

CFD To DSMC

Importing libraries

In [173...

```
import numpy as np

import torch
import torch.nn as nn
from torch import Tensor
import torch.optim as optim

import time
import matplotlib.pyplot as plt

import pandas as pd
from sklearn.model_selection import train_test_split
```

Read the CFD data

In [174...

```
CF=pd.read_csv("INPUT (CF).csv")
CF=np.array(CF)[:3,:] # 255 values
print(CF.shape[0])
```

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Read the DSMC data

In [175...

```
DSMC=pd.read_csv("Output (DSMC).csv")
DSMC=np.array(DSMC) # 252 values
print(DSMC.shape[0])
```

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In [176...

```
X_train, X_test, Y_train,Y_test=train_test_split(CF,DSMC,test_size=0.2,random_state=42)
```

Feature scaling

In [177...

```
#from sklearn.preprocessing import StandardScaler
#sc=StandardScaler()

#X_train=sc.fit_transform(X_train)
#print(type(Y_train))

#X_test=sc.transform(X_test)
#print(X_test)
```

Convert numpy to Torch

In [178...

```
# PyTorch takes Tensor data so convert the data to Tensor
X_train=torch.from_numpy(X_train).float()
X_test=torch.from_numpy(X_test).float()

Y_train=torch.from_numpy(Y_train).float()
Y_test=torch.from_numpy(Y_test).float()

#print(X_train.shape)
```

In [179...

```
print(type(Y_train))
```

```
<class 'torch.Tensor'>
```

Neural Network

In [197...

```
#print(X_train,Y_train)

class CFD_DSMC(nn.Module):
    def __init__(self, layers):
        super().__init__()
        self.activation=nn.Tanh()
        self.loss_function=nn.MSELoss(reduction="mean")
        self.linears=nn.ModuleList([nn.Linear(layers[i],layers[i+1])for i in range(len(layers)-1)])
        self.iteration=0

        for i in range(len(layers)-1):
            nn.init.xavier_normal_(self.linears[i].weight.data,gain=5/3)
            nn.init.zeros_(self.linears[i].bias.data)

    def forward(self,X):
        if torch.is_tensor(X)!=True:
            X=torch.from_numpy(X)
        a=X.float()
        for i in range(len(layers)-2):
            z=self.linears[i](a)
            a=self.activation(z)
        a=self.linears[-1](a)
        return a
    def loss(self,X,Y):
        a=self.forward(X)
        loss_val=loss_function(a,Y)
        return loss_val

    def closure(self):
        optimizer.zero_grad()

        Total_loss=self.loss(X_train,Y_train)
        Total_loss.backward()

        self.iteration+=1
        if self.iteration%100==0:
            print(Total_loss)
        return Total_loss
    def test(self,Test_data):
        XY=self.forward(Test_data)
        return XY
```

Main Function

In [198...

```
layers=np.array([2,20,20,2])
yo=CFD_DSMC(layers)
params=list(yo.parameters())
optimizer=torch.optim.LBFGS(yo.parameters(),lr=0.1,max_iter=50000,tolerance_grad=1e-15,max_eval=None,tolerance_change=1e-9,history_size=1000,line_search_fn="strong_wolfe")
```

```
start_time=time.time()
optimizer.step(yo.closure)
Total_time=time.time()-start_time
print(Total_time)
```

```
tensor(0.0045, grad_fn=<MseLossBackward0>)
tensor(0.0043, grad_fn=<MseLossBackward0>)
tensor(0.0042, grad_fn=<MseLossBackward0>)
tensor(0.0040, grad_fn=<MseLossBackward0>)
tensor(0.0039, grad_fn=<MseLossBackward0>)
tensor(0.0038, grad_fn=<MseLossBackward0>)
tensor(0.0037, grad_fn=<MseLossBackward0>)
tensor(0.0036, grad_fn=<MseLossBackward0>)
tensor(0.0036, grad_fn=<MseLossBackward0>)
tensor(0.0035, grad_fn=<MseLossBackward0>)
tensor(0.0034, grad_fn=<MseLossBackward0>)
tensor(0.0034, grad_fn=<MseLossBackward0>)
tensor(0.0034, grad_fn=<MseLossBackward0>)
10.771618843078613
```

Predicting Test Results

In [223...

```
pred_val=yo.test(X_test)
```

```
#X_test.shape
Y_test=(Y_test).detach().numpy()
```

In [224...

```
print(pred_val.shape)
pred_val=(pred_val).detach().numpy()
X_pred_val=pred_val[:,[0]]
print(type(X_pred_val))
Y_pred_val=pred_val[:,[1]]
print(type(Y_pred_val))
```

```
torch.Size([51, 2])
<class 'numpy.ndarray'>
<class 'numpy.ndarray'>
```

Plot

In [229...

```
plt.scatter(X_pred_val,Y_pred_val,color="b",label="predicted DSMC Values")
plt.scatter(X_test[:,[0]],X_test[:,[1]],color="y",label="Test CFD DATA")
plt.scatter(Y_test[:,[0]],Y_test[:,[1]],color="r",label="True DSMC Values")

plt.legend(fontsize="14")
plt.show()
```

