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# Multi-objective optimization of organic Rankine cycles for waste heat recovery: Application in an offshore platform

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#### Abstract

This paper aims at finding the optimal design of MW-size organic Rankine cycles by employing the multiobjective optimization with the genetic algorithm as the optimizer. We consider three objective functions: thermal efficiency, total volume of the system and net present value. The optimization variables are the working fluid, the turbine inlet pressure and temperature, the condensing temperature, the pinch points and the fluid velocities in the heat exchangers. The optimization process also includes the complete design of the shell and tube heat exchangers utilized in the organic Rankine cycle. The methodology is applied to recover the waste heat from the SGT-500 gas turbine installed on the Draugen off-shore oil and gas platform in the North Sea. Results suggest two optimal working fluids, i.e. acetone and cyclopentane. Thermal efficiency and net present value are higher for cyclopentane than for acetone. Other promising working fluids are cyclohexane, hexane and isohexane. The present methodology can be utilized in waste heat recovery applications where a compromise between performance, compactness and economic revenue is required.

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Keywords: Organic Rankine cycle; Multi-objective optimization; Shell and tube heat exchanger; Off-shore platform; Gas turbine

#### 1. Introduction

In March 2007 the Commission of the European Communities [1] set the "20-20-20" targets as the three key objectives for 2020. The requirements are, namely, a 20% reduction in greenhouse gas emission from the 1990 levels, a 20% share of renewable sources in the energy demand and a 20% improvement in the energy efficiency. De Paepe [2] considers the annual recoverable industrial waste heat potential to be about 140 TWh in Europe, corresponding to a  $CO_2$  reduction of about 14 Mt/y. As surveyed by Colonna [3], this waste heat is available at high (350-250 °C), medium (250-150 °C) and low temperatures (150-90 °C) and the power capacity may range from large to small in size (15 MW to 3 kW). With increasing incentives for reducing the  $CO_2$  emissions offshore, waste heat recovery on off-shore platforms has become a focus area. In off-shore applications, the key selection criteria for the waste heat recovery unit supporting the electrical demand on the platform are high efficiency, fuel flexibility, compactness and low weight.

Single and dual-pressure steam Rankine cycles are established and reliable solutions for high-temperature waste heat recovery as discussed, for example, in Gewald et al. [4], Rokni [5] and Domingues et al. [6]. However, the moisture content at the turbine outlet and the limits on the turbine blade height in practice restrict the application to MW-size power units. The organic Rankine cycle (ORC) is a technology that is receiving more and more attention from the academic world, companies and research institutes. Major ORC advantages are the simplicity of the cycle and the possibility of tailoring the working fluid to the specific temperature profile of the heat source. Furthermore, the ORC eliminates the problem of turbine blade erosion due to the liquid droplet formation by utilizing a "dry" fluid as the working fluid. Vélez et al. [7] provide an ample review of existing and possible applications of the ORC technology. A crucial aspect in the design of an ORC is the selection of the

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working fluid. Moreover, the thermal efficiency, compactness, weight, availability and cost are among the most important concerns of a complete design process. Additionally, the operating fluid should be chemically stable, environmentally friendly and safe in terms of toxicity and flammability. As emphasized in Velez et al. [7], no fluid satisfies all these aspects; therefore, the selection is a compromise between the different possibilities.

In the past, much research was conducted to develop optimization algorithms to adapt the ORC to the specific heat source and to address different objectives. Sun and Li [8] implement the ROSENB optimization algorithm to search the optimal set of operating variables to maximize either the system net power generation or the system thermal efficiency. Roy et al. [9] carry out a parametric optimization and performance analysis of an organic Rankine cycle where the heat source is the flue gas at a temperature of 140 °C exiting the discharged fans of a coal power plant. Hettiarachchi et al. [10] use as the objective function the ratio of total heat exchange area to net power output. Quoilin et al. [11] optimize a small-scale ORC for waste heat recovery applications; economic profitability and thermodynamic efficiency are the objective functions. Baik et al. [12] employ the pattern search algorithm to maximize the net power output considering the overall heat transfer conductance and turbine inlet pressure and temperature as optimization variables. In Wang et al. [13] and in Dai et al. [14], the genetic algorithm (GA) is used as the optimization method for a comparative study of ORCs for low-temperature waste heat recovery. Cayer et al. [15] present a parametric study of a  $CO_2$  supercritical power cycle using six performance indicators: thermal efficiency, specific net output, exergetic efficiency, total UA and surface of the heat exchangers, and the relative cost of the system. The concept is extended by Shengjun et al. [16] to subcritical and supercritical ORCs minimizing the levelized energy cost and heat exchanger area per unit power output. Salcedo et al. [17] apply the multi-objective optimization to solar Rankine cycles coupled with reverse osmosis desalination considering the specific total cost and the environmental impact of the plant. Wang et al. [18] perform a parametric optimization using a multi-objective optimization to design ORCs for low temperature waste heat. The screening criteria include heat exchanger area per unit power output and heat recovery efficiency.

The present paper aims at presenting a generic methodology to design and optimize ORCs where shell and tube heat exchangers are used. In order to assess the compactness of the system, a detailed dimensioning of the shell and tube heat exchanger is carried out considering both the heat transfer coefficients and the pressure drops on the shell and tube sides. We use a multi-objective optimization modeled by the genetic algorithm using the following objective functions: thermal efficiency, total volume of the ORC and net present value. We apply the methodology to recuperate the waste heat from the SGT-500 gas turbine installed on the Draugen platform (Kristiansund, The North Sea). Compared with previous works [8-18], the approach in this paper is novel in the sense that it includes the total volume of the organic Rankine cycle and the net present value as objective functions. Furthermore, in contrast to previous works, the geometry of the shell-and-tube heat exchanger is included in the optimization procedure. The novel set of optimization variables includes 109 working fluids, turbine inlet pressure and temperature, pinch points of condenser, internal recuperator and evaporator/economizer and fluid velocities in the tubes and on the shell side, respectively, of all heat exchangers. Other characteristics of the working fluids, such as health, fire and physical hazards [19], and the global warming potential (GWP) are, to some extent, also considered. The methodology presented in this paper can be applied in waste heat recovery applications where the ORC design is the result of a compromise between performance, compactness and economic revenue.

We describe the shell and tube design process, the ORC's governing equations and the multi-objective optimization in section 2. The case study is also presented in section 2. Results of the multi-objective optimization are reported in section 3 and discussed in detail in section 4. Finally, we state the main conclusions in section 5.

#### 2. Methodology

We outline the features and details of the new methodology in this section. The modeling of shell and tube heat exchangers is described introducing the equations computing the heat transfer coefficients, the geometry and the investment cost. In subsection 2.2, we present the modeling of the other ORC components. The heat transfer fluid, Dowtherm Q, is introduced in subsection 2.3. Finally, subsections 2.4 and 2.5 introduce the multi-objective optimization and the case study where the methodology is applied.

#### 2.1 Shell and tube heat exchangers

The basic design procedure requires determining the surface area that is needed using the available temperature difference. The governing equation for the heat transfer across a surface is

$$\dot{Q} = U A F_t \Delta T_{lm} \tag{1}$$

where  $\dot{Q}$  is the heat rate, U is the overall heat transfer coefficient, A is the heat transfer area,  $\Delta T_{lm}$  is the logarithm mean temperature difference and  $F_t$  is the temperature correction factor which accounts for co-current and cross-flow. We compute the correction factor in Eq. (1) utilizing the method proposed by Fakheri [20]. The overall heat transfer coefficient can be regarded as the sum of the following five different items: the outside fluid film coefficient  $h_o$ , the inside fluid film coefficient  $h_i$ , the outside dirt coefficient (fouling factor)  $h_{od}$ , the inside dirt coefficient  $h_{id}$  and the thermal conductivity of the tube wall material  $\lambda_w$ . The overall coefficient based on the outside area of the tube can be calculated as follows:

$$\frac{1}{U_o} = \frac{1}{h_o} + \frac{1}{h_{od}} + \frac{d_0 \ln \frac{a_0}{d_i}}{2\lambda_w} + \frac{d_0}{d_i} \frac{1}{h_{id}} + \frac{d_0}{d_i} \frac{1}{h_i}$$
(2)

where  $d_0$  and  $d_i$  are the outer and inner diameter of the tubes.



Figure 1. Shell and tube heat exchanger geometry and tube pattern.

Fig. 1 shows the generic geometry of the shell and tube heat exchanger. The geometrical parameters considered in the design are the following: the inner and outer diameters of the tubes, the tube length  $l_t$ , the distance between the tube centers (pitch)  $p_t$ , the number of tube passes  $N_t$  and the baffle spacing  $l_b$ . Based on the well-established design procedure outlined in Richardson and Peacock [21], the geometry of the heat exchanger and the fluid velocity in the tubes and on the shell side can be calculated. We evaluate the volume  $V_{ht}$  of the shell and tube heat exchanger assuming a cylindrical shape:

$$V_{ht} = F_{ts} \frac{\pi}{4} d_s^2 l_t \tag{3}$$

The shell diameter  $d_s$  and the tube length are the diameter of the base and the height of the cylinder (see Eq. (3)). A correction factor  $F_{ts}$  is applied to account for the space occupied by the shell and tube inlet and outlet ducts. As formulated in Hall [22], the purchased-equipment cost  $PEC_{ht}$  is a function of the heat exchanger area A and it can be computed as follows:

$$PEC_{ht} = 10000 + 324A^{0.91}$$

The heat transfer coefficient  $h_t$  and the pressure drop  $\Delta p_t$  on the tube side in the subcooled liquid and superheated vapor regions are related the Reynolds number Re, Prandtl number Pr and velocity in the tubes  $u_t$  and are evaluated using the following methodology [21]:

$$h_t = j_{th} \frac{\lambda_t}{d_i} Re P r^{0.33} \left(\frac{\mu_t}{\mu_{tw}}\right)^{0.14}$$
(5)

$$\Delta p_t = N_t \left[ 8j_{tf} \frac{l_t}{d_i} \left( \frac{\mu_t}{\mu_{tw}} \right)^{-m} + 2.5 \right] \frac{\rho_t u_t^2}{2} \tag{6}$$

where  $\rho_t$ ,  $\lambda_t$  and  $\mu_t$  are the density, the thermal conductivity and the dynamic viscosity calculated at the average temperature between the inlet and the outlet conditions of the tube;  $\mu_{tw}$  is the dynamic viscosity of the fluid calculated at the temperature of the inner wall of the tube. The quantities  $j_{th}$  and  $j_{tf}$  are the heat transfer and friction factor of the tubes and are evaluated as reported in [21]. The coefficient *m* is equal to 0.25 for laminar flow (Re < 2100) and 0.14 for turbulent flow (Re > 2100). The following equation gives a more accurate estimate of the heat transfer coefficient of water, utilized as the cooling fluid in the condenser tubes [21]:

$$h_t = \frac{4200(1.35 + 0.02t)u_t^{0.8}}{{d_i}^{0.2}} \tag{7}$$

where *t* is the average temperature of the water in the tube. The calculation of the heat transfer coefficient on the shell side  $h_s$  is based on the experimental work carried out by Kern [23] on commercial exchangers with standard tolerances. Richardson and Peacock [21] state that the methodology gives a satisfactory prediction of the heat-transfer coefficient. The heat transfer coefficient  $h_s$  and the pressure drop  $\Delta p_s$  on the shell side in the subcooled

liquid and superheated vapor regions are related to the Reynolds number Re, Prandtl number Pr and velocity on the shell side  $u_s$  and are evaluated using the following methodology [21]:

$$h_s = j_{sh} \frac{\lambda_s}{d_e} Re Pr^{1/3} \left(\frac{\mu_s}{\mu_{sw}}\right)^{0.14}$$
(8)

$$\Delta p_s = 8j_{sf} \frac{d_s}{d_e} \frac{l_t}{l_b} \left(\frac{\mu_s}{\mu_{sw}}\right)^{-0.14} \frac{\rho_s u_s^2}{2} \tag{9}$$

where  $d_e$ ,  $\rho_s$ ,  $\lambda_s$  and  $\mu_s$  are the equivalent shell diameter, the density, the thermal conductivity and viscosity calculated with the average temperature between the inlet and the outlet conditions of the shell;  $\mu_{sw}$  is the viscosity of the fluid calculated with the temperature of the outer wall of the tube. The quantities  $j_{sh}$  and  $j_{sf}$  are the heat transfer and friction factor of the shell and are evaluated as reported in [21]. Assuming that the evaporator operates in the nucleate boiling region, we evaluate the heat transfer coefficient with the Cooper correlation [24]. The nucleate boiling heat transfer coefficient  $h_{nb}$  is a function of the reduced pressure  $p_r$ , the molecular weight of the fluid M, the specific heat rate  $\dot{Q}/A$  and the surface roughness  $R_p$  (assumed to be 1  $\mu$ m [23]) and it can be expressed by mathematically as

$$h_{nb} = 55p_r^{0.12 - 0.4343\ln R_p} (-0.4343\ln p_r)^{-0.55} M^{-0.5} \left(\frac{\dot{Q}}{A}\right)^{0.67}$$
(10)

The pressure drops are evaluated as the average between the pressure drops calculated with the thermodynamic properties and the speed computed at the saturated liquid and saturated vapor states. In ORCs the heat rejection starts in the superheated region. Hence, the calculation of the heat transfer coefficient is split into two processes: de-superheating and condensation. Since it is assumed that the condensation takes place on the shell side, Eq. (8)

is utilized. In the second step, assuming condensation outside the horizontal tubes, the following equations are utilized as suggested by Richardson and Peacock [21]:

$$h_{cond} = 0.95\lambda_l \left[ \frac{\rho_l(\rho_l - \rho_g)g}{\mu_l \Gamma} \right]^{1/3} \tag{11}$$

$$\Gamma = \frac{\dot{m}}{N_t l_t} \tag{12}$$

where g is the standard gravity,  $\Gamma$  is the tube loading and  $\rho_l$ ,  $\lambda_l$ ,  $\mu_l$  are the density, thermal conductivity and dynamic viscosity at the saturated liquid state, while  $\rho_g$  is the density at the saturated vapor condition. As suggested by Kern [23], the pressure drop on the condensing side is quantified as half of the pressure drop (Eq. (9)) based on the vapor inlet conditions.

#### 2.2 Organic Rankine cycle modeling

As shown in Fig. 2, the ORC components are the turbine (TUR), connected through the shaft to the electric generator (GEN), the liquid pump and five different heat exchangers: economizer (ECO), evaporator (EVA), superheater (SUP), internal recuperator (IR) and condenser. Each component is modeled at steady state conditions.



Figure 2. Organic Rankine cycle layout.

The outlet enthalpy  $h_2$  and the power consumption  $\dot{P}_p$  of the pump are calculated as follows:

$$h_2 = h_1 + \frac{p_2 - p_1}{\rho} \tag{13}$$

$$\dot{P}_{p} = \frac{\dot{m}(h_{2} - h_{1})}{\eta_{m}} \tag{14}$$

where  $p_1$  and  $p_2$  are the pressure at the inlet and at the outlet of the pump,  $h_1$  is the inlet enthalpy,  $\rho$  is the density of the working fluid,  $\dot{m}$  is the mass flow circulating in the organic cycle and  $\eta_m$  is the mechanical efficiency of the pump.

$$PEC_p = 422\dot{P}_p^{0.71} \left[ 1.41 + 1.41 \left( \frac{1-0.8}{1-\eta_m} \right) \right]$$
(15)

The purchased-equipment cost  $PEC_p$  is evaluated with Eq. (15) which was utilized by Arsalis et al. [25] for water pumps. The volume of the pump is considered negligible. The turbine is modeled by using the polytropic efficiency. The purchased-equipment cost of the turbine  $PEC_{tur}$  is assumed to be comparable with the purchase price of conventional steam axial turbines. In this paper we use the analytical expression proposed by Lian et al. [26] which depends on the power output  $\dot{W}_{tur}$ :

$$PEC_{tur} = 6000 \dot{W}_{tur}^{0.7} \tag{16}$$

Since the methodology is applied to MW-size ORCs, it is assumed that the expander is an axial turbine with a unique stage (nozzle and rotor). As shown in Fig. 3, the volume  $V_{tur}$  is modeled as a cylindrical trapezoid. We evaluate the inlet and outlet flow areas  $A_{in}$  and  $A_{out}$  through the continuity equation considering an inlet Mach number of 0.3 [27]. The external inlet and outlet diameter  $d_{in,e}$  and  $d_{out,e}$  are calculated assuming a tip to hub ratio of 1.43 [28] and an axial length  $l_x$  of 0.3 m. A correction factor  $F_{tv}$  of 1.2 is applied to account for the space required by the inlet and outlet ducts and the electric generator.



Figure 3. Geometric representation (cylindrical trapezoid) of the axial turbine in the organic Rankine cycle.

$$V_{tur} = F_{tv} \left[ \frac{\pi}{4} \left( d_{out,e}^2 + d_{in,e}^2 \right) + \frac{\pi}{4} d_{out,e} d_{in,e} \right] \frac{l_x}{3}$$
(17)

We calculate the electric power output  $\dot{P}_{gen}$  and the PEC of the electric generator  $PEC_{gen}$  as follows:

$$\dot{P}_{gen} = \eta_{el} \dot{W}_{tur} \tag{18}$$

$$PEC_{gen} = 60\dot{P}_{gen}^{0.95} \tag{19}$$

where  $\eta_{el}$  is the electric efficiency of the generator. According to the previous equations, the net power output  $\dot{P}_{net}$  and the thermal efficiency  $\eta_{th}$  of the ORC are defined as

$$\dot{P}_{net} = \dot{P}_{gen} - \dot{P}_p \tag{20}$$

$$\eta_{th} = \frac{\dot{P}_{net}}{\dot{m}(h_6 - h_3)}$$

where  $h_6$  and  $h_3$  are the enthalpies at the outlet of the superheater and at the inlet of the economizer.

#### 2.3 Dowtherm Q thermodynamic and physical properties

The ORC working fluid is typically a carbon-based or hydrogen-based fluid, and the combustion products of a biomass plant or the exhaust gases exiting gas turbines, diesel and gas engines have high oxygen content. Hence, for safety reasons, an intermediate loop is placed between the ORC and the heat source. As suggested by Pierobon et al. [29], Dowtherm Q is selected as an intermediate heat carrier. We calculate the thermodynamic and physical properties by fitting the experimental data released by DOW Chemical Company [30] and assuming an incompressible liquid with a high density:

$$\rho = 1187 - 206.51 \frac{T}{273.15} \tag{22}$$

$$c_p = 0.7702 - 0.8264 \frac{T}{273.15} \tag{23}$$

$$h = \int_{T_0}^T c_p(T) \, dT \tag{24}$$

$$\lambda = 0.1651 - 0.0398 \frac{T}{273.15} \tag{25}$$

$$\mu = exp\left[-4.053994 + 6.0844339 / \left(\frac{T}{273.15}\right)^{1.5}\right]$$
(26)

where  $c_p$  is the specific heat capacity at constant pressure and T is the Dowtherm Q temperature in Kelvin.

## 2.4 The multi-objective optimization

A multi-objective optimization involves minimizing or maximizing simultaneously two or more functions subjected to a set of constraints. In contrast to single-objective optimization, a solution to a multi-objective problem is a range of optimal points, the so-called Pareto front [31]. We use the genetic algorithm [32] for the benefits of avoiding the calculation of derivatives and enabling the search of global optima. The genetic algorithm parameters are specified according to the following values: population size 1000, generation size 200, crossover fraction 0.8 and migration fraction 0.2. These numerical values are selected in order to ensure the repeatability of the solution when different simulations are performed. The genetic algorithm stops when the maximum number of generations is reached or when the average change in the spread of the Pareto front is lower than the specified tolerance (which in this paper is 10<sup>-3</sup>). Fig. 4 shows the structure of the algorithm. As indicated in the figure, the multi-objective optimization governs a global routine developed in MATLAB 2012a. The thermodynamic properties of the ORC working fluid are acquired by linking MATLAB and the commercial software REFPROP 9 [33].



Figure 4. Structure of the multi-objective algorithm. The optimization routine involves the pre-screening process, the ORC solver, the Nelder-Mead direct search optimizer, the shell and tube designer, and the volume and economic evaluations.

First, in the pre-screening process the number of available working fluids is restricted by discarding the fluids for which the physical, health, fire hazard or GWP exceed the maximum allowable values set by the user. This is carried out by linking mathematically the working fluids to a unique integer number (from 1 to 109) corresponding to a specific fluid in REFPROP. Consequently, the algorithm can interpret and operate

numerically on this optimization variable. The listed fluids, their GWPs in 100 years and their hazards, are taken from Pierobon et al. [34]. After this preliminary step, the optimization variables are passed to the GA. In the present paper the following variables (see Fig. 4) are optimized:

- a) ORC working fluid
- b) Condenser outlet temperature  $T_1$
- c) Condenser pinch point (located at the saturated vapor state)
- d) Internal recuperator pinch point  $T_2$ - $T_8$
- e) Minimum temperature difference (pinch point) in the economizer or vaporizer
- f) Turbine inlet pressure  $p_6$
- g) Superheating temperature difference  $T_{10}$ - $T_6$
- h) Target velocities in the tubes and on the shell side for each heat exchanger  $u_{tt}$ ,  $u_{st}$

The ORC solver then acquires these values and computes the thermodynamic properties at each state, the thermal efficiency and the net power output. During the first run of the ORC solver, the pressure drops in the heat exchangers are set to zero. The solution is then utilized as the design condition for the heat exchangers and the expander. The heat rate, the mass flow, the inlet and outlet temperatures, and the fluid velocities in the tubes and on the shell side are passed to the shell and tube designer. At this point the constrained Nelder-Mead optimizer [35] is employed to select the tube and shell geometry that gives the specified velocity in the tubes and on the shell side. In order to reduce the computational time required by the sub-optimization, we use the tube length to obtain the specified velocity in the tubes; thereby, the function to be minimized can be expressed by the following equation:

$$f(d_o, u_{tt}, p_t, l_b) = \frac{|u_{ts} - u_s|}{u_{ts}}$$
(27)

where  $|u_{ts} - u_s|$  is the absolute difference between the targeted shell speed  $u_{ts}$  and the shell speed calculated in the shell and tube design process. Table 1 lists the lower and upper bounds of the geometric variables and the design parameters which are kept constant in the shell and tube heat exchanger design. If the heat transfer process occurs in the two-phase region, we employ an average velocity evaluated at the saturated liquid and saturated vapor condition.

Table 1. Lower and upper bounds of the geometric variables utilized in the shell and tube heat exchanger design process.

Variable	Lower bound	Upper bound
Outer diameter $d_o$ [21]	16 mm	50 mm
Tube pitch $p_t$ [36]	$1.15d_0$	$2.25d_0$
Baffle spacing $l_b$ [21]	$0.2d_s$	$1.0d_{s}$
Parameters [21]		
Baffle cut $b_c$	25 %	
Configuration	triangular	
Outside dirt coefficient $h_{od}$	6000 W/(m <sup>2</sup> °C)	
Inside dirt coefficient $h_{id}$	6000 W/(m <sup>2</sup> °C)	
Thermal conductivity (tube wall)	50 W/(m °C)	
Correction factor $F_{ts}$	1.2	

The outcomes of the heat exchanger design are the overall heat transfer coefficient, the surface area, the volume and the pressure drops. The pressure drops are set as inputs to the ORC solver, and a new thermal efficiency and net power output are computed. We then check the consistency of the results. For each heat exchanger we verify that the value of the function, calculated with Eq. (27), is lower than the required accuracy, which we specify to be  $10^{-2}$ . Furthermore, in case the inlet temperature difference  $T_{13}$ - $T_3$  of the economizer or  $T_{12}$ - $T_4$  of the vaporizer is lower than the specified minimum temperature difference, we discard the solution. The three objective functions are expressed below. The function  $f_1$  aims at maximizing the thermal efficiency. To increase the ORC compactness, the sum of the volumes of the ORC components is minimized (function  $f_2$ ) and to analyze the profitability of the investment, the net present value is maximized (function  $f_3$ ).

$$f_1 = -\eta_{th} \tag{28}$$

$$f_2 = V_{eco} + V_{eva} + V_{sup} + V_{IR} + V_{cond} + V_{tur} = V_{tot}$$
(29)

$$f_3 = -NPV \tag{30}$$

According to Bejan et al. [37], the *NPV* can be calculated considering the equipment lifespan *n*, the interest factor *q*, the total capital investment  $I_{TOT}$  and the annual income  $R_i$ :

$$NPV = \sum_{i=1}^{n} \frac{R_i}{(1+q)^i} - I_{TOT}$$
(31)

The discounted payback period *DPB* that estimates the time required to recover the principal amount of an investment is mathematically defined as the minimum year at which the *NPV* is greater than zero:

$$DPB = \min\{n : NPV(n) > 0\}$$
(32)

As suggested by Bejan et al. [37], the total investment cost of the ORC can be regarded by evaluating the direct and indirect costs.

Table 2. Estimate of total capital investment based on direct and indirect costs as suggested by Bejan et al. [37].

Total capital investment		
A. Direct costs		
1. Onsite costs		
a) Purchased - equipment costs (PEC)		
b) Purchased - equipment installation	45 %PEC	
c) Piping	35 %PEC	
d) Instrumentation + controls	20 %PEC	
e) Electrical equipment + materials	11 %PEC	
2. Offsite costs		
f) Civil, structural + architectural work	30 %PEC	
g) Service facilities	50 %PEC	
B. Indirect costs		
i) Engineering + supervision	8 %DC	
j) Construction costs + constructors profit	15 %DC	
k) Contingency	15 %(of i and j)	

Using the values reported in Table 2, we calculate the total investment cost of the ORC as follows:

$$I_{TOT} = 3.7 \left( PEC_{tur} + PEC_{eco} + PEC_{eva} + PEC_{sup} + PEC_{IR} + PEC_{p} + PEC_{cond} + PEC_{gen} \right)$$
(33)

We applied this methodology to recover the waste heat from the Siemens SGT-500 gas turbine employed on the Draugen off-shore platform, located 150 km from Kristiansund, in the Norwegian Sea. The platform, operated by A/S Norske Shell, produces gas and oil. Gas is exported via the Åsgard gas pipeline to Kårstø (Norway). Oil is first stored in storage cells at the bottom of the sea and then exported via a shuttle tanker (once every 1-2 weeks). The platform has three SGT-500 engines to provide the normal total electric load. The SGT-500 is an industrial twin-spool gas turbine, and the engine model is the C-version launched in the beginning of the 1980s. Table 3 reports the design point specifications of the SGT-500.

Model	Siemens SGT-500
Turbine inlet temperature	850 °C
Exhaust gas temperature	376 °C
Exhaust gas mass flow	93.5 kg/s
Net power output	17.014 MW
Heat rate	11312 kJ/kWh
Fuel	Naphtha, crude oil, heavy fuel oil,
	bio oil, natural gas, syngas

Table 3. Design point specifications for the Siemens SGT-500 twin-spool gas turbine [29].



Figure 5. Combined cycle layout including the SGT-500 Siemens twin-spool gas turbine, the intermediate loop and the organic Rankine cycle.

We apply the multi-objective optimization described in section 2.4 to design the ORC for recovering the waste heat from the SGT-500 gas turbine. Figure 5 shows the plant layout including the SGT-500 twin-spool gas turbine, the intermediate loop and the ORC. The design point parameters of the ORC are listed in Table 4 and are maintained constant. The terminal temperature of the off-gases exiting the waste heat recovery unit is fixed to 145°C [29]. A prudential value of 335°C [29] is assumed for the maximum temperature. We evaluate the cold temperature (130 °C) and the mass flow (49.5 kg/s) of Dowtherm Q in the intermediate loop by applying an energy balance in the internal heat exchanger.

D	<b>X</b> 7 - 1
Parameter	value
Exhaust gas inlet temperature $t_{ex,in}$	376 °C
Exhaust gas outlet temperature $t_{ex,out}$	145 °C [29]
Exhaust gas mass flow $\dot{m}_{ex}$	93.5 kg/s
Dowtherm Q inlet temperature $t_{10}$	335 °C [29]
Dowtherm Q outlet temperature $t_{13}$	130 °C
Dowtherm Q mass flow $\dot{m}_{dow}$	49.5 kg/s
Pump efficiency $\eta_m$	80 %
Turbine polytropic efficiency	80 %
Generator efficiency $\eta_{el}$	98 %
Cooling water $t_{Iw}$	5 °C

Table 4. Organic Rankine cycle parameters assumed in the multi-objective optimization.

Next, we must decide the necessary fluid allocation in order to dimension the shell and tube heat exchangers. Where a phase change occurs (evaporator and condenser) the ORC working fluid is placed on the shell side, since it is the most common configuration [21]. For the economizer and superheater, the fluid with the greatest tendency to foul (which is Dowtherm Q) is allocated on the tube side; while for the internal recuperator, the fluid with the highest temperature (working fluid exiting the ORC turbine) is placed on the tube side to reduce heat loss and meet safety conditions [21].

We expect two major sources of income with the installation of the waste heat recovery unit. The first is associated with the fuel savings and the second with the  $CO_2$  taxes. In fact, the power produced by the ORC enables a reduction of the load of the other gas turbines operating on the platform. Consequently, the saved natural gas can be exported and sold to the market. The income related to the saved natural gas  $R_{NG}$  is estimated as follows:

$$R_{NG} = 3.6 \, \frac{\dot{P}_{net}}{\dot{P}_{GT}} \, p_{NG} \, hu \, \dot{V}_{NG} \tag{34}$$

where  $\dot{P}_{GT}$  is the gas turbine net power output, *hu* is the utilization factor,  $p_{NG}$  is the price of natural gas and  $\dot{V}_{NG}$  is the volumetric flow of natural gas. The volumetric flow  $\dot{V}_{NG}$  of natural gas is calculated as follows:

$$\dot{V}_{NG} = v_{NG} \frac{\dot{P}_{net} HR}{3600 LHV}$$
(35)

where  $v_{NG}$  is the specific volume calculated at 15 °C and 1.013 bar, *HR* is the heat rate of the gas turbine and *LHV* is the low heat value of natural gas. The second major income is due to the CO<sub>2</sub> tax. Since 1991 Norway levies carbon tax on petroleum, mineral fuel and natural gas with the rates based on the fuel's carbon content

[39]. Thus, the new method alleviates the carbon tax cost associated with the combustion of natural gas. The income  $R_{CO2}$  related to the CO<sub>2</sub> savings is computed as follows:

$$R_{CO2} = 3.6 \frac{\dot{P}_{net}}{\dot{P}_{GT}} p_{CO2} hu \, \dot{m}_{CO2} \tag{36}$$

where  $p_{CO2}$  is the carbon tax and  $\dot{m}_{CO2}$  is the mass flow of the avoided carbon dioxide. The net present value of the SGT-500 and ORC combined cycle can be rewritten as

$$NPV = \sum_{i=1}^{n} \frac{\text{Ma}\left(R_{NG} + R_{CO2}\right)}{(1+q)^{i}} - I_{TOT}$$
(37)

where *Ma* is a non-dimensional factor that accounts for the operating and maintenance costs. The numerical values assumed in Eqs. (34)-(37) are reported in Table 5.

Table 5. Parameters assumed for the economic analysis.

Parameter	Value
Natural gas price $p_{NG}$	681.65 NOK/tonm <sup>3</sup> <sub>st</sub> [38]
Utilization factor hu	7000 h/y [26]
Low heating value (natural gas)	48530 kJ/kg
Specific volume (natural gas)	1.3139 m <sup>3</sup> /kg
Carbon tax	410 NOK/t of CO <sub>2</sub> [40]
Carbon dioxide emission rate	2.75 kg(CO <sub>2</sub> )/kg(NG) [41]
Maintenance	0.9 [26]

Equipment lifespan n	20 y
Interest factor q	10 %
Conversion factor	0.18 NOK/\$

# 3. Results

Table 6 lists the variables, and the lower and upper bounds set in the multi-objective optimization. The velocities of Dowtherm Q in the economizer, evaporator and superheater, and the velocity of the water in the condenser are not included in Table 6. These are all set to 1 m/s. We assume that the pump work in the intermediate loop is negligible and that the inlet pressure of the water is sufficient to overcome the pressure drops associated with the flow through the condenser.

Table 6. Lower and upper bounds specified for the variables included in the multi-objective optimization(bounds for all velocities are taken from Richardson and Peacock [21]).

Parameter	Lower bound	Upper bound
Outlet condenser temperature $T_1$	25 °C	35 °C
Condenser pinch point	10 °C	25 °C
Internal recuperator pinch point $T_2$ - $T_8$	15 °C	40 °C
Evaporator or economizer pinch point	10 °C	30 °C
Turbine inlet pressure $p_6$	10 bar	40 bar
Superheating temperature difference $T_{10}$ - $T_6$	50 °C	130 °C
Economizer velocity on the shell side	0.3 m/s	1 m/s
Evaporator velocity on the shell side	5 m/s	10 m/s

Superheater velocity on the shell side	5 m/s	10 m/s
Internal recuperator velocity on the shell side	0.3 m/s	1 m/s
Internal recuperator velocity in the tubes	10 m/s	30 m/s
Condenser velocity on the shell side	10 m/s	30 m/s

We set a maximum GWP of 50 and a maximum physical, fire and health hazards level of 3 in the pre-screeening process of the available working fluids. The pre-screeening process decreases the number of available working fluids from 109 down to 20. The GWP boundary excludes all the refrigerants (namely R113, R114, RC318 and R134A) except for R1234YF and R1234ZE. Gaseous fluids, such as air, were eliminated because their critical temperatures are below 25 °C (Table 6). The limit on the fire hazard eliminates fluids that may ignite spontaneously with air (e.g. ethane, butane, pentane, propane and methane). Among the available fluids, seven (hexane, i-hexane, heptane, decane, nonane, octane, dodecane) belong to the alkane class and five (methylcyclohexane, propylcyclohexane, cyclohexane, cyclopentane and cyclopropane) to the cycloalkane group. Other possible fluids are acetone, ammonia, benzene, ethanol, methanol, carbon dioxide, toluene and trifluoroiodomethane. The results suggest that variations of the GWP limits and of the hazard levels do not change the results considerably. The multi-objective optimization provides a three-dimensional Pareto front composed of 350 points. The GA selects two fluids, cyclopentane and acetone, as optimal. In general cyclopentane shows the highest efficiency, but at the cost of greater total volumes and investment. However, regarding the net present value, cyclopentane is the best choice.

Figure 6 depicts the total volume of the ORC plant versus the thermal efficiency. Acetone exhibits a Pareto front ranging from a thermal efficiency of 23.7 to 27.0% and from a volume of 14.5 to 57.5 m<sup>3</sup>. For cyclopentane, the thermal efficiency varies from 27.0 to 28.1% and the volume ranges from 55.0 to 98.4 m<sup>3</sup>.



*Figure 6. Pareto fronts (acetone and cyclopentane) obtained through the multi-objective optimization representing the total volume of the ORC versus thermal efficiency.* 

The net present value is given as a function of the total volume in Fig. 7. The *NPV* increases from 17.7 up to 19.8 M\$ for acetone and from 19.7 up to 20.1 M\$ for cyclopentane. It can be noticed that the trend of the two Pareto fronts initially increases and subsequently flattens out. Since the net present value is a function of the total investment cost and the yearly incomes (dependent on the thermal efficiency of the ORC), an optimum is reached at a volume of 49.8 m<sup>3</sup> for acetone and 86.2 m<sup>3</sup> for cyclopentane. After this maximum, increasing the performance of the ORC by increasing the volume diminishes the economic revenue since the total investment cost becomes too high.



Figure 7. Pareto fronts (acetone and cyclopentane) obtained through the multi-objective optimization representing the net present value versus the total volume of the ORC.

To illustrate how other working fluids perform, we run the multi-objective optimization excluding acetone and cyclopentane from the candidates. The results are shown in Figs. (8) and (9), where the Pareto fronts of the three optimal fluids (cyclohexane, hexane and i-hexane) are reported. The population size in the GA is limited to 500.



*Figure 8. Pareto fronts (cyclohexane, hexane and i-hexane) obtained through the multi-objective optimization representing the total volume of the ORC versus thermal efficiency. Cyclopentane and acetone are excluded.* 



*Figure 9. Pareto fronts (cyclohexane, hexane and i-hexane) obtained through the multi-objective optimization representing the net present value versus the total volume of the ORC. Cyclopentane and acetone are excluded.* 

The trend of the thermal efficiency versus total volume and of the total volume versus net present value for both acetone and cyclopentane can be fitted by interpolating the results shown in Figs. (6) and (7) using the commercial software TableCurve 2D v5.01 [42].

$$\frac{1}{V_{tot}} = a + b \eta_{th}^3 \tag{38}$$

$$NPV^2 = c + dV_{tot} + eV_{tot}^2$$
(39)

Table 7 reports the coefficients *a*, *b*, *c*, *d*, *e* and the coefficient of determination for acetone and cyclopentane. *Table 7. Coefficients a*, *b*, *c*, *d*, *e and coefficient of determination for acetone and cyclopentane obtained by interpolating in the Pareto fronts in Figs.* (6) *and* (7).

Coefficient	Acetone	Cyclopentane
a	0.1629	0.0802
b	-7.3035	-3.1202
Coefficient of determination for Eq. (38)	0.9580	0.8858
c	230.9653	277.1201
d	7.0789	3.0718
e	-0.0759	-0.0187
Coefficient of determination for Eq. (39)	0.9905	0.8197

Regarding the optimization variables, the pinch point is located in the evaporator rather than in the economizer and it ranges between 13.9 and 19.6 °C. The minimum temperature difference in the condenser is constant along the Pareto front (20.0 °C in average). The optimal turbine inlet pressure varies between 37.2 and 39.7 bar, and it almost reaches the upper bound of 40 bar (see Table 6). The profile of the outlet temperature of the condenser throughout the Pareto front ranges from 25.9 up to 29.5 °C for acetone and from 25.9 up to 27.1 °C for cyclopentane.

Figures 6 and 7 enable the selection of the design point of the ORC employed as the waste heat recovery unit for the SGT-500 gas turbine. If an upper limit for the total volume is specified and the NPV increases at greater volumes, the optimal solution corresponds to that of the maximal acceptable total volume. On the contrary, if the NPV decreases or if the specified volume is greater than the maximum volume in the Pareto front, the optimum is located where the NPV is maximized. For example, if the available volume is lower than 30 m<sup>3</sup>, the optimal solution falls in the acetone Pareto front at a total volume of 29.9 m<sup>3</sup>; the thermal efficiency and net present value are 26.1% and 19.4 M\$ (see Figs. (6) and (7)). If the available volume is greater than 100 m<sup>3</sup>, cyclopentane is the most suitable working fluid and an optimum is set where the NPV reaches the maximum (20.1 M\$). This corresponds to a total volume of 86.2 m<sup>3</sup> and a thermal efficiency of 27.8%. The discounted payback period for both cases is estimated to be around 5 years. Table 8 lists the geometry, the volume and the investment cost of the heat exchangers and axial turbine for the two alternatives. It can be noted that the largest components are the internal recuperator, the economizer and the condenser. In the internal recuperator, the heat is exchanged between liquid and vapor, thus the heat transfer coefficient of the vapor side is relatively low. The economizer and the condenser are associated with a high overall heat transfer coefficient. However, a large volume is required since a large heat rate is exchanged.

Table 8. Geometry, investment cost and volume for the proposed optimal solution selected from the Pareto front of acetone and cyclopentane.

	Case a)	Case b)
ORC thermal efficiency	26.1 %	27.8 %
ORC net power output	6.04 MW	6.43 MW
Total volume	29.9 m <sup>3</sup>	86.2 m <sup>3</sup>
Net present value	19.4 M\$	20.1 M\$
Discounted payback time	4.9 year	5.2 year
Economizer		
Tube length	5.44 m	17.51 m
Tube diameter	17.3 mm	37.3 mm
Baffle spacing	0.29	0.28
Pitch ratio	1.36	1.13
Volume	5.77 m <sup>3</sup>	32.8 m <sup>3</sup>
Purchased-equipment cost	0.1195 M\$	0.2137 M\$
Evaporator		
Tube length	7.16 m	6.66 m
Tube diameter	25.8 mm	21.7 mm
Baffle spacing	0.27	0.28
Pitch ratio	1.41	1.40
Volume	1.84 m <sup>3</sup>	1.8 m <sup>3</sup>
Purchased-equipment cost	0.0335 M\$	0.0378 M\$
Superheater		
Tube length	4.19 m	8.6 m
Tube diameter	16.0 mm	16.3 mm

Baffle spacing	0.32	0.36
Pitch ratio	1.55	1.9
Volume	1.44 m <sup>3</sup>	2.8 m <sup>3</sup>
Purchased-equipment cost	0.0415 M\$	0.0679 M\$
Internal recuperator		
Tube length	1.33 m	2.24 m
Tube diameter	41.1 mm	45.9 mm
Baffle spacing	0.29	0.29
Pitch ratio	1.02	1.01
Volume	$12.0 \text{ m}^3$	37.6 m <sup>3</sup>
Purchased-equipment cost	0.1157 M\$	0.2316 M\$
Condenser		
Tube length	1.19 m	1.59 m
Tube diameter	16.0 mm	16.9 mm
Baffle spacing	0.31	0.31
Pitch ratio	1.55	1.52
Volume	8.2 m <sup>3</sup>	10.4 m <sup>3</sup>
Purchased-equipment cost	0.2003 M\$	0.2609 M\$
Axial turbine		
Axial speed	66.3 m/s	58.3 m/s
Volume	0.5 m <sup>3</sup>	$0.5 \text{ m}^3$
Purchased-equipment cost	2.7656 M\$	2.9181 M\$

# 4. Discussion

We compare the shell and tube heat exchanger model, outlined in subsection 2.1, using an example outlined in Richardson and Peacock [21], comprising the design of a heat exchanger to sub-cool condensate from a methanol condenser with the use of liquid water as coolant. The results indicate differences less than 1% in overall heat transfer coefficients and pressure drops between the models derived here and the results provided in Richardson and Peacock [21]. These small differences are expected to be caused by differences in the calculations of thermodynamic properties of fluids, suggesting that the shell and tube heat exchanger model derived here gives reasonable results.

The total investment cost for case a) is 13.1 M\$ and 15.0 M\$ for case b). The axial turbine is the major contributor to the total investment cost of the ORC, namely, 78.6% and 72.5% for case a) and b). In Gonçalves et al. [43], the price of the expander and generator represents 48.4% of the total cost of a 385 kW ORC fuelled by sawmill wastes. However, the presence of a boiler increases the total expense by around 24.2%. Assuming the component prices reported in Gonçalves et al. [43] and a conversion factor of 1.31 \$/€ the total investment cost calculated with Eq. (33) is 18.4% lower for case a) and 10.1% lower for case b). The total investment cost calculated with Eq. (33) is also compared with the results of an equation derived in Ghirardo et al. [44] utilizing the cost of the Turboden T1100-CHP ORC and a scale factor coefficient equal to 0.867. The investment costs computed with Eq. (33) are 22.8% and 28.8% greater than the values calculated with Ghirardo's approach. Findings suggest that the pay-back time is within the same range (4-6 years) as the one reported by Wang et al. [18] for heat source temperatures of 120 °C and 140 °C. The results of these comparisons suggest that the economic analysis in this paper is in accordance with the results available in the literature.

In accordance with the results presented in Sun and Li [8] and Roy et al. [9], higher expander inlet pressures provide a higher net power generation and a higher compactness of the economizer, evaporator and superheater. Similarly to the works carried out by Roy et al. [9], Baik et al. [12] and Dai et al. [14], an optimal value for the turbine inlet temperature can be found. In this paper average turbine inlet temperatures of 320 °C (cyclopentane) and of 300 °C (acetone) are found to be the optimal compromise between system performance, compactness and economic revenue. As is also suggested in Baik et al. [12], increasing the size of the evaporator and condenser enhances the thermal efficiency of the ORC (see Figs. (6) and (8)). However, this results in a higher investment cost of the heat transfer equipment. Hence, an optimal volume is found where the net present value reaches the maximum (see Figs. (7) and (9)).

As reported in section 3, the multi-objective process indicates that acetone and cyclopentane are the optimal working fluids in terms of efficiency, compactness and economy. The optimal working fluids differ from the ones suggested in previous works refs. [8-18] since in this paper the heat source is at around 370 °C while in refs. [8-18] the heat source is at lower temperature level (100 – 200 °C). However, acetone and cyclopentane are suggested to be suitable working fluids for ORC applications also in other works. In He et al. [45], cyclopentane provides the highest thermal efficiency (20.8%) in an ORC used for waste heat recovery of an internal combustion engine. Lai et al. [46] rank cyclopentane as the third best working fluid: ORC net power output is 1 MW and the heat carrier inlet and outlet temperatures are 280°C and 350 °C. Ginosar et al. [47] assess the thermal stability of cyclopentane. The authors measure a decomposition rate up to 1500 ppm at 350 °C [47]. The maximum temperature in the ORC should then be lower than 300 °C where the decomposition rate is in the order of 270 ppm [47]. In the present paper, the highest turbine inlet temperature is 276.9 °C. Wang et al. [48] show that acetone exhibits the lowest exergy destruction in the overall ORC for low-temperature waste heat recovery. However, the authors discard the fluid, since the condensing pressure is less than the atmospheric pressure leading to the infiltration of ambient air into the loop. As reported by Dai et al. [14], low specific volumes are crucial to decrease the dimensions of the expander. As surveyed by Nouman [49], acetone presents the lowest volumetric flow rate and expansion ratio in ORC applications. Therefore, the fluid is proposed for the design of compact ORCs, since the size and material cost of the system are reduced.

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The present methodology can be implemented to design ORC units converting heat at different temperature levels into electric or mechanical power. At each temperature level, the three-dimensional Pareto front for each optimal working fluid is identified. In the multi-objective optimization method proposed in Salcedo et al. [17], the objective functions are the environmental impact and the specific cost of a solar steam Rankine cycle. Wang et al. [18] employs the heat exchanger area per unit power output and heat recovery efficiency as targets. In this paper the desired compactness and economic revenue can be selected from the optimal front (see Figs. (6) and (7)). As an improvement of the work presented by Wang et al. [18], in this work the optimal pinch points and the fluid velocities in the shell and on the tubes side of economizer, evaporator, superheater, and internal recuperator can be identified. In contrast with Wang et al. [18] where simple heat transfer and pressure drop correlations for horizontal tubes are employed, this paper introduces specific equations (see Eqs. (5)-(11)) for the shell and tube heat exchanger in the multi-objective optimization. Thus, the geometry of the heat transfer equipment can be assessed and utilized to select available components on the market.

However, since the heat transfer equipment considered in this analysis is the shell and tube heat exchanger, the field of application is directed towards MW-size systems with high temperature heat sources (350 °C - 250 °C). In fact, shell and tube heat exchangers are normally employed for high temperature and pressure processes. At a maximum operating temperature and pressure in the ORC lower than 250 °C and 30 bar and at mass flow rates lower than 2500 m<sup>3</sup>/h [21], the plate heat exchanger are the preferable heat transfer equipment due to its flexibility and compactness. The algorithm provides also the geometry of the economizer, evaporator, superheater, internal recuperator and condenser. Hence, the standard dimensions of the tubes (outer diameter and length), the shell diameter, the baffle spacing and the pitch ratio can be selected directly from the outcomes of the shell and tube design process. However, for a more accurate estimation of the overall heat transfer coefficient and of the pressure drop, specific correlations for the selected working fluid should replace the more generic approach presented in section 2.1.

#### 5. Conclusions

We propose a multi-objective optimization that considers the thermal efficiency, compactness and net present value, by employing the genetic algorithm to design organic Rankine cycles. The shell and tube heat exchangers are the heat transfer equipment. The space requirement of the ORC is assessed by calculating the geometry (tube diameter and length, pitch and baffle spacing) of the shell and tube heat exchanger following a well-established design procedure. We employ different heat transfer correlations depending on the fluid phase, and we also quantify pressure drops within the cycle. The variables considered in the optimization routine are the turbine inlet pressure, pinch points of the evaporator, superheater, internal recuperator and condenser, the velocity on the shell side of the heat exchangers, and the temperature at the outlet of the condenser.

We apply the methodology to recover the waste heat from the SGT-500 gas turbine utilized to support the power demand in the Draugen off-shore platform. The results suggest that the two most suitable working fluids are acetone and cyclopentane. For acetone, the thermal efficiency ranges from 23.7 to 27.0%, in volume from 14.5 to 57.5 m<sup>3</sup>, and in net present value from 17.7 to 19.8 M\$. Cyclopentane performs better both in terms of thermal efficiency (27.0 to 28.1%) and of net present value (19.7 to 20.1 M\$). However, the usable volume becomes larger (55.0 to 98.4 m<sup>3</sup>). Based on the volume versus thermal efficiency and NPV versus volume curves, we propose two possible solutions and list the geometry of the economizer, evaporator, superheater, internal recuperator and condenser.

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Nomenclature	TUR	turbine
Nomenclature	TUR	turbine

Abbreviations		Notations		
CC	combustion chamber	A	area [m <sup>2</sup> ]	
DC	direct cost	a, b, c, d, e	coefficients in Eqs. (38) and (39)	
DPB	discounted payback period [year]	b <sub>c</sub>	baffle cut	
ECO	economizer	С	speed [m/s]	
EVA	evaporator	$c_p$	specific heat capacity [kJ/(kg °C)]	
GA	genetic algorithm	d	diameter [m]	
GEN	electric generator	f	function	
GT	gas turbine	F <sub>t</sub>	temperature correction factor	
GWP	global warming potential	F <sub>ts</sub>	heat exchanger correction factor	
НРС	high-pressure compressor	$F_{tv}$	turbine correction factor	
HPT	high-pressure turbine	g	acceleration of gravity [m/s <sup>2</sup> ]	
INH	intermediate heat exchanger	h	heat transfer coefficient [W/(m <sup>2</sup> °C)]	
IR	internal recuperator	or enthalpy []	cJ/kg]	
LHV	lower heating value [kJ/kg]	hu	utilization factor [h/y]	
LPC	low-pressure compressor	HR	heat rate [kJ/kWh]	
LPT	low-pressure turbine	ITOT	total capital investment [\$]	
NG	natural gas	i	vear	
NPV	net present value	i	tube side heat transfer factor	
ORC	organic Rankine cycle	jtn	tube side friction factor	
PEC	purchased-equipment cost	Jtf	shall side heat transfer factor	
PT	power turbine	Jsh	shell side friction factor	
SUP	superheater	Jsf	shen side incuon factor	

l	length [m]	и	fluid velocity [m/s]	
LHV	lower heating value [kJ/kg]	V	volume [m <sup>3</sup> ]	
Μ	molecular mass [kg/kmol]	ν	specific volume [m <sup>3</sup> /kg]	
Ма	operating and maintenance factor	<i>॑</i> V	volume rate [m <sup>3</sup> /s]	
m	exponent in Eq. (6)	Ŵ	mechanical power [kW]	
'n	mass flow [kg/s]			
N <sub>t</sub>	number of tubes	Greek symbols		
n	number of years	Δ	difference	
NPV	net present value	ρ	density [kg/m <sup>3</sup> ]	
Nu	Nusselt number	λ	thermal conductivity $[kW/(m °C)]$	
<i>₽</i>	electric power [kW]	μ	dynamic viscosity [N s/m <sup>2</sup> ]	
p	pressure [Pa] or price [NOK/tons]	Г	tube loading [kg/(m s)]	
$p_t$	tube pitch [m]	η	efficiency	
PEC	purchased-equipment cost			
Pr	Prandtl number	Subscripts		
q	interest factor	b	baffle	
Ż	heat rate [kW]	$CO_2$	carbon dioxide	
R	yearly income [\$/y]	cond	condenser	
$R_p$	surface roughness [µm]	е	equivalent	
Re	Reynolds number	eco	economizer	
Т	temperature [K]	el	electric	
t	temperature [°C]	eva	evaporator	
U	overall heat transfer coefficient	g	gas	
[kW/(m <sup>2</sup> K)]		gen	generator	

ht	heat exchanger	r	reduced
i	inside	S	shell
id	inside dirt coefficient	sup	superheater
in	inlet	SW	shell wall
l	liquid	t	tube
lm	logarithmic mean	th	thermal
m	mechanical	tot	total
nb	nucleate boiling	ts	target shell
net	net	tt	target tube
0	outside	tur	turbine
od	outside dirt coefficient	tw	tube wall
out	outlet	W	wall or water
p	pump	x	axial

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