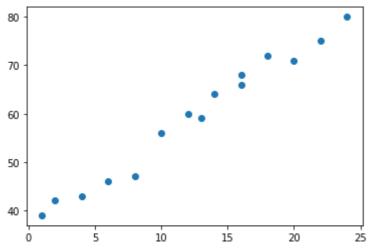
## Regression from Scratch in Numpy vs. PyTorch

## Regression in Numpy

```
import numpy as np
import matplotlib.pyplot as plt

X = np.array([1,2,4,6,8,10,12,13,14,16,16,18,20,22,24])
Y = np.array([39,42,43,46,47,56,60,59,64,66,68,72,71,75,80])
plt.scatter(X,Y)
```

cmatplotlib.collections.PathCollection at 0x7fc3f3b97c18>



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'''Y = a\*X+b is the equation of line/linear regression model.

Goal here is to find the values of a and b.

There are multiple techniques to achieve this:

- 1.Matrix calculations: Put all data into matrices to perform optimization.Used for small d
- 2.Gradient Descent : Try to minimize error/difference between actual and predicted values
- 3. Regularization: While minimizing error, also try to reduce impact of unnecessary features
- 4. Simple linear regression: If there are single input variable and single output variable, u

More detailed explaination of above techniques is not in the scope here.

We'll implement method 2 i.e Gradient Descent here-more specific-Batch Gradient Descent.

Weights(a,b) are updated at end of complete batch/all rows as follow:

```
new a = old a - (learning_rate*gradient_a)
```

new b = old b - (learning\_rate\*gradient\_b)

. . .

 $\Gamma$  "Y = a\*X+b is the equation of line/linear regression model.\nGoal here is to find the

```
np.random.seed(2)
epochs=15
learning_rate = 0.001
w = np.random.randn()
b = np.random.randn()
y_pred = np.empty(len(Y))
for i in range(epochs):
    print("------epoch:{}-----...format(i))
   #prediction
   y_pred = w*X + b
   #Error/loss calculation is Mean Squared Error
   error = np.mean((Y - y_pred)**2)
   print('Total Error:{}'.format(error))
   #Gradient calculation
   gradient_a = np.mean(-2*X*(Y-y_pred))
   gradient_b = np.mean(-2*(Y-y_pred))
   #Update weights
   w -= learning_rate*gradient_a
   b -= learning_rate*gradient_b
```

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```
print(w,b)
← 4.042799282999869 0.4771951521774575
                CPUC...2
'''Error is reducing with increment in epochs. Number of epochs and learning rate are hype
Let's not play around with it and jumpt to PyTorch'''
[→ "Error is reducing with increment in epochs. Number of epochs and learning rate are h
     -----epocii./-----
Regression in PyTorch
     IOCAT FILOR . 31/. 031003361
import torch
     -----epoch:10-----
#initialise data/features and target
X tensor = torch.from numpy(X)
Y_tensor = torch.from_numpy(Y)
     lotal Error:315.4/66/816/40153
#Initialise weights
'''Here unlike numpy we have to mention that these variables are trainable(need to calcula
This can be done using requires_grad:'''
     'Here unlike numpy we have to mention that these variables are trainable(need to calc
\Gamma
torch.random.seed = 2
                                   ad=True,dtype=torch.float)
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                               ad=True,dtype=torch.float)
learning_rate = 0.001
w_tensor
 tensor([-0.6845], requires_grad=True)
#Model without PyTorch in-built methods
for i in range(epochs):
    print("------epoch:{}------".format(i))
    #prediction
    y_pred = w_tensor*X_tensor +b_tensor
    #Error/loss calculation is Mean Squared Error
    error = ((Y_tensor - y_pred)**2).mean()
    print('Total Error:{}'.format(error))
    '''Now no need to calculate gradients, PyTorch will do it if we tell which function/var
    error.backward()
    '''Actual values of gradients can be seen using grad attribute'''
```

```
#print(w_tensor.grad,b_tensor.grad)
    '''We can not directly use gradients in normal calculation,so use no_grad() method to
   with torch.no_grad():
      w_tensor-= learning_rate*w_tensor.grad
      b_tensor-= learning_rate*b_tensor.grad
    #After each step, Reinitilaise gradients because PyTorch holds on to gradients
   w_tensor.grad.zero_()
   b_tensor.grad.zero_()
    -----epoch:0-----
    Total Error: 4754.9716796875
     -----epoch:1-----
    Total Error:1877.7296142578125
    -----epoch:2-----
    Total Error:858.9075317382812
     -----epoch:3-----
    Total Error:498.0286560058594
    -----epoch:4-----
    Total Error:370.0838623046875
    -----epoch:5-----
    Total Error: 324.6056823730469
    -----epoch:6-----
    Total Error:308.32354736328125
    -----epoch:7-----
    Total Error:302.3780822753906
    -----epoch:8-----
    Total Error:300.0922546386719
                .........
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    Total Error: 298.5710754394531
    -----epoch:11-----
    Total Error: 298.20263671875
    -----epoch:12-----
    Total Error: 297.8919372558594
    -----epoch:13-----
    Total Error:297.6018371582031
    -----epoch:14-----
    Total Error: 297.3192443847656
#Model with PyTorch in-built methods
optimizer = torch.optim.SGD([w_tensor, b_tensor], lr=learning_rate)
loss = torch.nn.MSELoss(reduction='mean')
for i in range(epochs):
   print("-----epoch:{}-----".format(i))
   #prediction
   y_pred = w_tensor*X_tensor +b_tensor
   #Error/loss calculation is Mean Squared Error
   error = loss(Y_tensor, y_pred)
   print('Total Error:{}'.format(error))
```

'''Now no need to calculate gradients,PyTorch will do it if we tell which function/var

```
error.backward()
   #Update weights using Optimizer
   optimizer.step()
   #After each step, Reinitilaise gradients because PyTorch holds on to gradients
   #Reinitilaise gradients using Optimizer
   optimizer.zero_grad()
   -----epoch:0-----
    Total Error: 297.0393981933594
    -----epoch:1-----
    Total Error: 296.7607727050781
    -----epoch:2-----
    Total Error: 296.48272705078125
     -----epoch:3-----
    Total Error: 296.2050476074219
    -----epoch:4-----
    Total Error: 295.927734375
     -----epoch:5-----
    Total Error: 295.6506652832031
    -----epoch:6-----
    Total Error: 295.3738098144531
     -----epoch:7-----
    Total Error: 295.0972595214844
    -----epoch:8-----
    Total Error:294.8209533691406
    -----epoch:9-----
    Total Error: 294.5448913574219
    -----epoch:10-----
    Total Error: 294.2691345214844
    -----epoch:11-----
    Total Error: 293.99365234375
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               CPUCII.IJ
    Total Error:293.4433898925781
     -----epoch:14-----
    Total Error: 293.16864013671875
'''Till now,we've explored loss calculation and Optimizers.
The only manual step remaining is prediction step. Let's remove that also'''
   "Till now, we've explored loss calculation and Optimizers.\nThe only manual step remai
#Create Network by extending parent nn.Module.
'''We have to implement __init__ and forward methods '''
class Network(torch.nn.Module):
 def __init__(self):
   super().__init__()
   #Intialise parameters which should be trained. Note that parameters need to be wrapped
   self.w_tensor = torch.nn.Parameter(torch.randn(1,requires_grad=True,dtype=torch.float)
   self.b_tensor = torch.nn.Parameter(torch.randn(1,requires_grad=True,dtype=torch.float)
```

```
def forward(self,x):
   #Output prediction calculation
    return w_tensor*x +b_tensor
#Model with PyTorch in-built methods
model = Network()
optimizer = torch.optim.SGD(model.parameters(), lr=learning_rate)
loss = torch.nn.MSELoss(reduction='mean')
for i in range(epochs):
    print("-----epoch:{}-----".format(i))
   #This will not do actual training but will set model in training mode.
   model.train()
   #prediction
   y_pred = model(X_tensor)
   #Error/loss calculation is Mean Squared Error
   error = loss(Y_tensor, y_pred)
   print('Total Error:{}'.format(error))
    '''Now no need to calculate gradients, PyTorch will do it if we tell which function/var
   error.backward()
   #Update weights using Optimizer
   optimizer.step()
   #After each step, Reinitilaise gradients because PyTorch holds on to gradients
   #Reinitilaise gradients using Optimizer
   optimizer.zero_grad()
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```

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```
-----epoch:0-----
Total Error: 288.8082275390625
-----epoch:1-----
Total Error: 288.8082275390625
-----epoch:2-----
Total Error: 288.8082275390625
-----epoch:3-----
Total Error: 288.8082275390625
-----epoch:4-----
Total Error: 288.8082275390625
-----epoch:5-----
Total Error: 288.8082275390625
-----epoch:6-----
Total Error: 288.8082275390625
-----epoch:7-----
Total Error: 288.8082275390625
-----epoch:8-----
Total Error: 288.8082275390625
-----epoch:9-----
Total Error: 288.8082275390625
-----epoch:10-----
Total Error:288.8082275390625
-----epoch:11-----
Total Error: 288.8082275390625
-----epoch:12-----
Total Error: 288.8082275390625
-----epoch:13-----
Total Error: 288.8082275390625
-----epoch:14-----
Total Error: 288.8082275390625
```

'''To summarize, following are steps for model creation PyTorch:

1.Create Model class in which init\_\_() method contains trainable parameter and forward m Saved successfully!

```
model.train()--- Set model in training mode
pred = model(X)-- Prediction
loss = LossFunction(pred,actual)-- Loss calculation
loss.backward()-- Gradient calculation
optimizer.step()-- Update weights/parameters
optimizer.zero_grad()-- Reset gradients'''
```

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