

# MCGILL UNIVERSITY

## MULTIDISCIPLINARY DESIGN OPTIMIZATION

MECH 579

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**Final Project: Shell and tube heat exchanger design optimization**

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# 1 Introduction

Shell and tube heat exchangers are crucial in cooling hydraulic fluids, demanding a balance between heat transfer efficiency and cost-effectiveness. There are several applications of this type of heat exchanger in the industry. Optimization involves various components like shell, tube, and baffle to maximize conductivity while maintaining affordability. This project aims to enhance the heat conductivity of a shell and tube heat exchanger using Multi-disciplinary design Optimization.

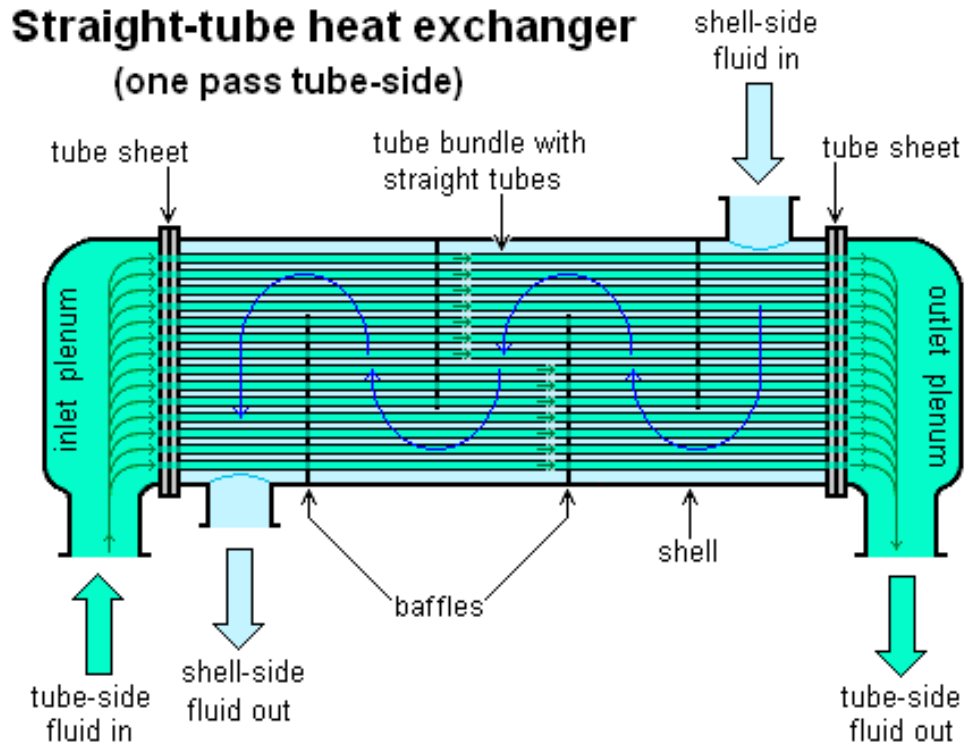


Figure 1: Shell and tube heat exchanger

Fig. 1 shows the diagram of a shell and tube heat exchanger. It is a one-pass tube side. The fluid to be cooled is water flowing in the tube, whereas the shell contains the hydraulic fluid used to cool the water. In this project, I have considered air as the cooling fluid. The entry temperature of the air is lower than the temperature of water.

## 2 Discipline

The following disciplines are involved in a Shell and Tube Heat Exchanger:

1. Structure Design
2. Thermal Engineering

## 3 Objective function

### 3.1 Structure Design Discipline

For efficient water cooling, a larger shell with more cooling fluid seems ideal, but beyond a point, increasing fluid volume doesn't enhance the cooling rate. Thus, determining the minimum shell size essential for required cooling efficiency is crucial for economic viability. This defines the objective function of the shell subsystem,  $f$ :

$$\text{minimize } F_s = 2.66175 \times L_t \times (D_{ot})^2 \times N_t$$

### 3.2 Thermal Engineering Discipline

Tubes play a vital role in preventing fluid contamination and facilitating efficient heat transfer. Increasing tube count directly enhances overall heat transfer. Objective: Minimize  $f$  to maximize the overall heat transfer coefficient  $U$ .

$$\text{minimize } F_t = \frac{1}{h_i A_i (T_i - T_a)} + \left( \frac{1}{2\pi k L_t (T_o - T_i)} \right) \ln \left( \frac{D_{ot}}{D_{it}} \right) + \frac{1}{h_o A_o (T_{eW} - T_o)}$$

### 3.3 Combined objective function

$$\text{minimize } F = w_1(F_s) - (1 - w_1)F_t$$

where,  $w_1$  is the weight associated with the objective function. In this case, it will be varied from 0.1 to 0.9 in the step of 0.2.

## 4 Optimization problem formulation

$$\begin{aligned}
& \text{minimize} && F = w_1(F_s(\mathbf{X}_s, \mathbf{Z}) - (1 - w_1)F_t(\mathbf{X}_t, \mathbf{Z}, T_o(\mathbf{X}_t, \mathbf{Z}, A))) \\
& \text{with respect to} && \mathbf{X}_s \in R^3, \mathbf{X}_t \in R^3, \mathbf{Z} \in R^2 \\
& \text{subject to Governing equation} && \hat{R}_k(\mathbf{X}_t, A, \mathbf{Z}, T_o(A, \mathbf{X}_t, \mathbf{Z})) = 0 \\
& \text{subject to constraint} && \hat{C}_1(\mathbf{X}_t, \hat{R}_k, \mathbf{Z}, \text{HTR}(\mathbf{X}_t, \hat{R}_k, \mathbf{Z})) > 0 \\
& \text{subject to constraint} && \hat{C}_2(\mathbf{X}_t, \mathbf{Z}) > 0 \\
& \text{subject to constraint} && \hat{C}_3(\mathbf{X}_t, \mathbf{Z}) > 0 \\
& \text{subject to constraint} && \hat{C}_4(\mathbf{X}_t) > 0
\end{aligned}$$

$T_o$  will be solved using the heat conduction governing equation given in the constraint section. HTR will be solved using the formulae given in the Design variable section.

## 5 Design variables

### 5.1 Global Variables ( $\mathbf{Z}$ )

$L_t$  = length of a tube

$D_{ot}$  = Outer tube diameter

### 5.2 Local Variables

#### Structure Design Discipline ( $\mathbf{X}_s$ )

$D_s$  = Diameter of the shell - related to  $D_{ot}$  and  $L_t$  (discussed in section 5.4)

#### Thermal Engineering Discipline ( $\mathbf{X}_t$ )

$D_{it}$  = Inner tube diameter

$T_i$  = Temperature of the inner surface of the tube

$T_o$  = Temperature of the outer surface of the tube

$V_w$  = Velocity of the water  $A$  = Thermal constant (present in the governing equation)

### 5.3 Constant Variables and other parameters

#### Both disciplines

$P_t$  - Pitch of the tube =  $1.5 * D_{ot}$

$N_t$  = Number of tubes - 5

$L_s$  - Length of the shell =  $1.1 * L_t$

$K$  - Thermal conductivity of the tube

$V_a$  - Velocity of the cooling fluid  
 $T_a$  - Temperature of the cooling fluid  
 $T_{eW}$  - Entry temperature of the water  
 $T_{iW}$  - Exit temperature of the water  
 $h_i$  - Heat transfer coefficient - inside pipe  
 $h_o$  - Heat transfer coefficient - outside pipe  
 $Re_i$  - Reynolds number - inside pipe  
 $Re_o$  - Reynolds number - outside pipe  
 $\dot{M}$  - Mass flow rate of water  
 $Q$  - Energy supplied from the water

## 5.4 Formulae relating variables

$$\begin{aligned}
 D_s &= 0.660538 \left( \frac{A_{\text{tube}} \left( \frac{P_t}{D_t} \right)^2 \cdot D_t}{L_t} \right)^{1/2} \\
 h_i &= \frac{\left( \frac{f}{2} \right) (Re_i - 1000) Pr_i}{1 + 12.7 \left( (Pr^{2/3} - 1)(f/2)^{0.5} \right)} \frac{k}{D_{it}} \\
 h_o &= 0.0237 \cdot Re_o^{0.618} \cdot Pr_o^{1/3} \cdot \frac{k}{D_{ot}} \\
 \text{HTR} &= \frac{k(T_{ot} - T_{it})2\pi D_{ot}L_t}{D_{ot} - D_{it}}
 \end{aligned}$$

## 6 Constraints

Constraint	Definition
$\hat{R}_k : \frac{d}{dr}(r \frac{dT}{dr}) = 0$	Temperature across the thickness of tube must satisfy the differential heat conduction equation
$\hat{C}_1 : L_t/V_w - \left( \frac{Q(D_{ot}-D_{it})}{K(T_o-T_i)2\pi D_{ot}L_t} \right) > 0$	Energy supplied from water must satisfy required cooling time
$\hat{C}_2 : D_o - D_i - 0.0128 > 0$	Difference between inner and outer tube should be greater than 0.0128
$\hat{C}_3 : D_i - D_o + 0.0215 > 0$	Difference between inner and outer tube should be less than 0.0215
$\hat{C}_4 : T_o - T_i - 1 > 0$	The outer tube temperature should always be greater than the inner temperature by 1 K

**Problem d)** Write a code to solve the stated optimization problem using a direct or adjoint method to compute the derivatives. Show your derivation of the equations. Use a fixed step length (No line search is required) and select an appropriate point as your initial design point. Explain the choice of the initial design point.

**Governing equation :**  $\frac{d}{dr}(r \frac{dT}{dr}) = 0$

The following analytical equations can be derived from the above governing equation:

Analytical equation:  $T_o = A * \ln \frac{D_{ot}}{D_{it}} + T_i$

### Method to find derivative

For finding the gradient and hessian of the objective function, automatic differentiation is used and this is calculated using the **Autograd** library. This gradient and hessian are then supplied to the scipy library for optimization.

### Initial Point Selection

The design variable vector:  $\mathbf{X} = [\text{Inner tube dia, Outer tube dia, Inner tube temp, A (constant), Length of tube, Velocity of Water, Outer tube temp}]$ .

The initial point:  $\mathbf{X} = [0.1, 0.21, 245, 30, 11, 0.11, 322]$ .

Parameters	Bounds
$D_{it}$	0.025 to 0.416 <i>ft</i>
$D_{ot}$	0.0416 to 0.429 <i>ft</i>
$T_i$	243 to 322 <i>K</i>
$A$	0 to 41
$L_t$	5 to 12 <i>ft</i>
$V_w$	0.1 to 3.0 <i>ft/s</i>
$T_o$	273 to 322 <i>K</i>

Table 1: Bounds on the parameters for practical applications

For the length, the unit is taken in *ft*, temperature in *K*, and Velocity in *ft/s*. The inner and outer tube diameter is taken around 0.1 *ft* and 0.21 *ft*, respectively. The initial points are in the bounds for practical applications. The inner and outer temp is taken around 245 and 322 *k*, respectively. The initial velocity of water is taken in 0.11 *ft/s*, this has been selected as keeping in mind mass flow rate.

### Weight ( $W_1$ ) for multiobjective function

For the contour plots and function optimization  $W_1 = 0.5$ . However, for plotting the Pareto front  $W_1$  is varying from 0.1 to 0.9 in the step of 0.2.

### Constant variable values

Parameters	Values
Prandtl number (cooling fluid) $Pr_l$	4.34
Prandtl number (water) $Pr_w$	6.90
Velocity (cooling fluid)	5 $ft/s$
Temperature (cooling fluid)	242 $K$
Thermal conductivity (steel)	0.00257 $Btu/ft/s/F$
Entry temperature (Water)	323 $K$
Exit temperature (Water)	273 $K$
Mass flow rate (Water)	2.94 $Kg/s$

Table 2: Constant value of the parameters

Problem e) Show a contour plot of the function,  $f(x)$  and overplot the optimization path.

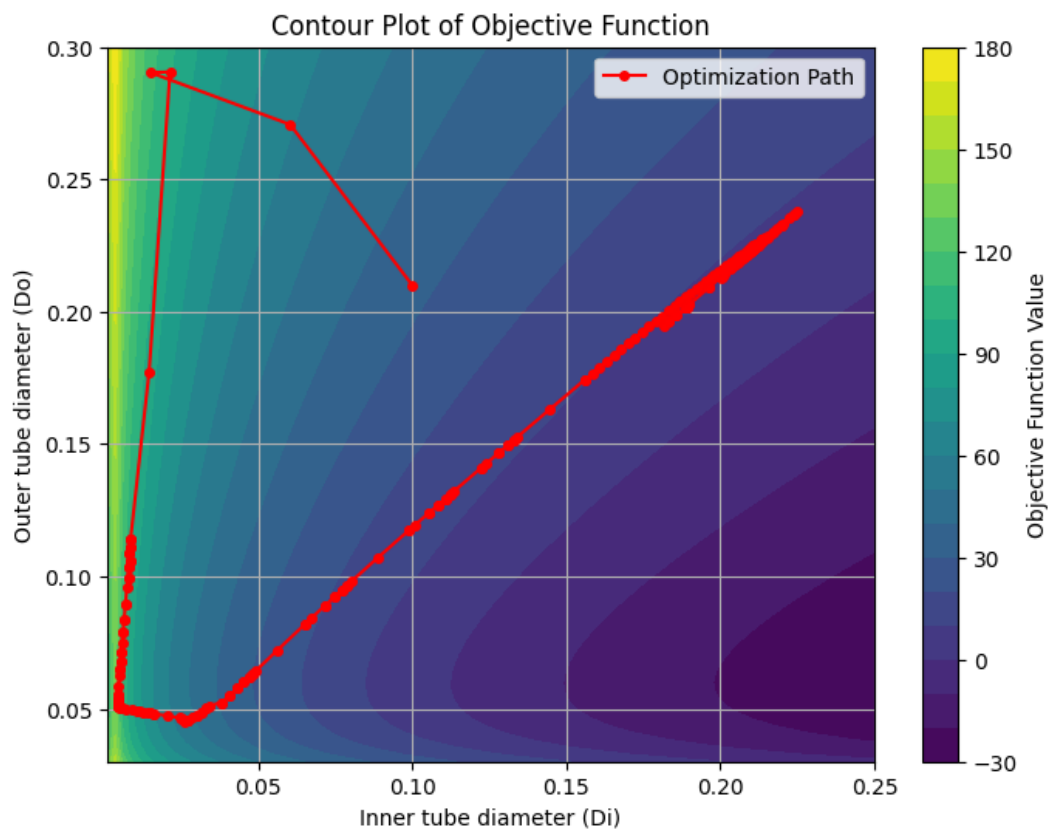


Figure 2: Contour plot and optimization path of algorithm

Fig. 2 shows the contour plot of the objective function based on two parameters inner and outer tube diameter. It also shows the optimization path for the algorithm. For plotting the objective function, these two parameters have been used. For this optimization weight is kept equal for both the objective functions from structure and thermal discipline. So, in this case,  $W_1 = 0.5$ .

The "**trust-constr**" method is used in the **Scipy** library for optimization. This method used the **finite difference method** to calculate the gradient of the lagrangian function and the constraint. The tolerance value of the convergence is set at the default value of 1E-08.

The final optimized point:  $\mathbf{X} = [0.188, 0.201, 272, 15.234, 11.999, 0.249, 273]$ .

**Problem f) Provide convergence plots of the log of the norm of the gradient and the function value versus the design iterations.**

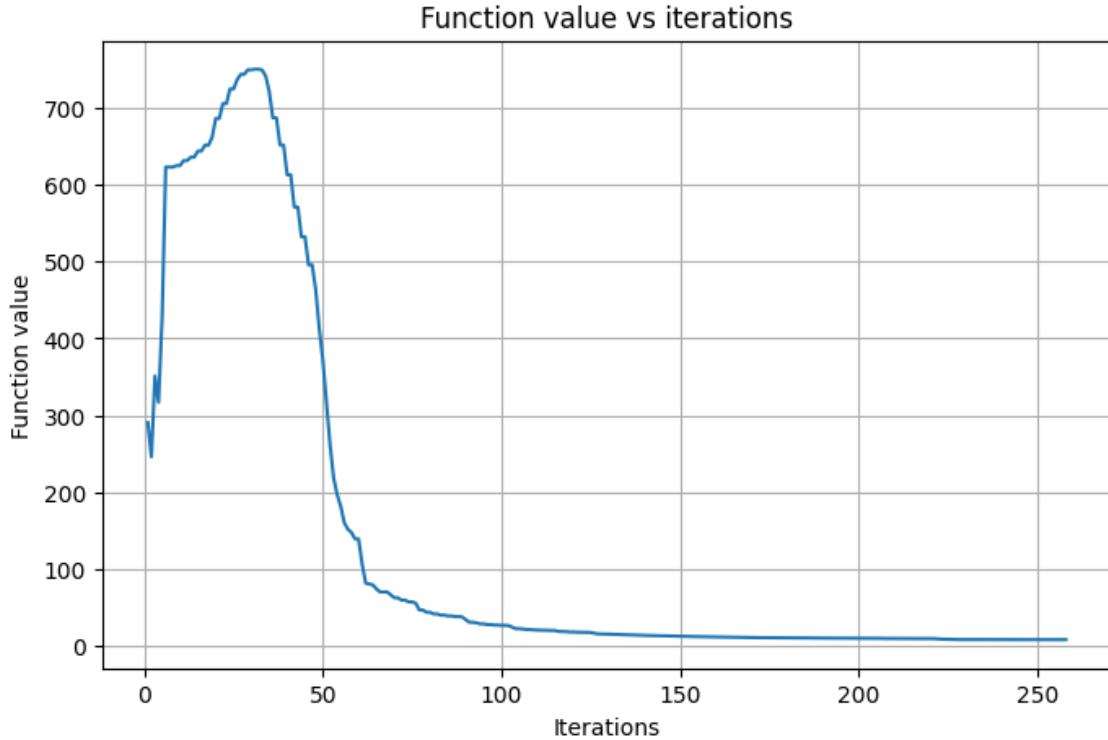


Figure 3: Convergence plot of the objective function vs iterations

Fig. 3 shows the minimization of the function value vs the number of iterations. Fig. 4 shows the convergence of the norm of the gradient vs the number of iterations. For the optimization problem, the gradient norm of the lagrangian function is reduced till 1E-08.



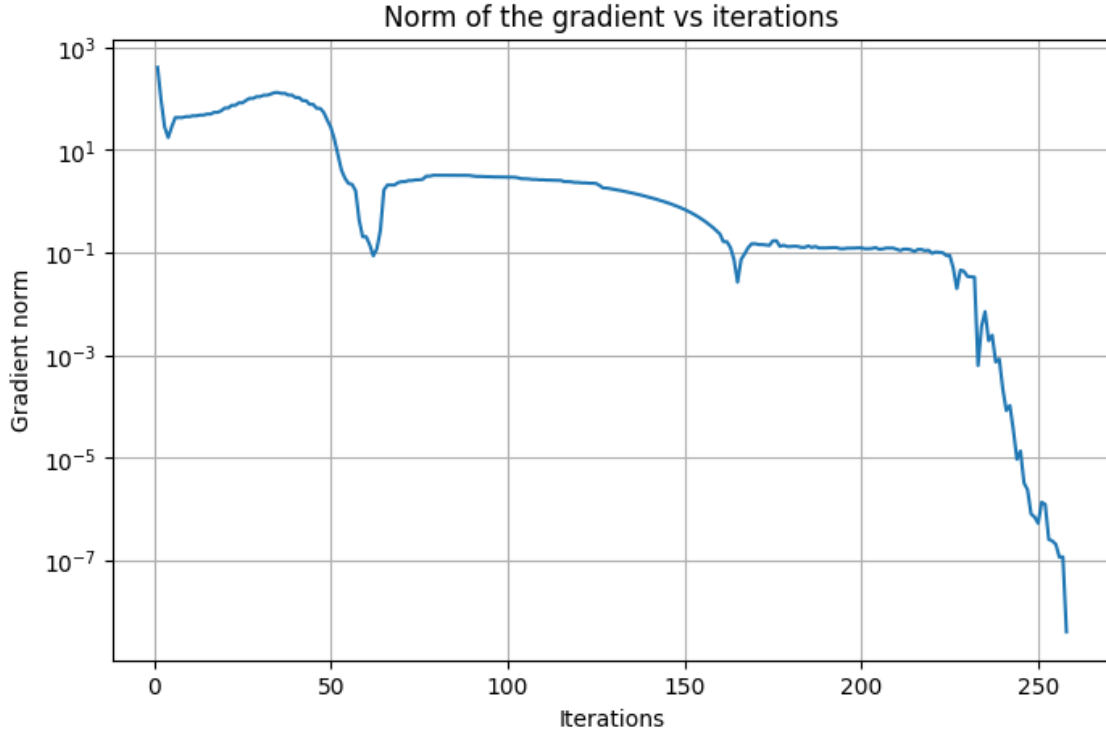


Figure 4: Convergence plot of the gradient norm vs iterations

**Problem g) Demonstrate that at every design iteration, the governing equations are fully satisfied.**

**Governing equation :**  $\frac{d}{dr}(r \frac{dT}{dr}) = 0$

The following analytical equations can be derived from the above governing equation:

Analytical equation:  $T_o = A * \ln \frac{D_{ot}}{D_{it}} + T_i$

The 1D heat conduction equation is used as the equality constraint in the above optimization problem. Fig. 5 shows the optimized values satisfying the governing equations at each iteration. For plotting the graph, the optimized point value at each iteration was put in the governing equation and the obtained governing equation value was plotted at each iteration.

The initial fluctuations in the values are because of the initial random point selection which does not satisfy the governing equation. But even if the initial points do not satisfy the governing equations, the new optimized points obtained in the next iterations satisfy the governing equations.

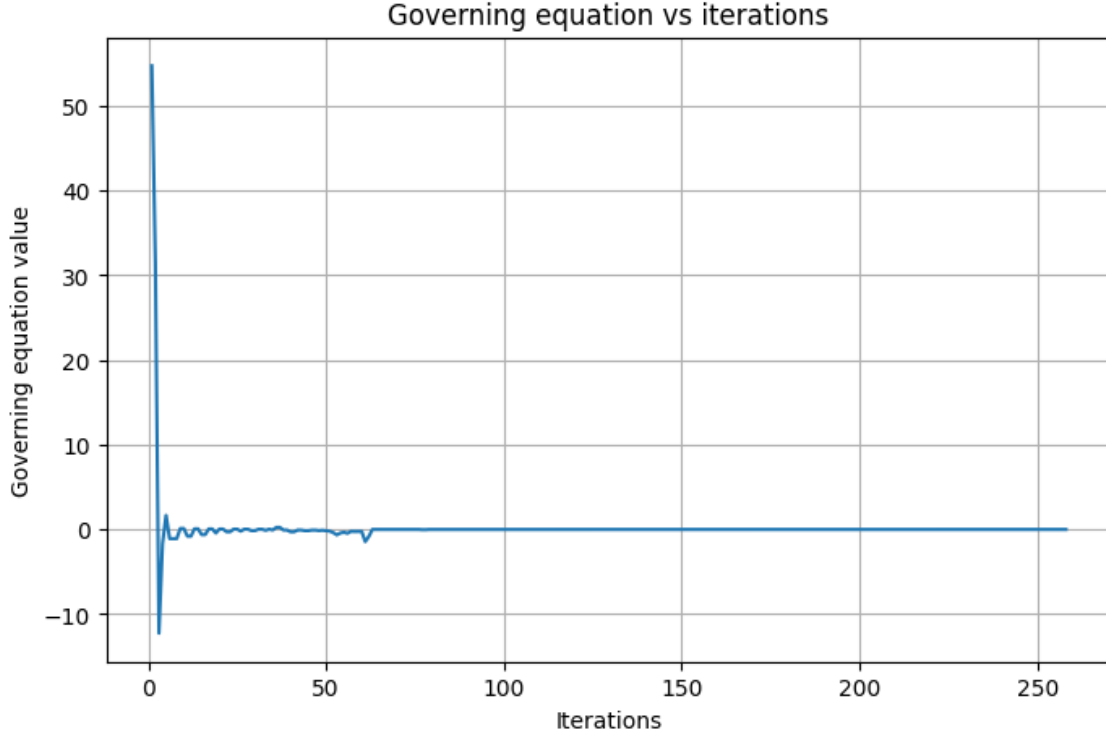


Figure 5: Plot showing the optimized values satisfying the governing equations at each iteration

### Pareto front

Fig. 6 shows the Pareto front for the multiobjective function. As mentioned in the beginning, the objective function is the combination of two functions namely: the structure function and the thermal design function. To plot this Pareto front, weight is varied from 0.1 to 0.9 in the step of 0.2, and the function value is obtained at all the optimized points for multiobjective functions at each weight.

Weight	$D_i$	$D_o$	$T_i$	$A$	$L_t$	$V_w$	$T_o$
0.1	0.325	0.338	272	25.39	11.99	0.419	273
0.3	0.233	0.246	272	18.72	11.99	0.304	273
0.5	0.188	0.201	272	15.23	11.99	0.249	273
0.7	0.151	0.163	271.9	13.06	11.99	0.215	273
0.9	0.0968	0.1096	271.1	14.9	11.99	0.251	273

Table 3: Optimized parameter value at each weight value

Table 3 shows the optimized parameters value at each of the weights.

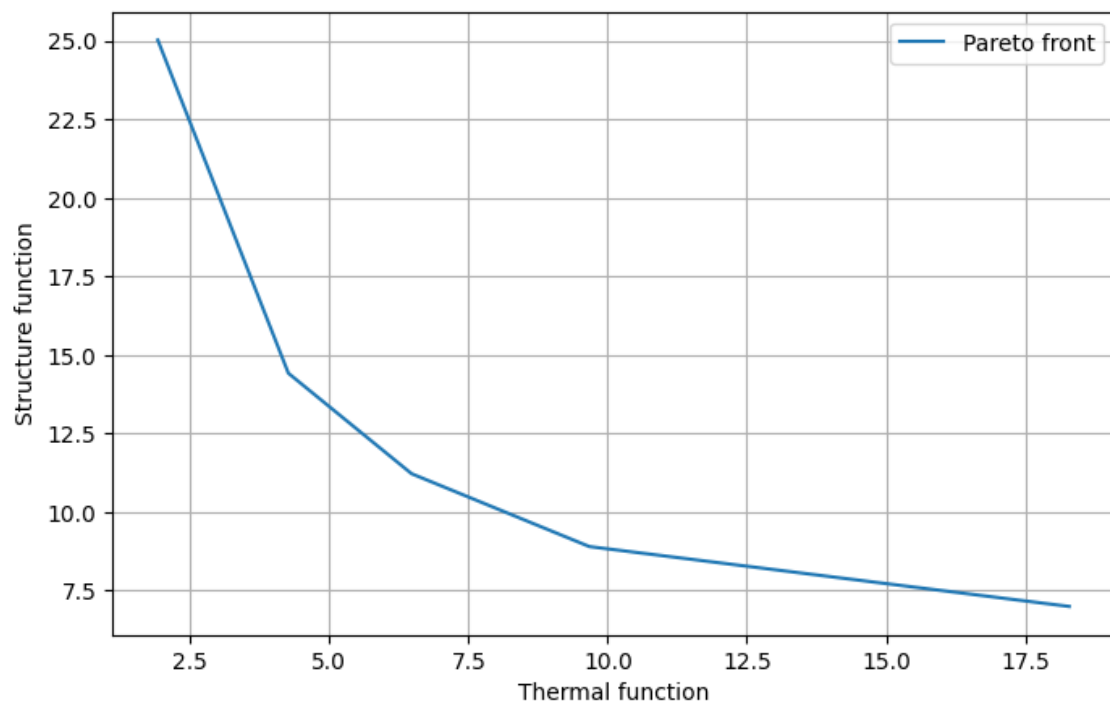


Figure 6: Plot showing the Pareto front for the multiobjective function

```

+*In[28]:*+
[source, ipython3]
----
import autograd.numpy as np
from autograd import grad, hessian
from scipy.optimize import minimize, approx_fprime
from scipy.optimize import NonlinearConstraint
from scipy.optimize import Bounds
import matplotlib.pyplot as plt
from mpl_toolkits.mplot3d import Axes3D
----

+*In[29]:*+
[source, ipython3]
----
def obj_func(X):

    x1, x2, x3, x4, x5, x6, x7 = X
    Di = x1
    Do = x2
    Ti = x3
    A = x4
    Lt = x5
    Vw = x6
    To = x7

    # constants
    Pr_l = 4.34
    Pr_w = 6.90
    Vl = 5 # ft/s
    T_wi = 323
    #T_we = 273
    #T_l = 273
    Ta = 242
    k = 0.00257
    v = 1.05*0.00001 # viscosity of fluid - same for both
    r = 1.4*0.00001 # roughness of the pipe

    # variable
    Ai = (np.pi*Di**2)/4
    Ao = (np.pi*Do**2)/4
    Re_i = (Vl * Di)/v
    Re_o = (Vw * Do)/v

    w1 = 0.5
    #To = A*np.log(Do/Di) + Ti
    S = np.log10(Re_i/1.816*np.log10(1.1*Re_i/np.log10(1+1.1*Re_i)))
    f = -2*np.log10(2.18*S/Re_i + r/(3.71*Di))
    Nu_i = ((f/2)*(Re_i-1000)*Pr_l)/(1+12.7*(Pr_l**(2/3)-1)*(f/2)**0.5)

```

```

Nu_o = 0.0237*Re_o**0.618*Pr_w**(1/3)
h_i = Nu_i*k/Di
h_o = Nu_o*k/Do

part_1 = 1/(h_i*Ai*(Ti - Ta))
part_2 = (1/(2*np.pi*k*Lt))*A*np.log(Do/Di)
part_3 = 1/(h_o*Ao*(T_wi - To))

therm_val = part_1 + part_2 + part_3

shell_val = 2.66175 * Lt * Do**2 * 5

obj_val = w1*shell_val + (1-w1)*therm_val

return obj_val

def grad_obj_func(X):

    grad_fun = grad(obj_func)
    grad_val_fun = grad_fun(X)

    return grad_val_fun

def hess_obj_func(X):
    H_fun = hessian(obj_func)
    H_matrix_fun = H_fun(X)
    return H_matrix_fun

# Functions for constraint 1
def constraint_1(X):

    x1, x2, x3, x4, x5, x6, x7 = X # Fix variable name
    Di = x1
    Do = x2
    Ti = x3
    A = x4
    Lt = x5
    Vw = x6
    To = x7

    T_wi = 323
    T_we = 273
    m = 2.94
    cp = 0.998
    k = 0.00257

    Q = m*cp*(T_wi - T_we)
    #To = A*np.log(Do/Di) + Ti
    const_val = (Lt/Vw) - (Q*(Do - Di))/(k*(To - Ti)*2*np.pi*Do*Lt) # Fix formula

```

```
return const_val
```

```
# Functions for constraint 1
```

```
def constraint_2(X):
```

```
    x1, x2, x3, x4, x5, x6, x7 = X # Fix variable name
```

```
    Di = x1
```

```
    Do = x2
```

```
    Ti = x3
```

```
    A = x4
```

```
    Lt = x5
```

```
    Vw = x6
```

```
    To = x7
```

```
    const_val_2 = To - ((A*np.log(Do/Di)) + Ti) # Fix formula
```

```
    return const_val_2
```

```
# Functions for constraint 1
```

```
def constraint_3(X):
```

```
    x1, x2, x3, x4, x5, x6, x7 = X # Fix variable name
```

```
    Di = x1
```

```
    Do = x2
```

```
    Ti = x3
```

```
    A = x4
```

```
    Lt = x5
```

```
    Vw = x6
```

```
    To = x7
```

```
    const_val_3 = Do - Di - 0.0128 # Fix formula
```

```
    return const_val_3
```

```
# Functions for constraint 1
```

```
def constraint_4(X):
```

```
    x1, x2, x3, x4, x5, x6, x7 = X # Fix variable name
```

```
    Di = x1
```

```
    Do = x2
```

```
    Ti = x3
```

```
    A = x4
```

```
    Lt = x5
```

```
    Vw = x6
```

```
    To = x7
```

```
    const_val_4 = Di - Do + 0.0215 # Fix formula
```

```
    return const_val_4
```

```

# Functions for constraint 1
def constraint_5(X):

    x1, x2, x3, x4, x5, x6, x7 = X # Fix variable name
    Di = x1
    Do = x2
    Ti = x3
    A = x4
    Lt = x5
    Vw = x6
    To = x7
    #To = A*np.log(Do/Di) + Ti
    const_val_5 = To - Ti - 1 # Fix formula

    return const_val_5

```

----

```

+*In[30]:*+
[source, ipython3]
-----

```

```

# Define the values of the independent variables
X0 = np.array([0.1, 0.21, 245, 30, 11, 0.11, 322])

```

```

# Define bounds for variables
bounds = ((0.025, 0.416), # Di
          (0.0416, 0.429), # Do
          (243, 322), # Ti
          (0, 41), # A
          (5, 12), # Lt
          (0.1, 3.0), # Vw
          (273, 322)) # To

```

```

# Define multiple constraints
constraints = [{'type': 'ineq', 'fun': constraint_1},
               {'type': 'eq', 'fun': constraint_2},
               {'type': 'ineq', 'fun': constraint_3},
               {'type': 'ineq', 'fun': constraint_4},
               {'type': 'ineq', 'fun': constraint_5}]

```

```

# Initialize lists to store convergence data
itr_list = []
obj_list = []
grad_list = []
value_list = []
grad_lag = []

```

```

def callback_function(xk, state):
    itr_list.append(state.niter)
    obj_list.append(obj_func(xk))
    grad_lag.append(state.optimality)
    value_list.append(xk)
    grad_list.append(np.linalg.norm(grad_obj_func(xk)))
    callback_function.iteration += 1

callback_function.iteration = 0 # Initialize iteration count

# Minimize the objective function
#result = minimize(obj_func, X0, method='SLSQP', bounds=bounds,
constraints=constraints, callback=callback_function)
result = minimize(obj_func, X0, method='trust-constr', jac=grad_obj_func,
hess=hess_obj_func, \
                    bounds=bounds, constraints=constraints, \
                    options={'gtol': 1e-8, 'xtol': 1e-12, 'maxiter': 300, 'verbose': 3},
\
                    callback=callback_function);

# Extract the first and second elements of value_list
Di_val = [value[0] for value in value_list]
Do_val = [value[1] for value in value_list]
A_val = [value[3] for value in value_list]
Ti_val = [value[2] for value in value_list]
To_val = [value[6] for value in value_list]

# Print the result
print("Optimal solution:", result.x)

gov_val = []
for i in range(len(Ti_val)):
    gov = To_val[i] - (A_val[i]*np.log(Do_val[i]/Di_val[i]) + Ti_val[i])
    gov_val.append(gov)

----

+*Out[30]:*+
----
| niter |f evals|CG iter|  obj func  |tr radius |  opt    |  c viol  | penalty
|barrier param|CG stop| | | | | | |
|---|---|---|---|---|---|---|---|
|-----|-----|
|  1  |  1  |  0  | +2.9070e+02 | 1.00e+00 | 4.02e+02 | 5.47e+01 | 1.00e+00 |
1.00e-01 |  0  |
|  2  |  2  |  4  | +2.4636e+02 | 7.00e+00 | 9.19e+01 | 3.16e+01 | 1.00e+00 |
1.00e-01 |  2  |
|  3  |  3  | 10  | +3.5135e+02 | 7.71e+00 | 2.78e+01 | 1.23e+01 | 9.65e+00 |

```



1.00e-01	1							
4	4	16	+3.1716e+02	9.29e+00	1.73e+01	1.69e+00	9.65e+00	
1.00e-01	1							
5	5	22	+4.2760e+02	9.63e+00	2.79e+01	1.66e+00	1.11e+02	
1.00e-01	1							
6	6	27	+6.2275e+02	9.63e+00	4.24e+01	1.08e+00	1.11e+02	
1.00e-01	4							
7	7	32	+6.2275e+02	9.63e-01	4.24e+01	1.08e+00	1.11e+02	
1.00e-01	4							
8	8	37	+6.2275e+02	9.63e-02	4.24e+01	1.08e+00	1.11e+02	
1.00e-01	2							
9	9	39	+6.2466e+02	6.74e-01	4.42e+01	1.13e-01	1.11e+02	
1.00e-01	2							
10	10	44	+6.2466e+02	6.74e-02	4.42e+01	1.13e-01	1.11e+02	
1.00e-01	2							
11	11	45	+6.3106e+02	4.72e-01	4.58e+01	7.96e-01	1.11e+02	
1.00e-01	2							
12	12	49	+6.3106e+02	7.94e-02	4.58e+01	7.96e-01	1.11e+02	
1.00e-01	2							
13	13	52	+6.3564e+02	5.56e-01	4.73e+01	7.63e-02	1.11e+02	
1.00e-01	2							
14	14	56	+6.3564e+02	8.70e-02	4.73e+01	7.63e-02	1.11e+02	
1.00e-01	2							
15	15	58	+6.4350e+02	6.09e-01	4.96e+01	6.10e-01	1.11e+02	
1.00e-01	2							
16	16	61	+6.4350e+02	1.29e-01	4.96e+01	6.10e-01	1.11e+02	
1.00e-01	2							
17	17	64	+6.5127e+02	2.57e-01	5.35e+01	7.03e-02	1.11e+02	
1.00e-01	2							
18	18	67	+6.5127e+02	1.29e-01	5.35e+01	7.03e-02	1.11e+02	
1.00e-01	2							
19	19	70	+6.6140e+02	2.57e-01	5.74e+01	4.27e-01	1.11e+02	
1.00e-01	2							
20	20	73	+6.8594e+02	5.14e-01	6.50e+01	6.08e-02	1.52e+02	
1.00e-01	2							
21	21	76	+6.8594e+02	2.35e-01	6.50e+01	6.08e-02	1.52e+02	
1.00e-01	2							
22	22	79	+7.0517e+02	4.71e-01	7.36e+01	2.76e-01	1.52e+02	
1.00e-01	2							
23	23	82	+7.0517e+02	2.35e-01	7.36e+01	2.76e-01	1.52e+02	
1.00e-01	2							
24	24	84	+7.2426e+02	4.71e-01	8.20e+01	5.14e-02	1.52e+02	
1.00e-01	2							
25	25	85	+7.2426e+02	2.35e-01	8.20e+01	5.14e-02	1.52e+02	
1.00e-01	2							
26	26	86	+7.3623e+02	2.35e-01	9.12e+01	1.98e-01	1.52e+02	
1.00e-01	2							
27	27	87	+7.4327e+02	4.71e-01	1.00e+02	4.41e-02	1.52e+02	
1.00e-01	2							
28	28	88	+7.4327e+02	2.35e-01	1.00e+02	4.41e-02	1.52e+02	

1.00e-01		2							
29		29		89		+7.4915e+02		4.71e-01	
1.00e-01		2							
30		30		90		+7.4915e+02		2.35e-01	
1.00e-01		2							
31		31		91		+7.4991e+02		4.71e-01	
1.00e-01		2							
32		32		92		+7.4991e+02		2.35e-01	
1.00e-01		2							
33		33		93		+7.4892e+02		4.71e-01	
1.00e-01		2							
34		34		94		+7.4089e+02		4.71e-01	
1.00e-01		2							
35		35		95		+7.2059e+02		4.71e-01	
1.00e-01		2							
36		36		96		+6.8669e+02		9.42e-01	
1.00e-01		2							
37		37		97		+6.8669e+02		4.71e-01	
1.00e-01		2							
38		38		98		+6.5147e+02		9.42e-01	
1.00e-01		2							
39		39		99		+6.5147e+02		4.71e-01	
1.00e-01		2							
40		40		100		+6.1279e+02		9.42e-01	
1.00e-01		2							
41		41		101		+6.1279e+02		4.71e-01	
1.00e-01		2							
42		42		102		+5.7076e+02		9.42e-01	
1.00e-01		2							
43		43		103		+5.7076e+02		4.71e-01	
1.00e-01		2							
44		44		104		+5.3225e+02		9.42e-01	
1.00e-01		2							
45		45		105		+5.3225e+02		4.71e-01	
1.00e-01		2							
46		46		106		+4.9568e+02		9.42e-01	
1.00e-01		2							
47		47		107		+4.9568e+02		4.71e-01	
1.00e-01		2							
48		48		108		+4.6351e+02		9.42e-01	
1.00e-01		2							
49		49		109		+4.1275e+02		9.42e-01	
1.00e-01		2							
50		50		111		+3.7181e+02		1.88e+00	
1.00e-01		2							
51		51		113		+3.1686e+02		3.77e+00	
1.00e-01		2							
52		52		116		+2.6256e+02		6.60e+00	
1.00e-01		4							
53		53		119		+2.1915e+02		3.64e+01	

1.00e-01		4							
54		54		121		+1.9708e+02		3.64e+01	
1.00e-01		4							
55		55		123		+1.8196e+02		3.64e+01	
1.00e-01		4							
56		56		125		+1.6059e+02		4.57e+01	
1.00e-01		4							
57		57		126		+1.5219e+02		4.57e+01	
1.00e-01		4							
58		58		127		+1.4791e+02		4.57e+01	
1.00e-01		4							
59		59		128		+1.3958e+02		4.57e+01	
1.00e-01		4							
60		60		129		+1.3958e+02		1.07e+01	
1.00e-01		4							
61		61		130		+1.0673e+02		2.13e+01	
1.00e-01		2							
62		62		132		+8.2061e+01		2.13e+01	
1.00e-01		4							
63		63		135		+8.0918e+01		1.49e+02	
1.00e-01		2							
64		64		138		+7.9889e+01		1.49e+02	
1.00e-01		4							
65		65		141		+7.4571e+01		1.49e+02	
1.00e-01		4							
66		67		143		+7.0704e+01		1.49e+02	
1.00e-01		4							
67		69		145		+7.0704e+01		1.49e+01	
1.00e-01		4							
68		70		148		+7.0704e+01		1.49e+00	
1.00e-01		2							
69		72		150		+6.6970e+01		1.05e+01	
1.00e-01		2							
70		74		152		+6.3144e+01		1.05e+01	
1.00e-01		4							
71		76		154		+6.3144e+01		1.05e+00	
1.00e-01		4							
72		78		156		+6.0046e+01		7.32e+00	
1.00e-01		2							
73		80		158		+6.0046e+01		7.32e-01	
1.00e-01		4							
74		82		160		+5.7801e+01		5.13e+00	
1.00e-01		2							
75		84		162		+5.7801e+01		5.13e-01	
1.00e-01		2							
76		86		164		+5.6146e+01		3.59e+00	
1.00e-01		2							
77		88		166		+4.7201e+01		3.59e+00	
1.00e-01		2							
78		89		168		+4.7201e+01		8.38e-01	

1.00e-01		2							
79		91		170		+4.4263e+01		5.87e+00	
1.00e-01		2							
80		92		172		+4.4263e+01		5.87e-01	
1.00e-01		2							
81		94		173		+4.2098e+01		4.11e+00	
1.00e-01		2							
82		95		175		+4.2098e+01		4.11e-01	
1.00e-01		2							
83		97		176		+4.0563e+01		2.87e+00	
1.00e-01		2							
84		99		178		+4.0563e+01		2.87e-01	
1.00e-01		2							
85		101		179		+3.9484e+01		2.01e+00	
1.00e-01		2							
86		103		180		+3.9484e+01		2.01e-01	
1.00e-01		2							
87		105		181		+3.8727e+01		1.41e+00	
1.00e-01		2							
88		107		182		+3.8727e+01		1.41e-01	
1.00e-01		2							
89		109		183		+3.8197e+01		9.86e-01	
1.00e-01		2							
90		111		184		+3.4696e+01		9.86e-01	
1.00e-01		2							
91		113		185		+3.1278e+01		1.97e+00	
1.00e-01		2							
92		115		187		+3.1278e+01		1.97e-01	
1.00e-01		2							
93		116		188		+3.0558e+01		3.94e-01	
1.00e-01		2							
94		118		189		+2.9220e+01		2.76e+00	
1.00e-01		2							
95		120		191		+2.9220e+01		2.76e-01	
1.00e-01		2							
96		122		192		+2.8309e+01		1.93e+00	
1.00e-01		2							
97		124		194		+2.8309e+01		1.93e-01	
1.00e-01		2							
98		126		195		+2.7681e+01		1.35e+00	
1.00e-01		2							
99		128		196		+2.7681e+01		1.35e-01	
1.00e-01		2							
100		130		197		+2.7247e+01		9.47e-01	
1.00e-01		2							
101		132		198		+2.7247e+01		9.47e-02	
1.00e-01		2							
102		134		199		+2.6946e+01		6.63e-01	
1.00e-01		2							
103		136		200		+2.4927e+01		6.63e-01	

1.00e-01		2							
104		138		201		+2.2976e+01		1.33e+00	
1.00e-01		2							
105		140		202		+2.2976e+01		1.33e-01	
1.00e-01		2							
106		141		203		+2.2579e+01		2.65e-01	
1.00e-01		2							
107		143		204		+2.1824e+01		1.86e+00	
1.00e-01		2							
108		145		205		+2.1824e+01		1.86e-01	
1.00e-01		2							
109		147		206		+2.1307e+01		1.30e+00	
1.00e-01		2							
110		149		207		+2.1307e+01		1.30e-01	
1.00e-01		2							
111		151		208		+2.0951e+01		9.09e-01	
1.00e-01		2							
112		153		209		+2.0951e+01		9.09e-02	
1.00e-01		2							
113		155		210		+2.0704e+01		6.37e-01	
1.00e-01		2							
114		157		211		+2.0704e+01		6.37e-02	
1.00e-01		2							
115		159		212		+2.0532e+01		4.46e-01	
1.00e-01		2							
116		161		213		+1.9372e+01		8.91e-01	
1.00e-01		2							
117		163		214		+1.9372e+01		8.91e-02	
1.00e-01		2							
118		164		215		+1.9140e+01		1.78e-01	
1.00e-01		2							
119		166		216		+1.8691e+01		1.25e+00	
1.00e-01		2							
120		168		217		+1.8691e+01		1.25e-01	
1.00e-01		2							
121		170		218		+1.8384e+01		8.73e-01	
1.00e-01		2							
122		172		219		+1.8384e+01		8.73e-02	
1.00e-01		2							
123		174		220		+1.8173e+01		6.11e-01	
1.00e-01		2							
124		176		221		+1.8173e+01		6.11e-02	
1.00e-01		2							
125		178		222		+1.8027e+01		4.28e-01	
1.00e-01		2							
126		180		223		+1.7051e+01		4.28e-01	
1.00e-01		2							
127		182		224		+1.6146e+01		8.56e-01	
1.00e-01		2							
128		184		225		+1.6146e+01		8.56e-02	

1.00e-01	2							
129	185	226	+1.5972e+01	8.56e-02	1.75e+00	1.09e-03	1.97e+02	
1.00e-01	2							
130	186	227	+1.5804e+01	8.56e-02	1.70e+00	1.03e-03	1.97e+02	
1.00e-01	2							
131	187	228	+1.5640e+01	8.56e-02	1.65e+00	1.01e-03	1.97e+02	
1.00e-01	2							
132	188	229	+1.5480e+01	8.56e-02	1.60e+00	9.85e-04	1.97e+02	
1.00e-01	2							
133	189	230	+1.5323e+01	8.56e-02	1.55e+00	9.59e-04	1.97e+02	
1.00e-01	2							
134	190	231	+1.5170e+01	8.56e-02	1.50e+00	9.31e-04	1.97e+02	
1.00e-01	2							
135	191	232	+1.5019e+01	8.56e-02	1.45e+00	8.98e-04	1.97e+02	
1.00e-01	2							
136	192	233	+1.4873e+01	8.56e-02	1.39e+00	8.62e-04	1.97e+02	
1.00e-01	2							
137	193	234	+1.4729e+01	8.56e-02	1.34e+00	8.22e-04	1.97e+02	
1.00e-01	2							
138	194	235	+1.4589e+01	8.56e-02	1.29e+00	7.80e-04	1.97e+02	
1.00e-01	2							
139	195	236	+1.4451e+01	8.56e-02	1.24e+00	7.35e-04	1.97e+02	
1.00e-01	2							
140	196	237	+1.4316e+01	8.56e-02	1.19e+00	6.88e-04	1.97e+02	
1.00e-01	2							
141	197	238	+1.4184e+01	8.56e-02	1.14e+00	6.41e-04	1.97e+02	
1.00e-01	2							
142	198	239	+1.4055e+01	8.56e-02	1.09e+00	5.95e-04	1.97e+02	
1.00e-01	2							
143	199	240	+1.3929e+01	8.56e-02	1.04e+00	5.50e-04	1.97e+02	
1.00e-01	2							
144	200	241	+1.3805e+01	8.56e-02	9.87e-01	5.07e-04	1.97e+02	
1.00e-01	2							
145	201	242	+1.3684e+01	8.56e-02	9.37e-01	4.67e-04	1.97e+02	
1.00e-01	2							
146	202	243	+1.3566e+01	8.56e-02	8.88e-01	4.32e-04	1.97e+02	
1.00e-01	2							
147	203	244	+1.3451e+01	8.56e-02	8.38e-01	4.00e-04	1.97e+02	
1.00e-01	2							
148	204	245	+1.3338e+01	8.56e-02	7.87e-01	3.71e-04	1.97e+02	
1.00e-01	2							
149	205	246	+1.3230e+01	8.56e-02	7.37e-01	3.47e-04	1.97e+02	
1.00e-01	2							
150	206	247	+1.3125e+01	8.56e-02	6.87e-01	3.25e-04	1.97e+02	
1.00e-01	2							
151	207	248	+1.3023e+01	8.56e-02	6.36e-01	3.06e-04	1.97e+02	
1.00e-01	2							
152	208	249	+1.2926e+01	8.56e-02	5.86e-01	2.89e-04	1.97e+02	
1.00e-01	2							
153	209	250	+1.2833e+01	8.56e-02	5.37e-01	2.72e-04	1.97e+02	

1.00e-01	2								
154	210	251	+1.2744e+01	8.56e-02	4.88e-01	2.56e-04	1.97e+02		
1.00e-01	2								
155	211	252	+1.2660e+01	8.56e-02	4.40e-01	2.40e-04	1.97e+02		
1.00e-01	2								
156	212	253	+1.2581e+01	8.56e-02	3.94e-01	2.22e-04	1.97e+02		
1.00e-01	2								
157	213	254	+1.2506e+01	8.56e-02	3.49e-01	2.04e-04	1.97e+02		
1.00e-01	2								
158	214	255	+1.2435e+01	8.56e-02	3.07e-01	1.85e-04	1.97e+02		
1.00e-01	2								
159	215	256	+1.2370e+01	8.56e-02	2.67e-01	1.64e-04	1.97e+02		
1.00e-01	2								
160	216	257	+1.2308e+01	1.71e-01	2.30e-01	1.42e-04	1.97e+02		
1.00e-01	2								
161	218	258	+1.2196e+01	1.20e+00	1.62e-01	9.26e-06	1.97e+02		
1.00e-01	2								
162	219	260	+1.2196e+01	1.20e-01	1.62e-01	9.26e-06	1.97e+02		
1.00e-01	2								
163	221	261	+1.2128e+01	8.39e-01	1.24e-01	1.60e-06	1.97e+02		
1.00e-01	2								
164	223	262	+1.1725e+01	1.68e+00	7.26e-02	2.90e-04	1.97e+02		
1.00e-01	2								
165	224	264	+1.1662e+01	1.68e+00	2.64e-02	6.67e-04	1.97e+02		
1.00e-01	2								
166	225	266	+1.1684e+01	1.68e+00	7.27e-02	1.68e-03	1.97e+02		
1.00e-01	2								
167	227	268	+1.1689e+01	3.36e+00	9.35e-02	4.77e-06	1.97e+02		
1.00e-01	2								
168	229	270	+1.1644e+01	3.36e+00	1.24e-01	1.34e-05	1.97e+02		
1.00e-01	4								
169	231	273	+1.1383e+01	6.08e+00	1.47e-01	9.72e-06	1.97e+02		
1.00e-01	4								
170	233	275	+1.1383e+01	6.08e-01	1.47e-01	9.72e-06	1.97e+02		
1.00e-01	2								
171	234	277	+1.1317e+01	1.22e+00	1.42e-01	1.96e-04	1.97e+02		
1.00e-01	2								
172	236	279	+1.1317e+01	1.22e-01	1.42e-01	1.96e-04	1.97e+02		
1.00e-01	2								
173	237	281	+1.1306e+01	1.22e-01	1.40e-01	1.42e-04	1.97e+02		
1.00e-01	2								
174	239	283	+1.1296e+01	8.51e-01	1.37e-01	1.66e-06	1.97e+02		
1.00e-01	2								
175	241	284	+1.1255e+01	1.70e+00	1.69e-01	1.33e-04	1.97e+02		
1.00e-01	2								
176	243	286	+1.1255e+01	1.70e-01	1.69e-01	1.33e-04	1.97e+02		
1.00e-01	2								
177	245	288	+1.1212e+01	3.40e-01	1.31e-01	8.63e-05	1.97e+02		
1.00e-01	2								
178	247	290	+1.1175e+01	3.40e-01	1.38e-01	7.93e-05	1.97e+02		

1.00e-01		2							
179		249		292		+1.1143e+01		6.80e-01	
1.00e-01		2							
180		251		294		+1.1143e+01		6.80e-02	
1.00e-01		2							
181		253		295		+1.1134e+01		4.76e-01	
1.00e-01		2							
182		255		296		+1.1084e+01		9.53e-01	
1.00e-01		2							
183		257		297		+1.0985e+01		1.91e+00	
1.00e-01		2							
184		259		299		+1.0985e+01		1.91e-01	
1.00e-01		2							
185		261		300		+1.0962e+01		3.81e-01	
1.00e-01		2							
186		263		302		+1.0921e+01		7.62e-01	
1.00e-01		2							
187		265		304		+1.0830e+01		7.62e-01	
1.00e-01		2							
188		267		306		+1.0743e+01		5.33e+00	
1.00e-01		2							
189		269		308		+1.0743e+01		5.33e-01	
1.00e-01		2							
190		271		309		+1.0743e+01		5.33e-02	
1.00e-01		2							
191		273		310		+1.0736e+01		3.73e-01	
1.00e-01		2							
192		275		311		+1.0692e+01		2.61e+00	
1.00e-01		2							
193		277		313		+1.0692e+01		2.61e-01	
1.00e-01		2							
194		279		314		+1.0669e+01		5.23e-01	
1.00e-01		2							
195		281		316		+1.0669e+01		5.23e-02	
1.00e-01		2							
196		283		317		+1.0660e+01		3.66e-01	
1.00e-01		2							
197		285		318		+1.0660e+01		3.66e-02	
1.00e-01		2							
198		287		319		+1.0655e+01		2.56e-01	
1.00e-01		2							
199		289		320		+1.0624e+01		1.79e+00	
1.00e-01		2							
200		291		322		+1.0624e+01		1.79e-01	
1.00e-01		2							
201		293		323		+1.0608e+01		3.59e-01	
1.00e-01		2							
202		295		325		+1.0608e+01		3.59e-02	
1.00e-01		2							
203		297		326		+1.0603e+01		2.51e-01	



1.00e-01		2							
204		299		327		+1.0572e+01		5.02e-01	
1.00e-01		2							
205		301		329		+1.0519e+01		1.00e+00	
1.00e-01		2							
206		303		331		+1.0396e+01		1.00e+00	
1.00e-01		2							
207		305		333		+1.0248e+01		7.03e+00	
1.00e-01		2							
208		307		336		+1.0248e+01		7.03e-01	
1.00e-01		4							
209		309		338		+1.0248e+01		7.03e-02	
1.00e-01		2							
210		311		339		+1.0243e+01		1.41e-01	
1.00e-01		2							
211		313		340		+1.0237e+01		2.81e-01	
1.00e-01		2							
212		315		342		+1.0210e+01		5.62e-01	
1.00e-01		2							
213		317		344		+1.0210e+01		5.62e-02	
1.00e-01		2							
214		319		345		+1.0206e+01		3.94e-01	
1.00e-01		2							
215		321		346		+1.0179e+01		3.94e-01	
1.00e-01		2							
216		323		348		+1.0138e+01		7.87e-01	
1.00e-01		2							
217		325		350		+1.0138e+01		7.87e-02	
1.00e-01		2							
218		327		351		+1.0133e+01		5.51e-01	
1.00e-01		2							
219		329		352		+1.0080e+01		5.51e-01	
1.00e-01		2							
220		331		354		+1.0036e+01		3.86e+00	
1.00e-01		2							
221		331		354		+1.0036e+01		1.93e+01	
2.00e-02		0							
222		332		358		+9.6431e+00		1.93e+01	
2.00e-02		4							
223		333		361		+9.3957e+00		1.93e+01	
2.00e-02		4							
224		334		364		+9.2505e+00		1.93e+01	
2.00e-02		4							
225		335		368		+9.2505e+00		2.44e+00	
2.00e-02		2							
226		336		370		+9.0487e+00		4.88e+00	
2.00e-02		2							
227		337		372		+8.9017e+00		4.98e+00	
2.00e-02		4							
228		338		374		+8.8248e+00		1.32e+01	

2.00e-02		4							
229		339		377		+8.8101e+00		1.32e+01	
2.00e-02		2							
230		340		380		+8.8463e+00		1.32e+01	
2.00e-02		4							
231		341		381		+8.8459e+00		1.32e+01	
2.00e-02		4							
232		342		382		+8.8456e+00		1.32e+01	
2.00e-02		4							
233		344		384		+8.8115e+00		1.32e+01	
2.00e-02		4							
234		344		384		+8.8115e+00		6.61e+01	
4.00e-03		0							
235		345		386		+8.7543e+00		6.61e+01	
4.00e-03		4							
236		346		388		+8.7413e+00		6.61e+01	
4.00e-03		4							
237		346		388		+8.7413e+00		3.31e+02	
8.00e-04		0							
238		347		390		+8.7252e+00		3.31e+02	
8.00e-04		4							
239		347		390		+8.7252e+00		1.65e+03	
1.60e-04		0							
240		348		392		+8.7220e+00		1.65e+03	
1.60e-04		4							
241		349		397		+8.7218e+00		1.65e+03	
1.60e-04		4							
242		349		397		+8.7218e+00		8.27e+03	
3.20e-05		0							
243		350		399		+8.7213e+00		8.27e+03	
3.20e-05		4							
244		351		404		+8.7212e+00		8.27e+03	
3.20e-05		4							
245		351		404		+8.7212e+00		4.13e+04	
6.40e-06		0							
246		352		406		+8.7211e+00		4.13e+04	
6.40e-06		4							
247		352		406		+8.7211e+00		2.07e+05	
1.28e-06		0							
248		353		408		+8.7210e+00		2.07e+05	
1.28e-06		4							
249		354		413		+8.7210e+00		2.07e+05	
1.28e-06		4							
250		354		413		+8.7210e+00		1.03e+06	
2.56e-07		0							
251		355		415		+8.7210e+00		1.03e+06	
2.56e-07		4							
252		356		416		+8.7210e+00		1.03e+06	
2.56e-07		4							
253		358		417		+8.7210e+00		1.03e+06	

2.56e-07	4								
254	359	423	+8.7210e+00	1.03e+06	2.40e-07	1.33e-09	1.00e+00		
2.56e-07	1								
255	359	423	+8.7210e+00	5.17e+06	2.05e-07	1.33e-09	1.00e+00		
5.12e-08	0								
256	360	425	+8.7210e+00	5.17e+06	1.16e-07	6.20e-12	1.00e+00		
5.12e-08	4								
257	361	431	+8.7210e+00	5.17e+06	1.17e-07	2.01e-10	1.00e+00		
5.12e-08	1								
258	362	432	+8.7210e+00	5.17e+06	4.06e-09	0.00e+00	1.00e+00		
5.12e-08	4								

`gtol` termination condition is satisfied.

Number of iterations: 258, function evaluations: 362, CG iterations: 432,  
 optimality: 4.06e-09, constraint violation: 0.00e+00, execution time: 5.5 s.  
 Optimal solution: [1.88675408e-01 2.01475408e-01 2.72000001e+02 1.52347973e+01  
 1.19999998e+01 2.49482263e-01 2.73000001e+02]

----

```

+*In[31]:*+
[source, ipython3]
----
# Define the ranges for Do and Lt
Do_values = np.linspace(0.03, 0.3, 100) # Range for Do
Di_values = np.linspace(0.001, 0.25, 100) # Range for Di

# Create a grid of Do and Lt values
Do_grid, Di_grid = np.meshgrid(Do_values, Di_values)

# Compute the objective function values for each combination of Do and Lt
obj_values = obj_func([0.05, 0.1, 274, 40, 0.58, 0.5, 322]) # Assuming initial
values for other variables
Z = np.array([obj_func([Di, Do, 272, 13.7, 12, 0.226, 273]) for Do in Do_values]
for Di in Di_values])

# Plot the contour
plt.figure(figsize=(8, 6))
contour = plt.contourf(Di_grid, Do_grid, Z, cmap='viridis', levels=20)
cbar = plt.colorbar(contour)
cbar.set_label('Objective Function Value')
plt.xlabel('Inner tube diameter (Di)')
plt.ylabel('Outer tube diameter (Do)')
plt.title('Contour Plot of Objective Function')

# Plot the optimization path
plt.plot(Di_val, Do_val, color='red', marker='o', linestyle='-', label='Optimization
Path', markersize=4)

# Show the legend

```

```
plt.legend()
#plt.savefig('Optimization_path.png',dpi = 300)
# Show the plot
plt.grid(True)
plt.show()
----
```

```
+*Out[31]:*+
----
![png](output_3_0.png)
----
```

```
+*In[32]:*+
[source, ipython3]
----
# Create a 3D plot
fig = plt.figure(figsize=(10, 8))
ax = fig.add_subplot(111, projection='3d')

# Plot the surface
surf = ax.plot_surface(Di_grid, Do_grid, Z, cmap='viridis', edgecolor='none')
cbar = fig.colorbar(surf)
cbar.set_label('Objective Function Value')
ax.set_xlabel('Inner tube diameter (Di)')
ax.set_ylabel('Outer tube diameter (Do)')
ax.set_zlabel('Objective Function Value')
ax.set_title('Surface Plot of Objective Function')
#plt.savefig('Surface_plot.png',dpi = 300)
plt.show()
----
```

```
+*Out[32]:*+
----
![png](output_4_0.png)
----
```

```
+*In[33]:*+
[source, ipython3]
----
fig = plt.figure(figsize=(8, 5))
plt.plot(itr_list,obj_list)
plt.xlabel('Iterations')
plt.ylabel('Function value')
plt.title('Function value vs iterations')
#plt.savefig('fun_value.png',dpi = 300)
# Show the plot
```

```
plt.grid(True)
plt.show()
----
```

```
+*Out[33]:*+
----
![png](output_5_0.png)
----
```

```
+*In[34]:*+
[source, ipython3]
----
fig = plt.figure(figsize=(8, 5))
plt.plot(itr_list, grad_lag)
plt.xlabel('Iterations')
plt.ylabel('Gradient norm')
plt.yscale('log')
plt.title('Norm of the gradient vs iterations')
#plt.savefig('grad_value.png', dpi = 300)
# Show the plot
plt.grid(True)
plt.show()
----
```

```
+*Out[34]:*+
----
![png](output_6_0.png)
----
```

```
+*In[35]:*+
[source, ipython3]
----
fig = plt.figure(figsize=(8, 5))
plt.plot(itr_list, gov_val)
plt.xlabel('Iterations')
plt.ylabel('Governing equation value')
plt.title('Governing equation vs iterations')
#plt.savefig('gov_value.png', dpi = 300)
# Show the plot
plt.grid(True)
plt.show()
----
```

```
+*Out[35]:*+
----
```

```
![png](output_7_0.png)
```

```
----
```

```
+#In[36]:#+
```

```
[source, ipython3]
```

```
----
```

```
X01 = [0.3256, 0.33844, 272, 25.938, 11.999, 0.419, 273]  
X03 = [0.2332, 0.24608, 272, 18.7211, 11.999, 0.3047, 273]  
X05 = [0.188, 0.2014, 272, 15.23, 11.999, 0.249, 273]  
X07 = [0.1506, 0.1634, 271.93, 13.06, 11.999, 0.215, 273]  
X09 = [0.0968, 0.1096, 271.1, 14.901, 11.999, 0.251, 273]
```

```
X_value = np.array([X01,X03,X05,X07,X09])
```

```
shell_value = []
```

```
therm_value = []
```

```
for i in range(len(X_value)):
```

```
    Di = X_value[i][0]
```

```
    Do = X_value[i][1]
```

```
    Ti = X_value[i][2]
```

```
    A = X_value[i][3]
```

```
    Lt = X_value[i][4]
```

```
    Vw = X_value[i][5]
```

```
    To = X_value[i][6]
```

```
    # constants
```

```
    Pr_l = 4.34
```

```
    Pr_w = 6.90
```

```
    Vl = 5 # ft/s
```

```
    T_wi = 323
```

```
    #T_we = 273
```

```
    #T_l = 273
```

```
    Ta = 242
```

```
    k = 0.00257
```

```
    v = 1.05*0.00001 # viscosity of fluid - same for both
```

```
    r = 1.4*0.00001 # roughness of the pipe
```

```
    # variable
```

```
    Ai = (np.pi*Di**2)/4
```

```
    Ao = (np.pi*Do**2)/4
```

```
    Re_i = (Vl * Di)/v
```

```
    Re_o = (Vw * Do)/v
```

```
    S = np.log10(Re_i/1.816*np.log10(1.1*Re_i/np.log10(1+1.1*Re_i)))
```

```
    f = -2*np.log10(2.18*S/Re_i + r/(3.71*Di))
```

```
    Nu_i = ((f/2)*(Re_i-1000)*Pr_l)/(1+12.7*(Pr_l**(2/3)-1)*(f/2)**0.5)
```

```
    Nu_o = 0.0237*Re_o**0.618*Pr_w**(1/3)
```

```
h_i = Nu_i*k/Di
h_o = Nu_o*k/Do
```

```
part_1 = 1/(h_i*Ai*(Ti - Ta))
part_2 = (1/(2*np.pi*k*Lt))*A*np.log(Do/Di)
part_3 = 1/(h_o*Ao*(T_wi - To))
```

```
therm_val = part_1 + part_2 + part_3
```

```
shell_val = 2.66175 * Lt * Do**2 * 5
```

```
shell_value.append(shell_val)
therm_value.append(therm_val)
```

```
fig = plt.figure(figsize=(8, 5))
plt.plot(shell_value,therm_value, label = 'Pareto front')
plt.xlabel('Thermal function')
plt.ylabel('Structure function')
plt.legend()
#plt.savefig('pareto_value.png',dpi = 300)
# Show the plot
plt.grid(True)
plt.show()
----
```

```
+*Out[36]:*+
----
![png](output_8_0.png)
----
```

```
+*In[ ]:*+
[source, ipython3]
----
----
```