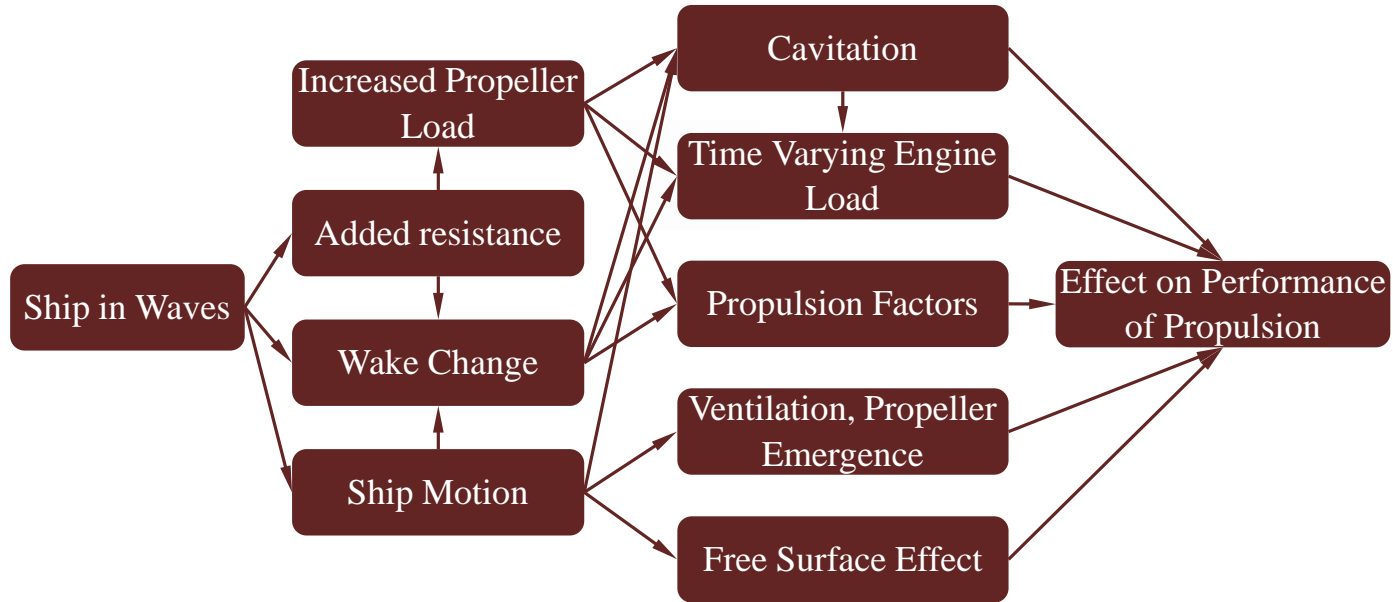


Diesel Engine Models for Propulsion System Simulation in Waves



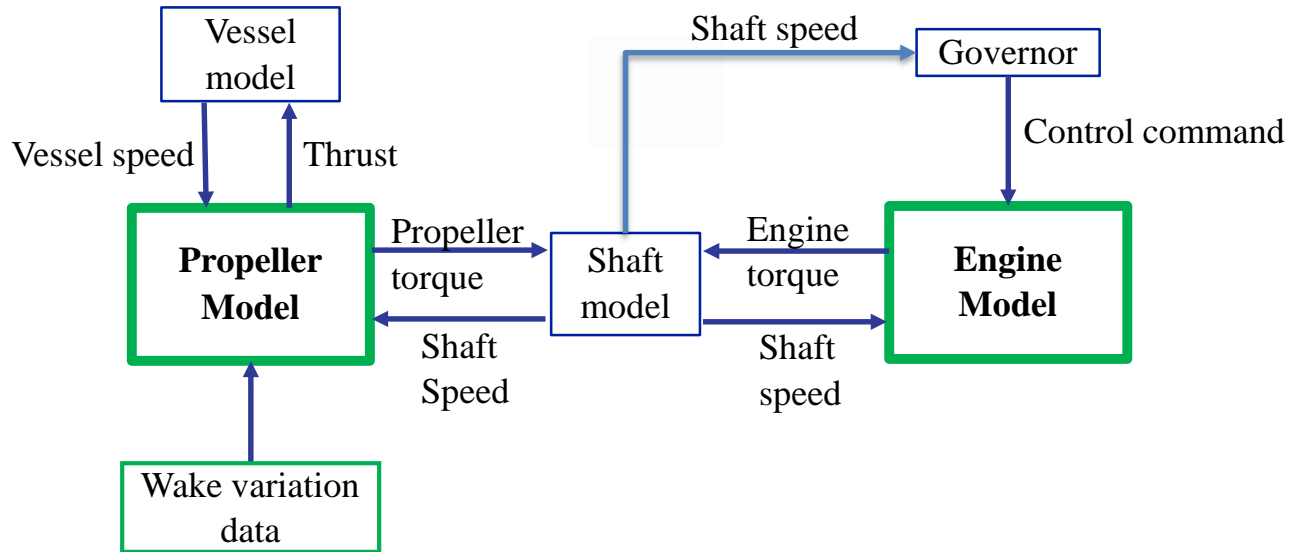
Motivation – Propulsion in Waves

- Propulsion in Waves

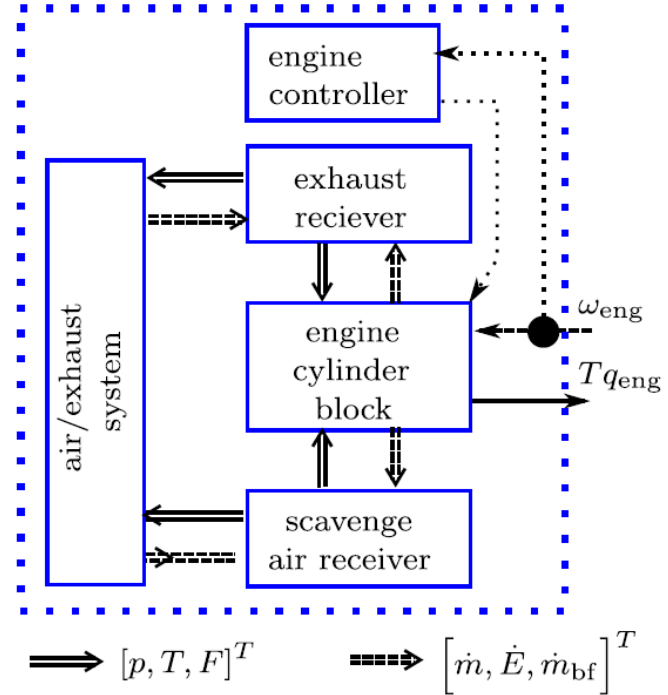
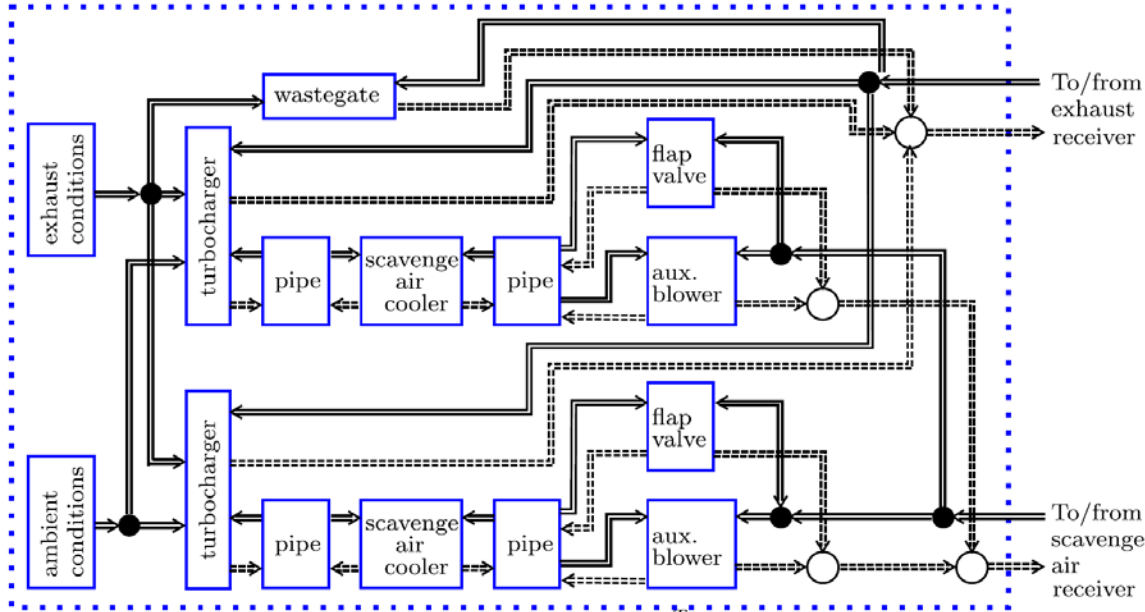


Coupled Engine Propeller Model

- Develop a hull-propeller-diesel engine simulator
- Understand the system dynamics in propulsion in waves
- Compare the transient fuel consumption with the steady-state mapping value



Engine Model Structure



Engine Model

- Modeling framework

Components		Process	Submodel
Engine Cylinder	Control volume	Thermodynamic states	0D single zone
		Heat transfer	Convection only
	Scavenge port	Mass flow	Isentropic comp. flow
	Exhaust valve	Valve lift	A look up table
		Mass flow	Isentropic comp. flow
	Crank mechanism	Transformation	Kinematics only
Gas exchange	Scavenging	Empirical model (S-shape model by Sher)	

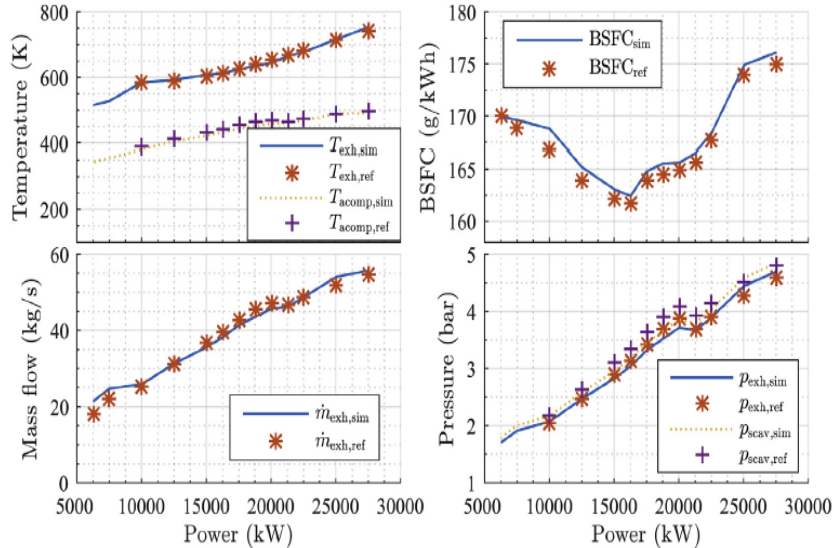
Case Vessel – KVLCC2

CFD and experimental wake data available for the KVLCC2 hull in three different wavelengths i.e. $\lambda/L = 0.6, 1.1$ and 1.6

Ship Particulars		Propeller Particulars		Engine Particulars	
Lbp (m)	320.0	D (m)	9.86	Model	Wartsila 8RT-flex68D
Lwl (m)	325.5	No of blades	4	Bore (mm)	680
Bwl (m)	58.0	Hub diameter (m)	1.53	Rated MCR (kW)	25,040
Depth (m)	30.0	Rotational speed (RPM)	95	Speed at rated power (RPM)	95
Draft (m)	20.8	A_e / A_0	0.431	Stroke (mm)	2720
∇ (m ³)	312622	(P/D)mean	0.47	Mean Effective Pressure (bar)	20
C_B	0.8098	Skew (°)	21.15	Number of cylinders	8
V (kts)	15.5	Rake (°)	0	Turbocharger	2 x ABB A175-L35

Validation of the model

- Steady-state



Main parameters for adjustment

- Valve timing, injection timing
- Turbine, compressor map

- Transient – no data to fit

– Sensitivity analysis

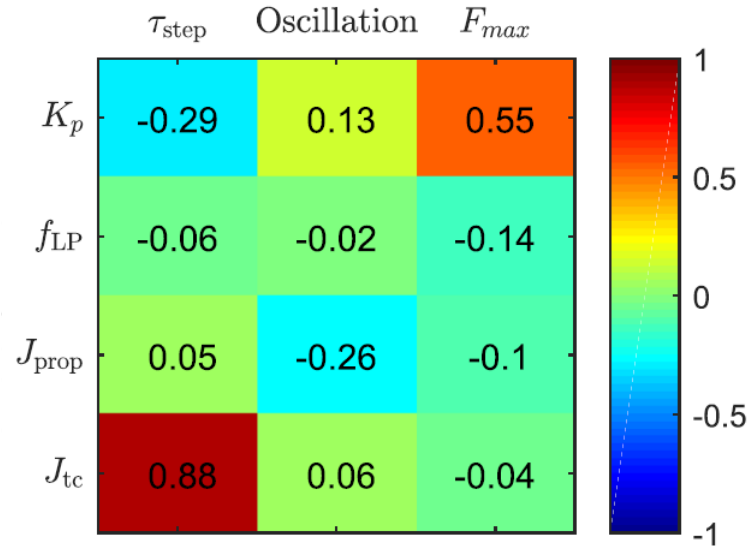
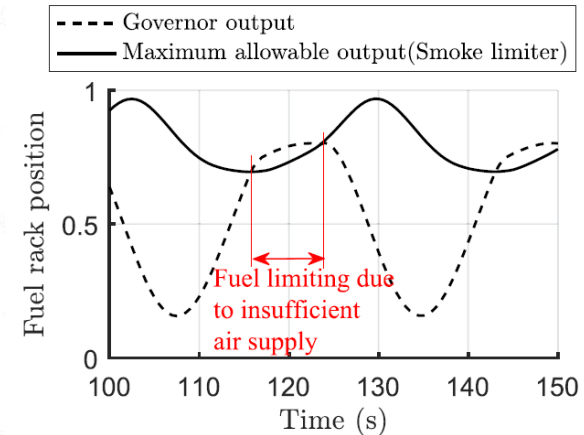
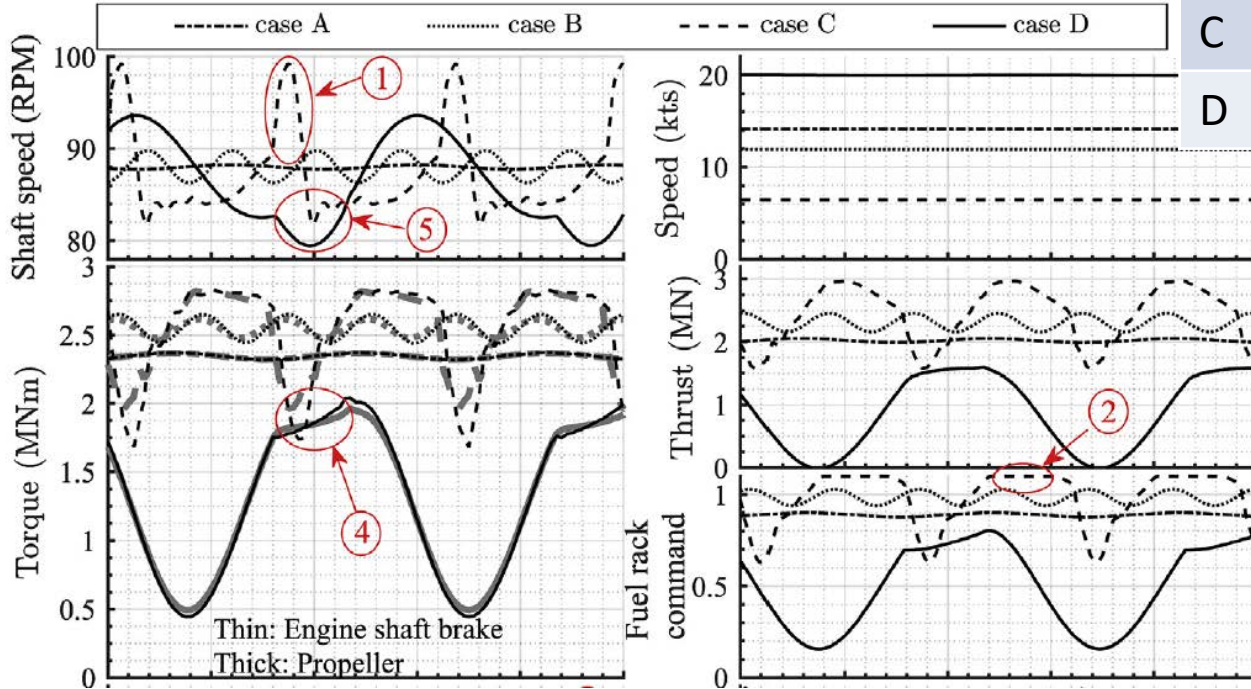


Fig. 20. Correlation matrix for the step response analysis.

Simulation Results

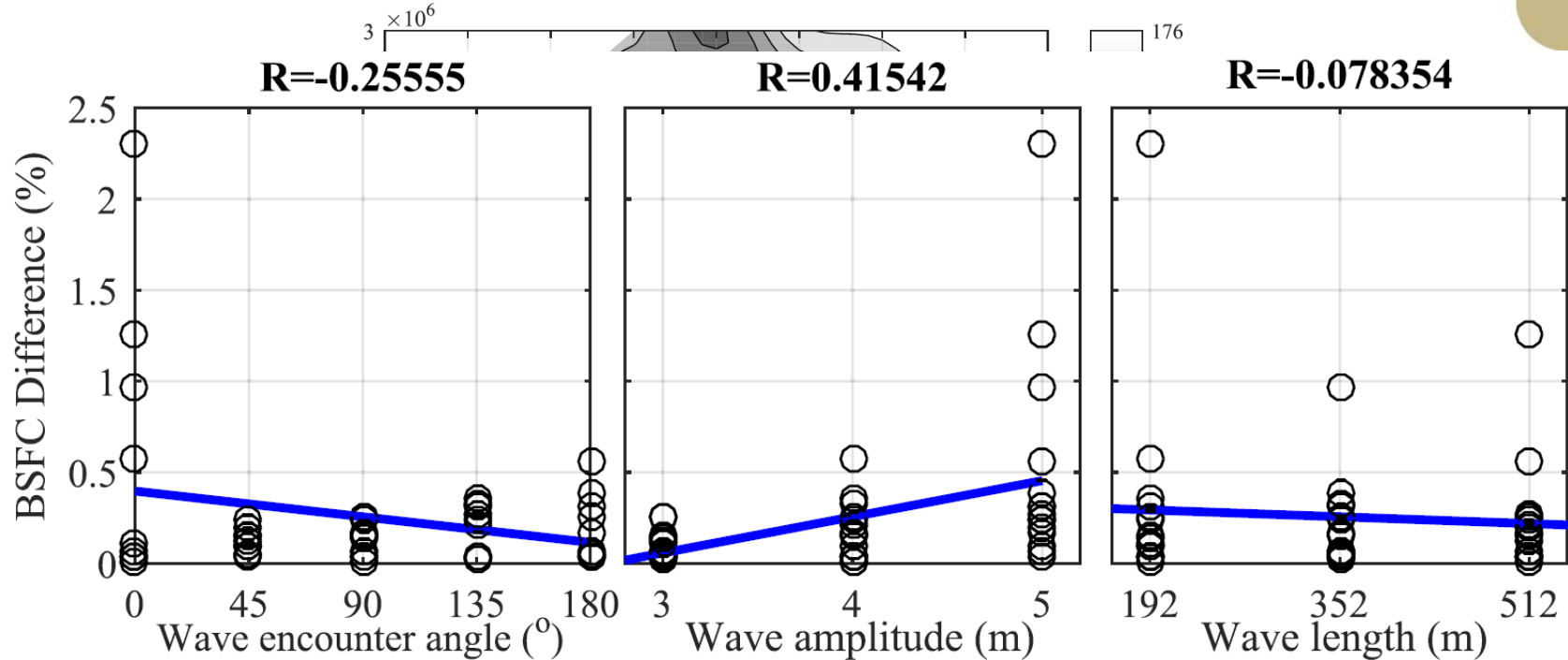
- System dynamics

Case	H (m)	λ (m)	χ ($^{\circ}$)
A	3	512	90
B	3	192	180
C	5	512	180
D	5	192	0



Simulation Results

- Transient simulation vs. steady state mapping

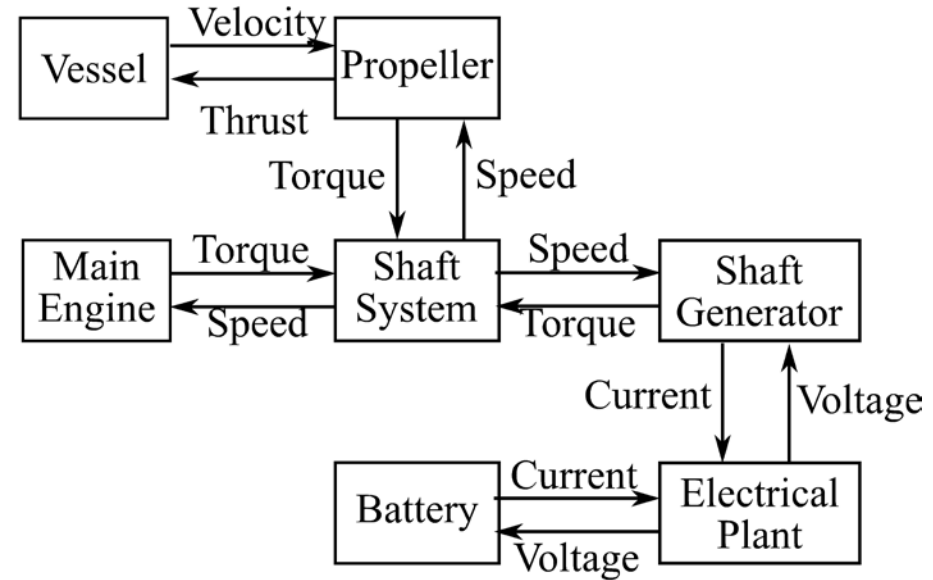
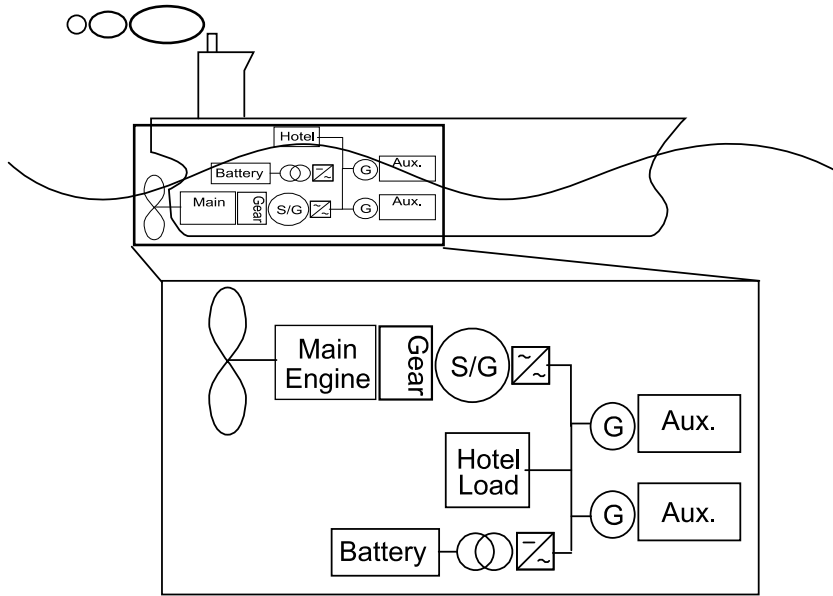


INMCM

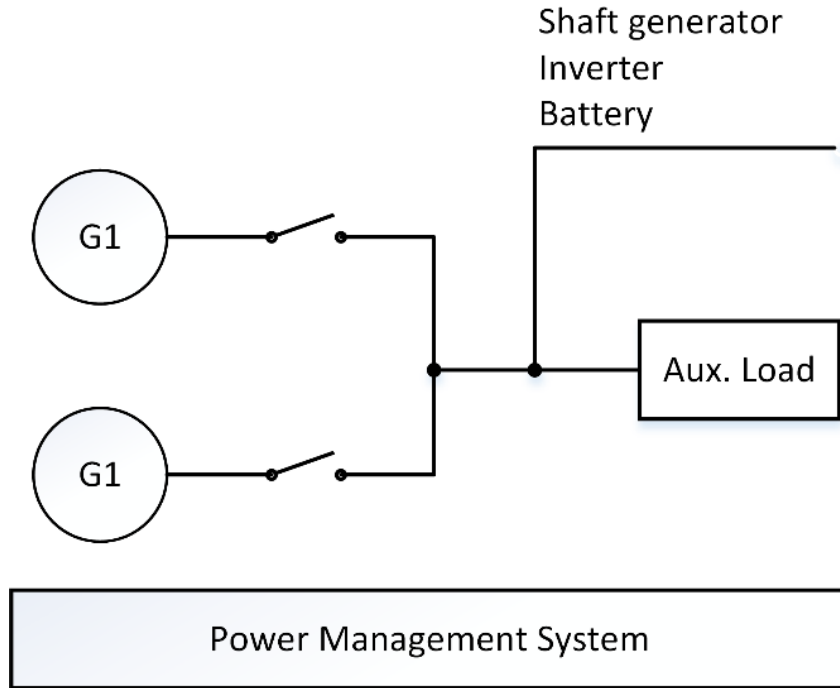
Findings

- The simulator demonstrated the complex interactions between a hull, a propeller, a diesel engine and a control system.
- For transient response of the diesel engine with a governor and a smoke limiter, inertia of a turbocharger rotor plays important role as well as the control parameters.
- Steady-state mapping of the specific fuel consumption shows small deviations from the transient simulation with 0D model (fixed combustion profile).

Hybrid Propulsion System for Deep-sea Shipping

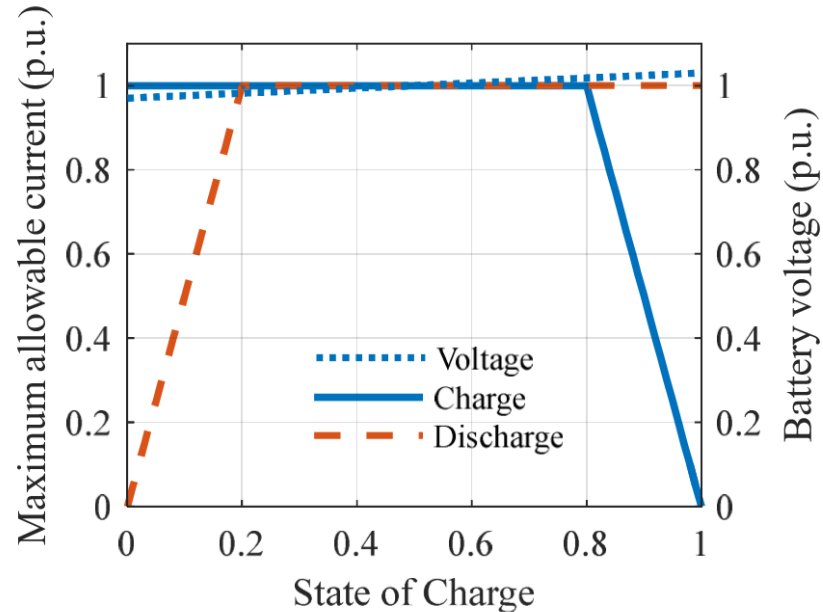
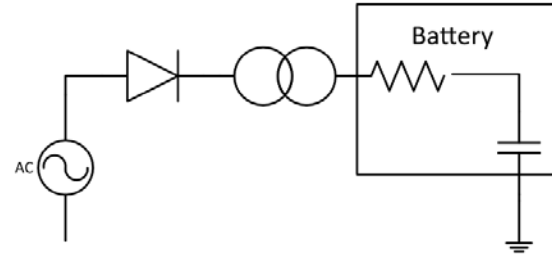


Electrical Plants

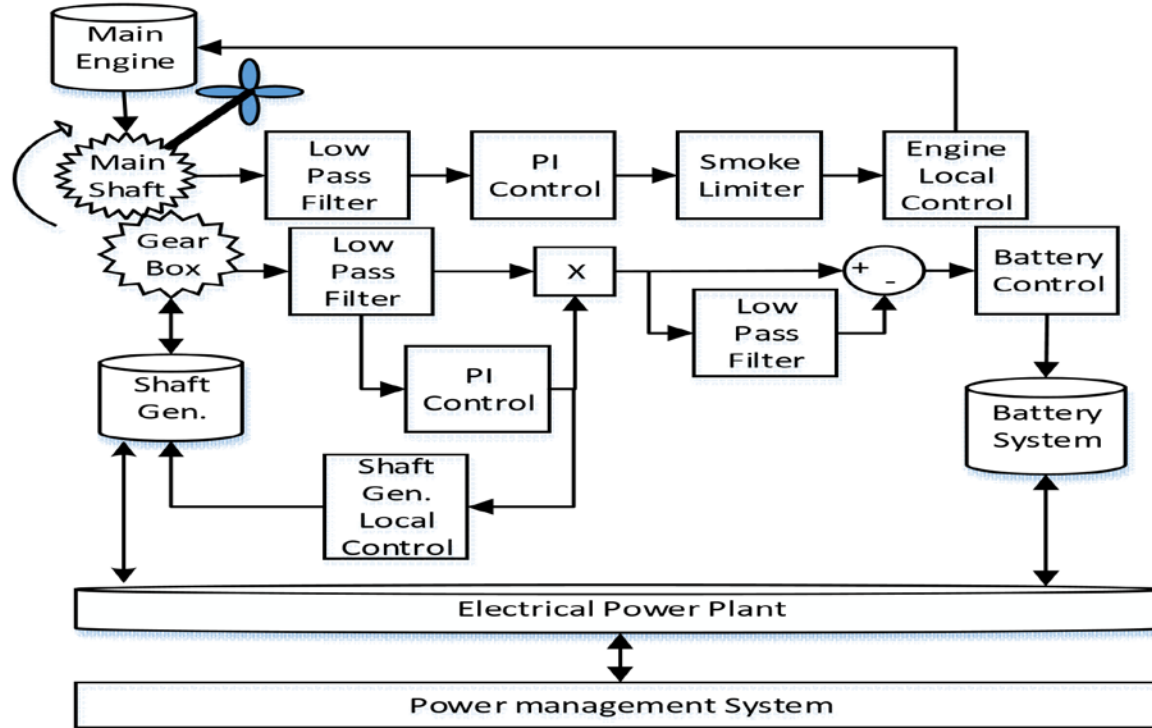


- Reference to Tom Arne Pedersen, “Bond graph modeling of marine power systems”, 2009
- Transient three-phase voltage, current and frequency simulation using dq-frame modeling and transformation

Battery model



Control System



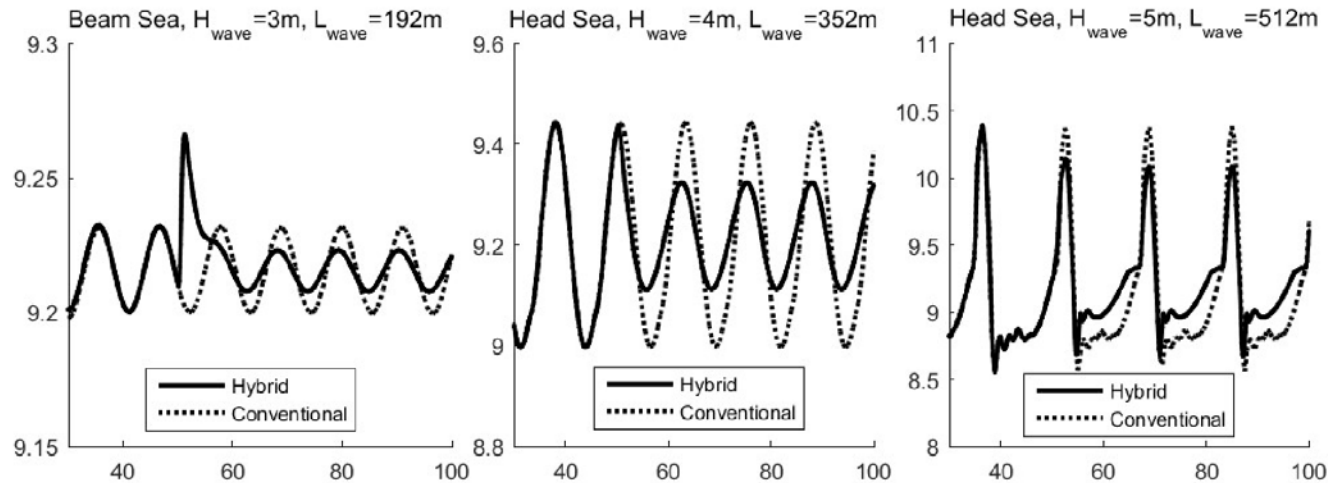
Result

- Reduction in amplitude of shaft speed and engine power fluctuation

		Shaft speed	Engine power
Reduction Ratio	Mean	2.20	2.00
	Maximum	2.85	2.62
	Minimum	1.30	1.06
	Standard deviation	0.36	0.45
Correlation coefficient to	χ_{wave}	-0.35	-0.46
	H_{wave}	-0.24	-0.46
	L_{wave}	0.24	0.13

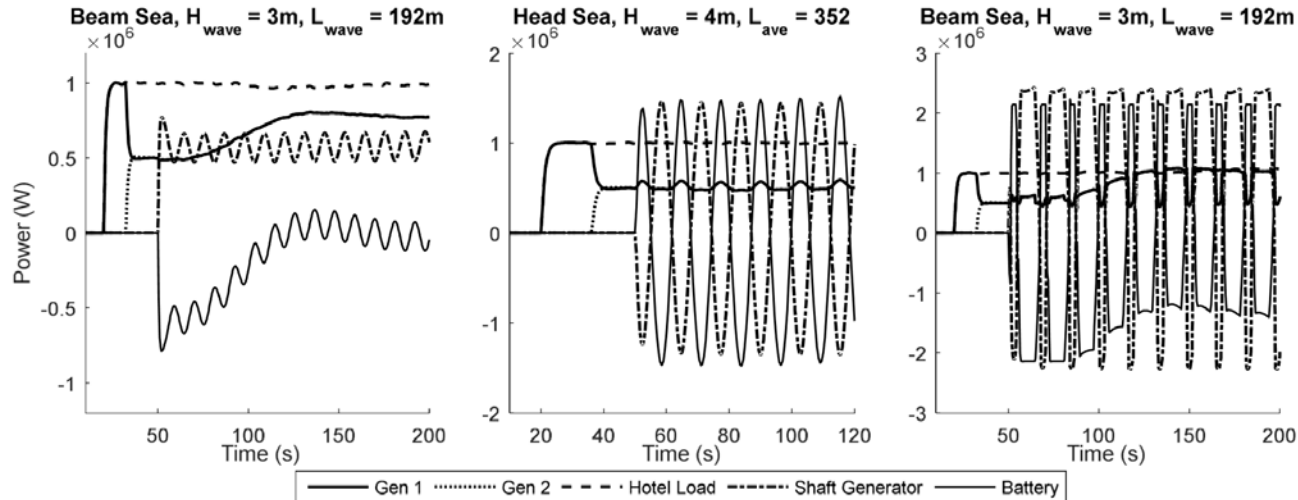
Result

- Time series simulation of the propulsion shaft speed



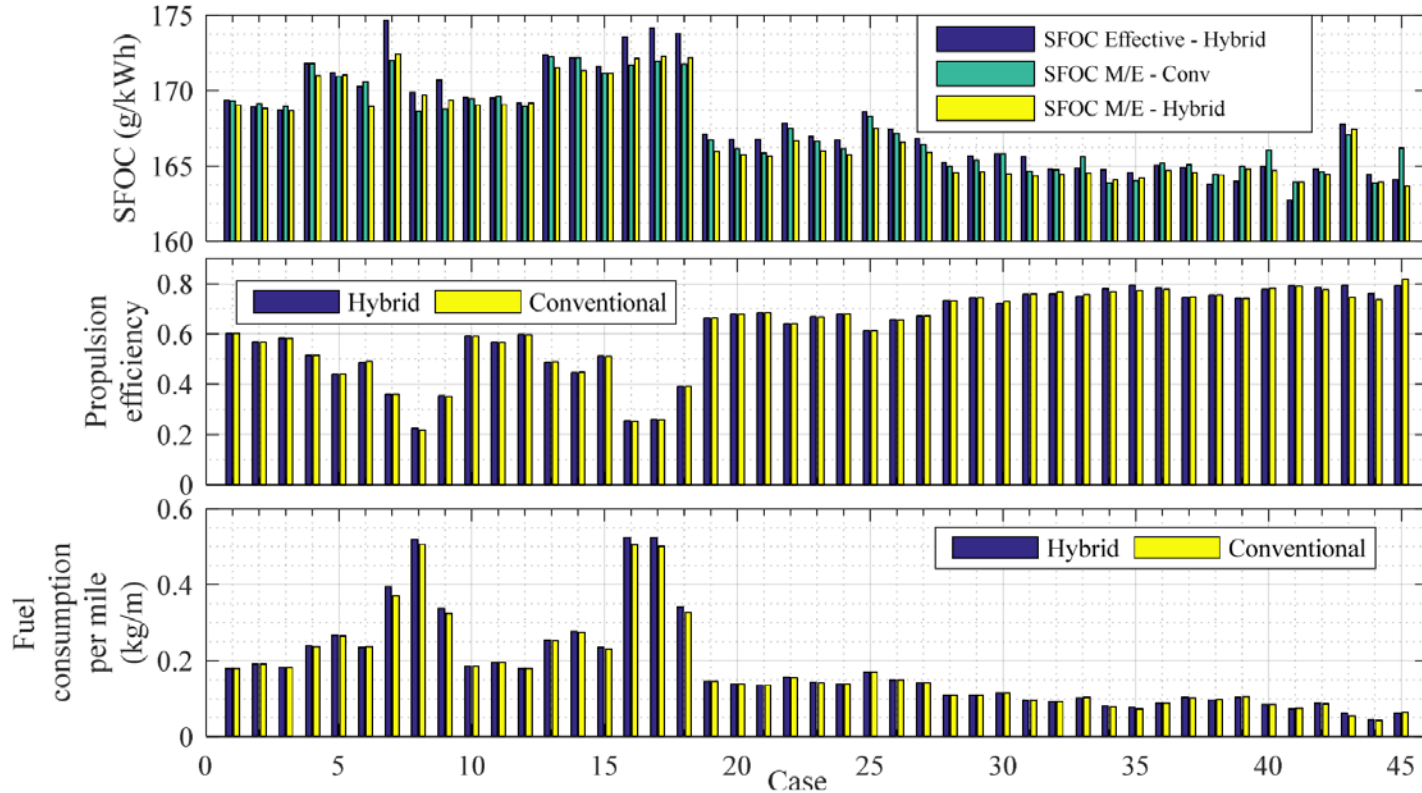
Result

- Time series simulation of the electrical power balance



Result

- Average Efficiency



Findings

- The simulation shows the possibility for reducing speed variation even for the mechanical propulsion using the existing installation by adding the battery system.
- The hybrid propulsion system utilized for peak-shaving in the extreme sea cases showed an equivalent level of efficiency.
- Optimization of the power plant including the main engine and the electrical power plant has potentials to improve the efficiency.
- Improvement for the battery control should be incorporated in the design of the power plant.

Experimental Investigation of the transient emissions



When is transient load dominant in the marine operation?

- Transit in waves
- DP operation in the extreme sea
- Active heave compensation in drilling or crane operation
- Crane operation => Step load

} Cyclic load

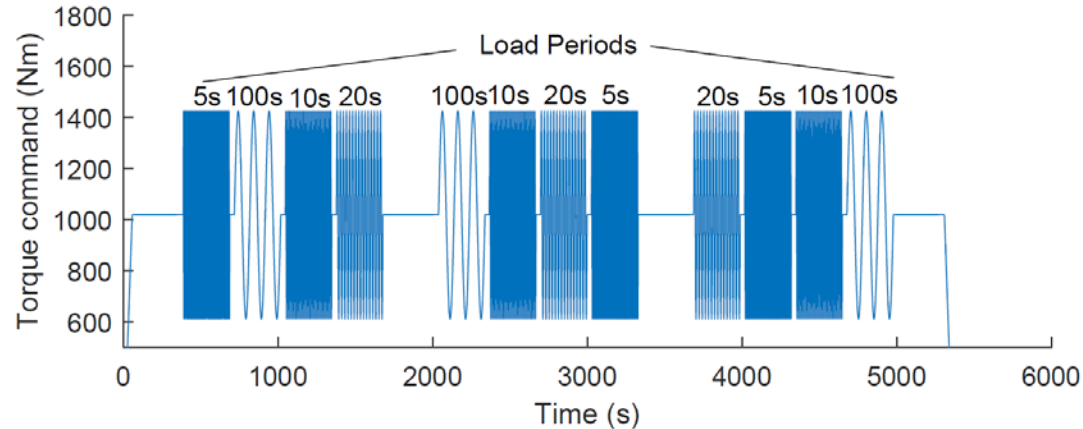


Research question

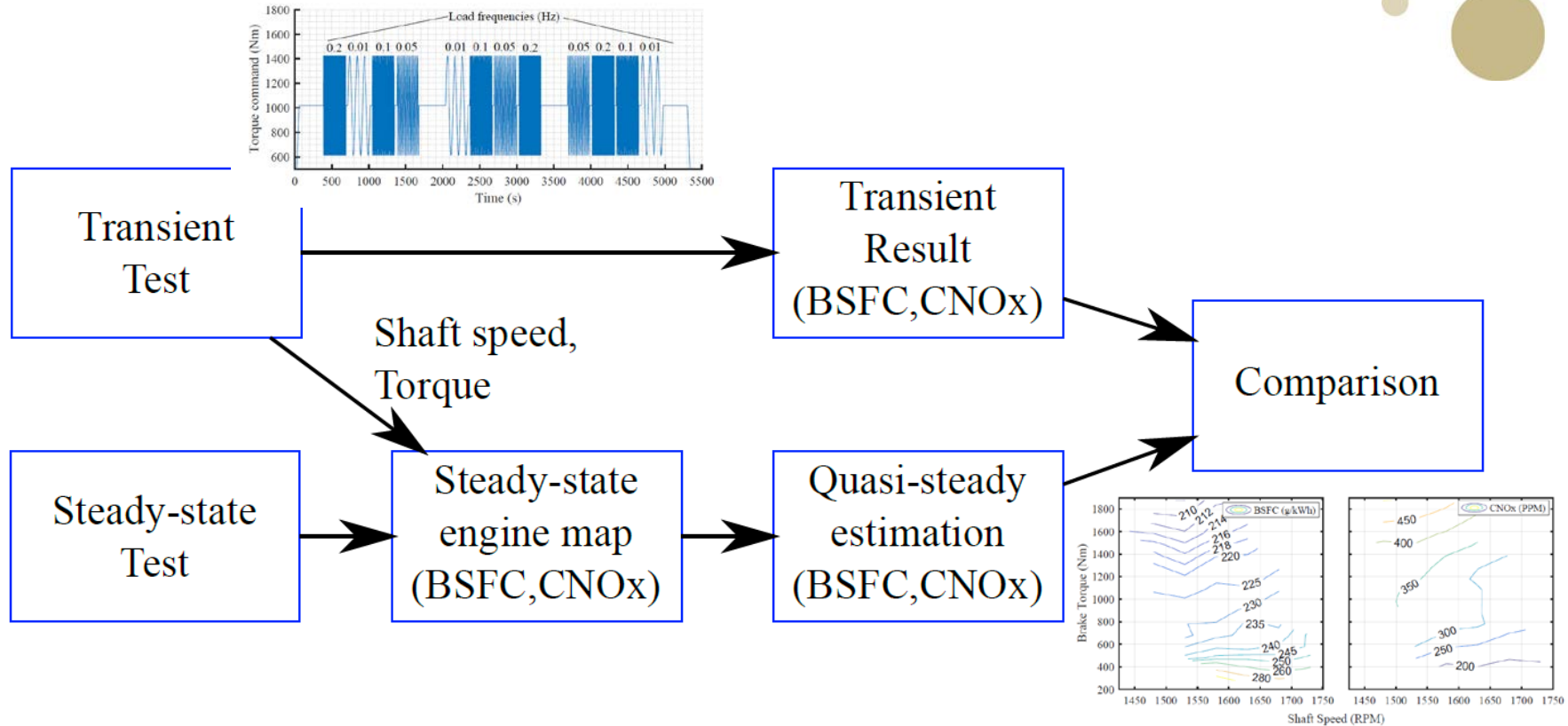
- Is there an effect of a cyclic transient load on the average fuel consumption and average NOx emission?
- If so, can we quantify the influence?

Methodology

- Definition of the test case of transient load
 - Shaft speed(RPM): 1600
 - Load torque, combination of following
 - Period(s) : 5, 10, 20, 100
 - Amplitude(Nm): 407Nm
 - Mean Torque(Nm): 611, 1019, 1420



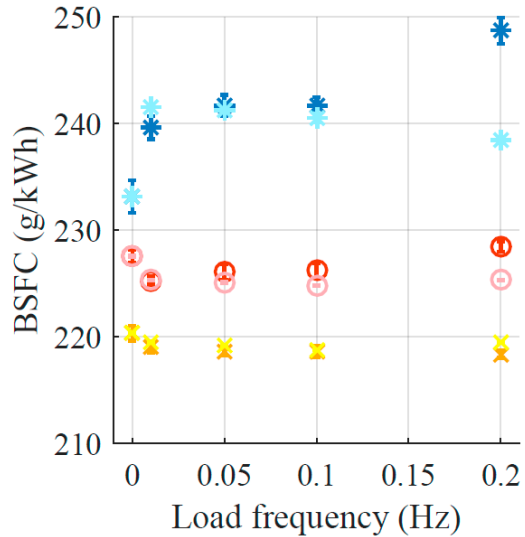
Methodology



Result

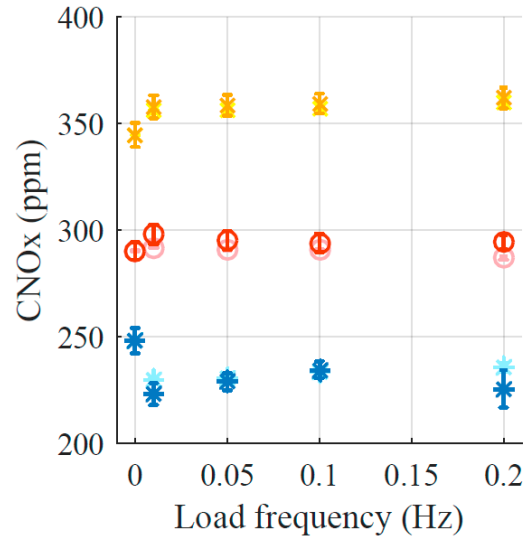
Transient Measurement

- Mean Power Load 24.6% (Blue asterisk)
- Mean Power Load 41% (Red circle)
- Mean Power Load 57.2% (Yellow cross)



Quasi-steady Mapping

- Mean Power Load 24.6% (Blue asterisk)
- Mean Power Load 41% (Red circle)
- Mean Power Load 57.2% (Yellow cross)



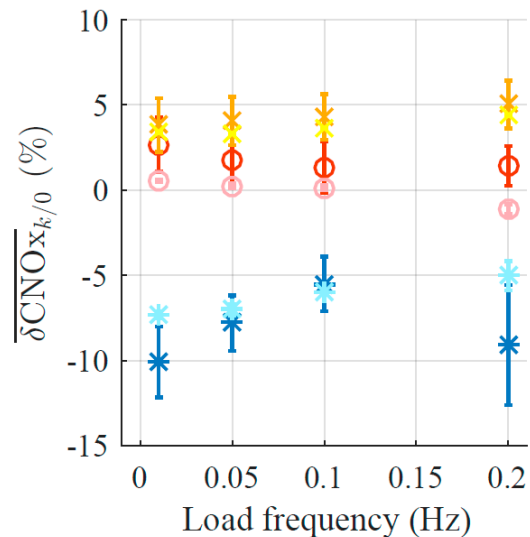
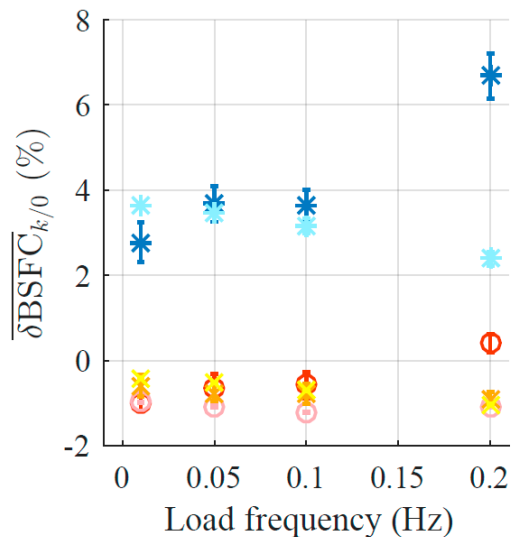
Result

Transient Measurement

- * Mean Power Load 24.6%
- Mean Power Load 41%
- × Mean Power Load 57.2%

Quasi-steady Mapping

- × Mean Power Load 57.2%
- Mean Power Load 41%
- * Mean Power Load 24.6%



Findings

- The effect of the cyclic transient load is found to be dependent on the average load level and becomes more visible as the load level is lowered.
- The quasi-steady mapping method provides an estimation of fuel consumption with a good accuracy, even without transient correction, for most cases.
- The effect of load smoothing for cyclic loads depends on the shape of the steady-state fuel consumption rate around the operating point.

Use of Machine Learning Tools for Model Identification and model reduction

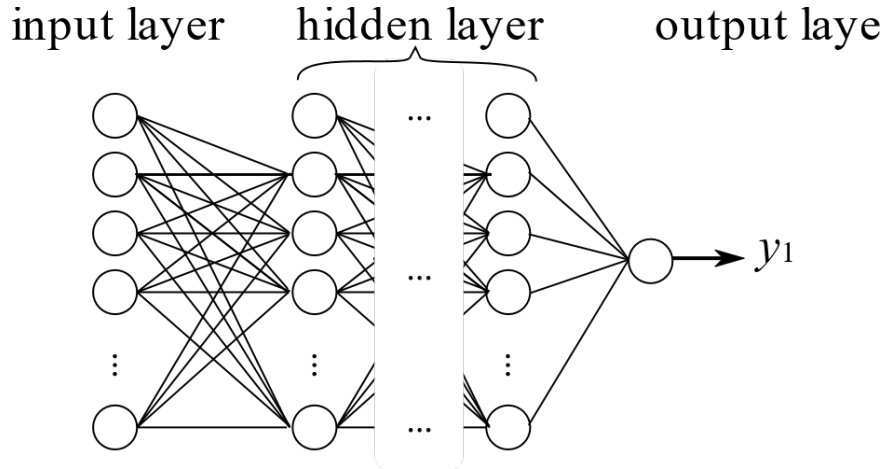


Motivation

- Model identification
 - Highly non-linear relation between the time-varying parameters and the operating conditions
 - Compact representation of the dataset
- Model reduction
 - Replacement of the high fidelity model with the data-driven empirical model

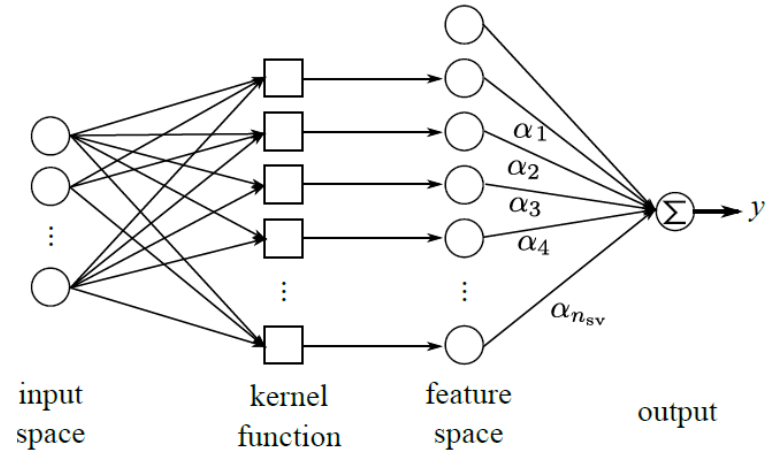
ANN and SVM

- ANN



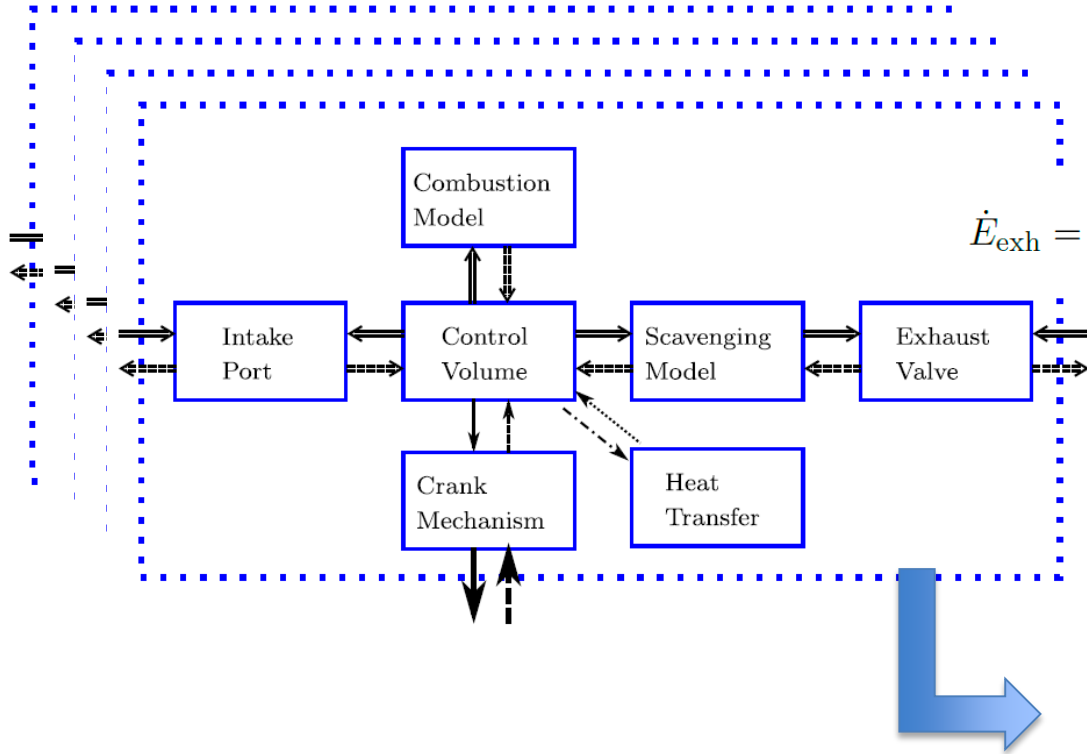
$$x_{k,j} = g \left(\sum_{i=1}^n w_i \cdot x_{i,j-1} + b \right)$$

- SVM



$$y = \sum_{i=1}^{n_{sv}} \alpha_i \phi(\mathbf{x}, \mathbf{x}') - \rho$$

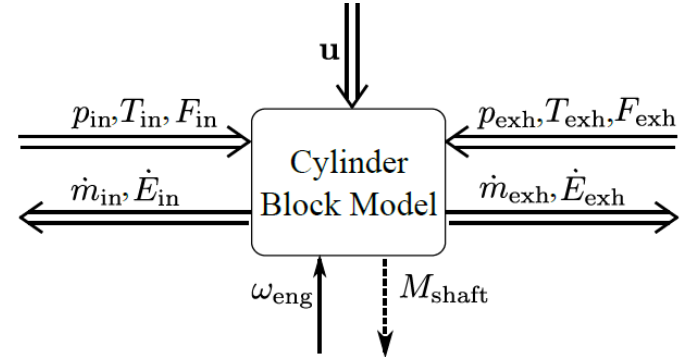
Surrogate modeling of the cylinder block



$$M(\text{Nm}) = \frac{3.6e6 \cdot m_{f,\text{inj}}(\text{g})}{2\pi n_R \cdot \text{bsfc}(\text{g/kWh})}$$

$$\dot{E}_{\text{exh}} = \dot{E}_{\text{in}} + \frac{N \cdot m_{f,\text{inj}}}{n_R} \left(q_{\text{LHV}} - \frac{1}{\text{bsfc}} \right) + P_f - \dot{Q}_{\text{HT}}$$

$$\dot{m}_a = \begin{cases} \frac{1}{2} \rho_{a,0} V_d N \eta_v, & \text{four stroke} \\ \rho_{a,0} V_d N \Lambda, & \text{two stroke} \end{cases}$$



Process

Generation of the training datasets from simulation

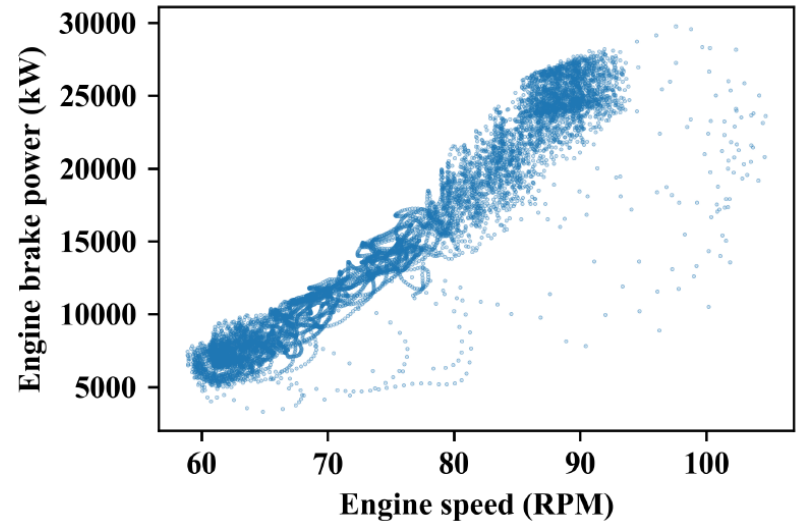
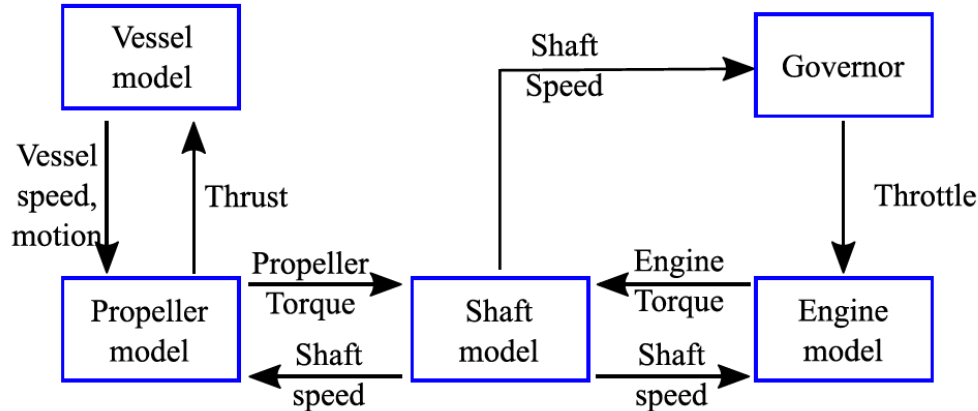
Training ANN and SVM models

Validation



Generation of the training datasets

- Propulsion in irregular waves



Input – Output Data Screening

Input

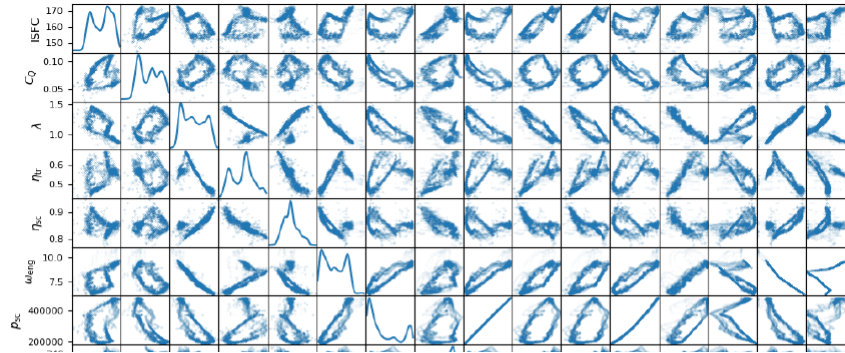
ω_{eng}	engine shaft speed
T_{scav}	scavenge air temperature
T_{exh}	exhaust gas receiver temperature
ω_{tc}	turbocharger speed
φ_{SOI}	start of injection
u_{EVC}	exhaust valve closing command
p_{scav}	scavenge air pressure
p_{exh}	exhaust gas receiver pressure
F_{exh}	exhaust gas fuel-air equivalence ratio
u_{gov}	fuel command from the governor
u_{EVO}	exhaust valve opening command

Output

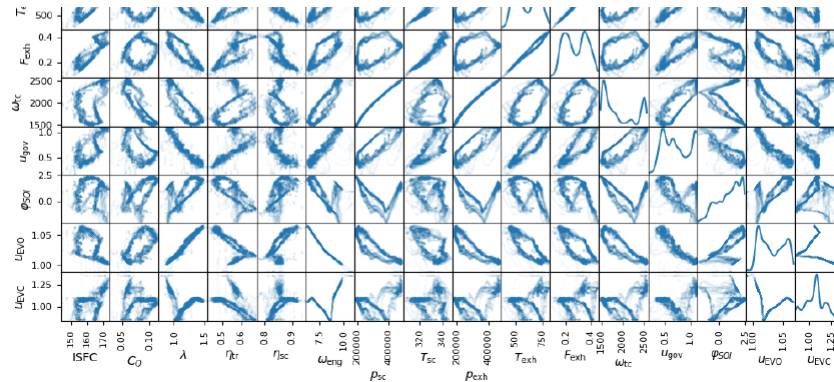
ISFC	Indicated specific fuel consumption
C_Q	Heat loss factor
Λ	Delivery ratio

$$\text{ISFC}[\text{g/kWh}] = \frac{m_{\text{f,cyc}}}{\int_{t_{\text{BDC},n}}^{t_{\text{BDC},n+1}} P_{\text{cyl}} dt} \cdot 3.6e9$$
$$\Lambda = \frac{\int_{t_{\text{IPO}}}^{t_{\text{IPC}}} \dot{m}_{\text{in}} dt}{\rho_{\text{scav}} \cdot V_d}$$
$$C_Q = \frac{\int_{t_{\text{BDC},n}}^{t_{\text{BDC},n+1}} \dot{Q} dt}{m_{\text{f,cyc}} \cdot q_{\text{LHV}}}$$

Input – Output Data Screening



$$[\text{ISFC}, C_Q, \Lambda]^T = \Phi(\omega_{\text{eng}}, p_{\text{scav}}, T_{\text{exh}}, u_{\text{gov}}, \varphi_{\text{SOI}}, u_{\text{EVC}})$$



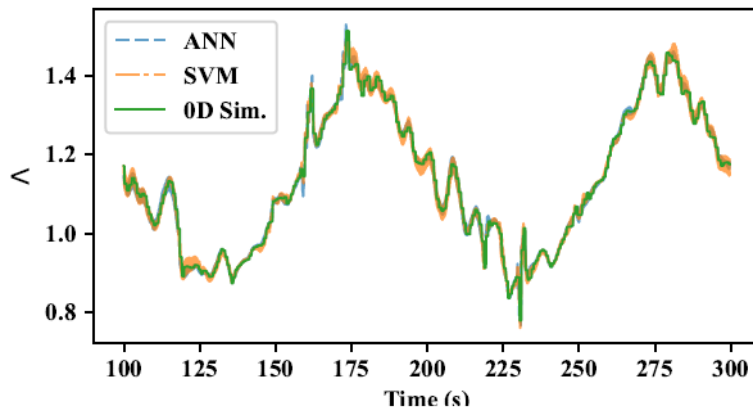
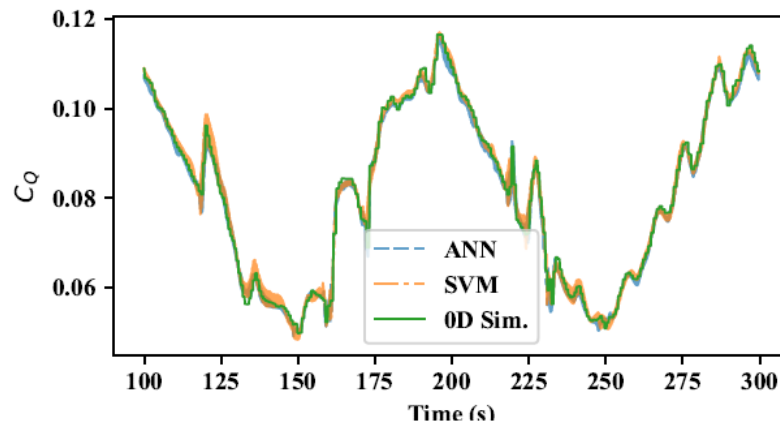
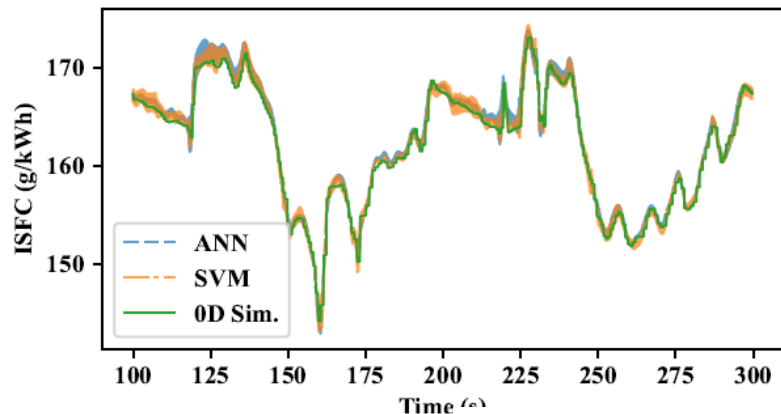
Training results

- Cross validation results (25%)

		ISFC (g/kWh)	C_Q	Λ	η_{tr}	η_{sc}
ANN	MAPE	0.26	1.14	0.61	0.66	0.25
	SAPE	0.23	1.22	0.74	0.84	0.33
SVM	MAPE	0.16	1.97	0.58	0.44	0.27
	SAPE	0.20	2.70	1.38	0.74	0.67

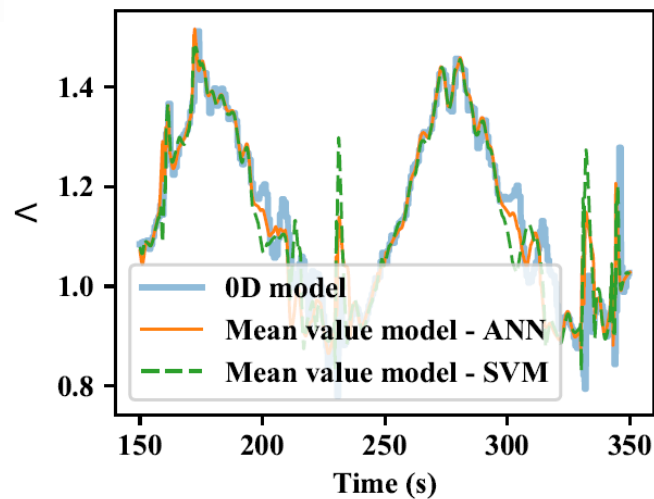
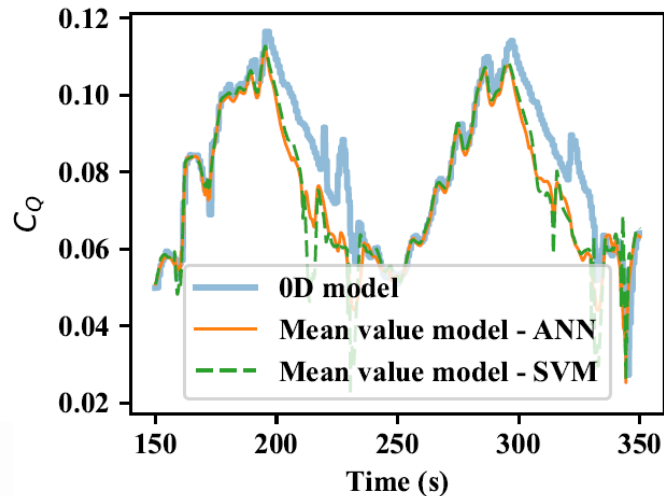
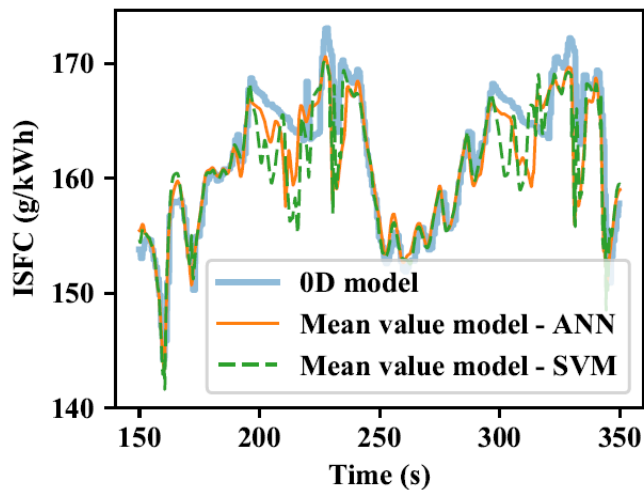
Verification

- Simulation in the open-loop



Verification

- Simulation in the closed-loop

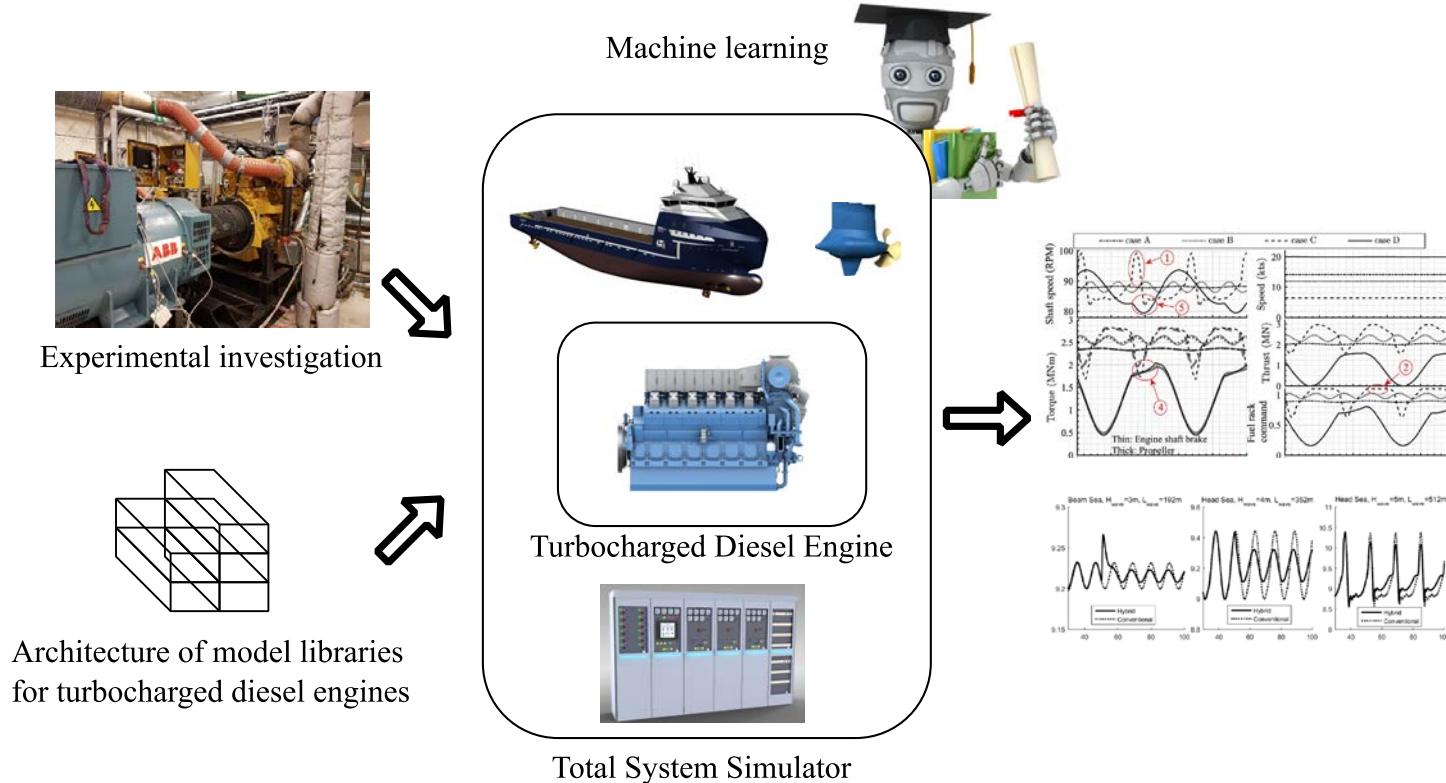


Findings

- ANN and SVM models showed good performance for prediction of the key parameters for mean value cylinder process model
- Generating training data by the total system simulator should have both high variance and correlation to the physical laws. Then, it becomes an effective method to avoid the curse of dimensionality
- Model reduction comes with unavoidable loss of fidelity. The effect of such loss should be evaluated on the system level.

Conclusion

- Main contribution of the thesis



Conclusion

- Further works
 - Development of transient NO_x model for real-time simulation and validation
 - Development of gas engine model
 - Validation of the total system simulator by a full-scale test
 - Experimental investigation of transient effect under cyclic load for different type of engines



Thank you for your attention!