

1. Deep Learning General

1.1. Finding good learning rate

```
In [631]: lre = torch.linspace(-3, 0, 1000)
          lrs = 10**lre
```

```
In [632]: lri = []
          lossi = []

          for i in range(1000):

              # minibatch construct
              ix = torch.randint(0, X.shape[0], (32,))

              # forward pass
              emb = C[X[ix]] # (32, 3, 2)
              h = torch.tanh(emb.view(-1, 6) @ W1 + b1) # (32, 100)
              logits = h @ W2 + b2 # (32, 27)
              loss = F.cross_entropy(logits, Y[ix])
              print(loss.item())

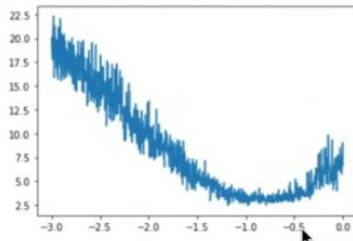
              # backward pass
              for p in parameters:
                  p.grad = None
              loss.backward()

              # update
              lr = lrs[i]
              for p in parameters:
                  p.data += -lr * p.grad

              # track stats
              lri.append(lre[i])
              lossi.append(loss.item())
```

```
In [639]: plt.plot(lri, lossi)
```

```
Out[639]: [matplotlib.lines.Line2D at 0x7fedb13cf610]
```



- Set up learning rate from $1e-6$ to $1e-0$ with arbitrary space, train a batch (ideally with same parameters before training), record loss, and plot it, find optimal learning rate

1.2. Group two inputs words

- Context: embedding dimension = 10, input size = 8 words, batch size = 4, first layer hidden dimension = 200
- Original without grouping

```
In [246]: (torch.randn(4, 80) @ torch.randn(80, 200) + torch.randn(200)).shape
```

```
Out[246]: torch.Size([4, 200])
```

- Desired outcome

```
In [247]: (torch.randn(4, 4, 20) @ torch.randn(20, 200) + torch.randn(200)).shape
Out[247]: torch.Size([4, 200])
```

- In addition, we want to group adjacent words together

```
In [274]: e = torch.randn(4, 8, 10) # goal: want this to be (4, 4, 20) where consecutive 10-d vectors get concatenated
explicit = torch.cat([e[:, ::2, :], e[:, 1::2, :]], dim=2).shape
Out[274]: torch.Size([4, 4, 20])
```

- Alternative, with view

```
In [275]: e = torch.randn(4, 8, 10) # goal: want this to be (4, 4, 20) where consecutive 10-d vectors get concatenated
explicit = torch.cat([e[:, ::2, :], e[:, 1::2, :]], dim=2)
explicit.shape
Out[275]: torch.Size([4, 4, 20])

In [277]: (e.view(4, 4, 20) == explicit).all()
Out[277]: tensor(True)
```

1.3. Use dictionary to encode decode tokens (character level)

```
[ ] # create a mapping from characters to integers
stoi = { ch:i for i,ch in enumerate(chars) }
itos = { i:ch for i,ch in enumerate(chars) }
encode = lambda s: [stoi[c] for c in s] # encoder: take a string, output a list of integers
decode = lambda l: ''.join([itos[i] for i in l]) # decoder: take a list of integers, output a string

print(encode("hii there"))
print(decode(encode("hii there")))

[46, 47, 47, 1, 58, 46, 43, 56, 43]
hii there
```

2. PyTorch

2.1. Device and check device

```
device = "cuda" if torch.cuda.is_available( ) else "cpu"
next(model.parameters()).device
```

2.2. Common Practice for Train and Test Loop

torch.inference_mode(): set up inference mode for testing/validating

torch.round(model_output) – get predicted labels for binary classification

model_output.argmax(dim = 1) – get predicted labels for multiclass classification

optimizer.zero_grad() – clear the cache of optimizer (i.e. clear previous calculated gradients)

loss.backward() - backpropagation

optimizer.step() – update model parameters

torch.eq(tensor1, tensor2).sum().item()

2.3. Data Types

a.long() – convert torch tensor a from float (usually) to int64

a.float() – convert torch tensor a from int (usually) to float32

2.4. Save & Load models

Save:

```
torch.save(model.state_dict(), PATH)
```

Load:

```
model = TheModelClass(*args, **kwargs)
model.load_state_dict(torch.load(PATH))
model.eval()
```

2.5. Extract Torch tensor element

a[0].detach().cpu().numpy().item()

2.6. Torch common functions

`torch.cat((a,b), dim = 0)` – concatenate two tensors along the 0th dimension

`torch.tril(torch.ones(5,5))` – triangle lower

```
tensor([[1., 0., 0., 0., 0.],
        [1., 1., 0., 0., 0.],
        [1., 1., 1., 0., 0.],
        [1., 1., 1., 1., 0.],
        [1., 1., 1., 1., 1.]])
```

`torch.triu(torch.ones(5,5))` – triangle upper

```
In [52]: out = torch.zeros(5, 5).masked_fill(torch.tril(torch.ones(5, 5)) == 0, float('-inf'))
out
```

```
Out[52]: tensor([[0., -inf, -inf, -inf, -inf],
                 [0., 0., -inf, -inf, -inf],
                 [0., 0., 0., -inf, -inf],
                 [0., 0., 0., 0., -inf],
                 [0., 0., 0., 0., 0.]])
```

```
In [57]: torch.exp(out)
```

```
Out[57]: tensor([[1., 0., 0., 0., 0.],
                 [1., 1., 0., 0., 0.],
                 [1., 1., 1., 0., 0.],
                 [1., 1., 1., 1., 0.],
                 [1., 1., 1., 1., 1.]])
```

```
In [66]: input = torch.zeros(2, 3, 4)
out = input.transpose(0, 2)
out.shape
```

```
Out[66]: torch.Size([4, 3, 2])
```

```
In [70]: tensor1 = torch.tensor([1, 2, 3])
tensor2 = torch.tensor([4, 5, 6])
tensor3 = torch.tensor([7, 8, 9])

# Stack the tensors along a new dimension
stacked_tensor = torch.stack([tensor1, tensor2, tensor3])
stacked_tensor
```

```
Out[70]: tensor([[1, 2, 3],
                 [4, 5, 6],
                 [7, 8, 9]])
```

- View

```
In [6]: a = torch.rand(2, 3, 5)
print(a.shape)
x, y, z = a.shape
a = a.view(x,y,z)
# print(x, y, z)
print(a.shape)

torch.Size([2, 3, 5])
torch.Size([2, 3, 5])
```

- `torch.rand_like()` - Sample from N(0,1)
- `a.mul(b)` – element wise multiplication

2.7. Optimizer

- Print out optimizer's name

```
optimizer.__class__.__name__}
```

2.8. No_grad decorator

```
@torch.no_grad() # this decorator disables gradient tracking
def split_loss(split):
    x, y = {
```

- o With the decorator, the subsequent function will not record the gradients

2.9. Transpose on more than 2 dimensional tensor

```
k = key(x) # (B, T, 16)
q = query(x) # (B, T, 16)
wei = q @ k.transpose(-2, -1) # (B, T, 16) @ (B, 16, T) |
```

2.10. Use Sampler to customize DataLoader

- Ask Dataloader for only load a certain number of samples (number of batch will be number of samples / batch_size)

Initialize a random sampler providing `num_samples` and setting `replacement` to `True` i.e. the sampler is forced to draw instances multiple times if `len(ds) < num_samples`:

```
>>> sampler = RandomSampler(ds, replacement=True, num_samples=10)
```

```
val_sampler = torch.utils.data.RandomSampler(val_dataset, replacement=False, num_samples=100)
val_dataloader = DataLoader(dataset=val_dataset, batch_size=10, sampler=val_sampler)
21] ✓ 0.0s
```


2.11. Register buffer (non-trainable parameters)

`self.register_buffer("var name", var)`

```
# positional encoding from the paper
class PositionalEncoding(torch.nn.Module):
    def __init__(self, emb_dim, block_size, dropout_rate):
        # initialize PE matrix
        pe = torch.zeros((block_size, emb_dim))
        # assign values
        pe[:,0::2] = torch.sin(product_term)
        pe[:,1::2] = torch.cos(product_term)
        # create batch dimension
        pe = pe.unsqueeze(0)

        # make the parameters untrainable
        self.register_buffer("pos_enc", pe)
```

2.12. Print number of Parameters

```
print(round(sum(p.numel() for p in transformer.parameters())/1e6,2), 'M parameters')
[25] ✓ 0.0s
... 18.98 M parameters
```

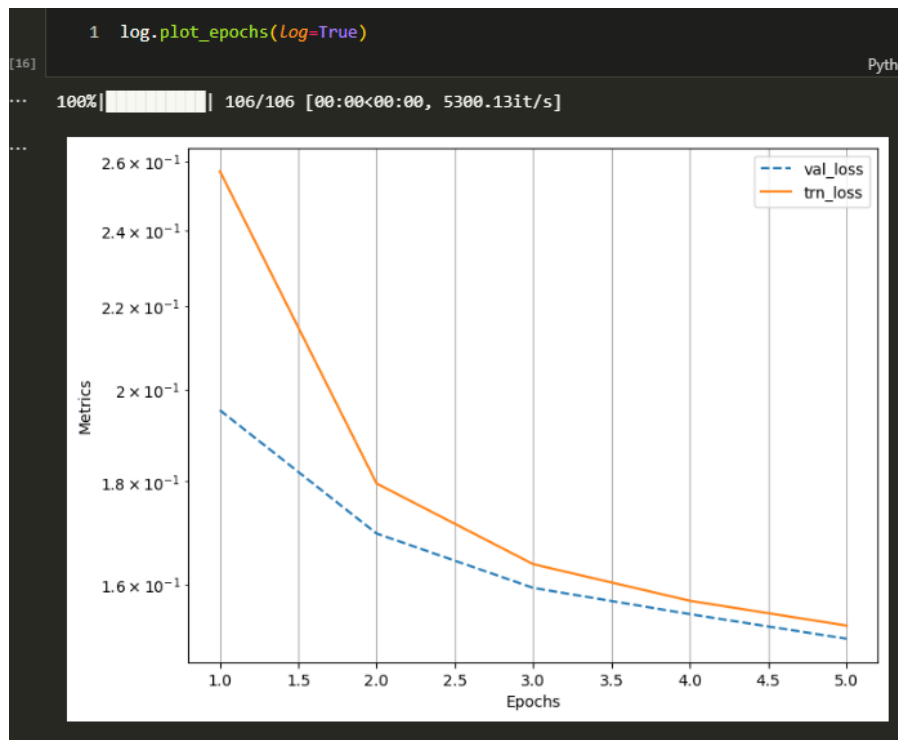
2.13. Torch snippets for reporting

```
2 from torch_snippets import *
```

```
[14]
1 num_epochs = 5
2 log = Report(num_epochs)
```

```
[15]
1 N_trn = len(trn_dl)
2 N_val = len(val_dl)
3 for epoch in range(num_epochs):
4     for idx, (data, _) in enumerate(trn_dl):
5         loss = train_batch(data, myAE, loss_fn, optimizer)
6         log.record(pos=(epoch+(idx+1)/N_trn), trn_loss=loss, end="\r")
7     for idx, (data, _) in enumerate(val_dl):
8         loss = validate_batch(data, myAE, loss_fn)
9         log.record(pos=(epoch+(idx+1)/N_val), val_loss = loss, end='\r')
10    log.report_avgs(epoch+1)
```

```
... EPOCH: 1.000 val_loss: 0.195 trn_loss: 0.257 (13.75s - 55.02s remaining)
EPOCH: 2.000 val_loss: 0.170 trn_loss: 0.180 (25.58s - 38.37s remaining)
EPOCH: 3.000 val_loss: 0.159 trn_loss: 0.164 (37.41s - 24.94s remaining)
EPOCH: 4.000 val_loss: 0.155 trn_loss: 0.157 (49.23s - 12.31s remaining)
EPOCH: 5.000 val_loss: 0.150 trn_loss: 0.153 (61.06s - 0.00s remaining)
```



2.14. Use torchsummary for model summary

```
5 from torchsummary import summary
```

[4] Python

```
1 model = ConvAutoEncoder().to(device)
2 summary(model, torch.zeros(2,1,28,28))
```

```

=====
Layer (type:depth-idx)                   Output Shape          Param #
=====
-Sequential: 1-1                        [-1, 64, 3, 3]        --
|   -Conv2d: 2-1                        [-1, 32, 14, 14]       320
|   -ReLU: 2-2                         [-1, 32, 14, 14]       --
|   -MaxPool2d: 2-3                    [-1, 32, 7, 7]        --
|   -Conv2d: 2-4                        [-1, 64, 4, 4]        18,496
|   -ReLU: 2-5                         [-1, 64, 4, 4]        --
|   -MaxPool2d: 2-6                    [-1, 64, 3, 3]        --
-Sequential: 1-2                        [-1, 1, 28, 28]       --
|   -ConvTranspose2d: 2-7              [-1, 32, 7, 7]        18,464
|   -ReLU: 2-8                        [-1, 32, 7, 7]        --
|   -ConvTranspose2d: 2-9              [-1, 16, 15, 15]      12,816
|   -ReLU: 2-10                       [-1, 16, 15, 15]      --
|   -ConvTranspose2d: 2-11            [-1, 1, 28, 28]        65
|   -Tanh: 2-12                       [-1, 1, 28, 28]        --
=====
Total params: 50,161
Trainable params: 50,161
Non-trainable params: 0
Total mult-adds (M): 4.23
=====
Input size (MB): 0.01
Forward/backward pass size (MB): 0.10
Params size (MB): 0.19
Estimated Total Size (MB): 0.30
=====

```


2.15. *nn.ModuleList* vs. *nn.Sequential*

- `nn.Sequential` automatically feed output of previous layer to subsequent layer
- `nn.ModuleList` doesn't, we can define complex structure with this method

```
python Copy code  
  
model = nn.Sequential(  
    nn.Linear(10, 20),  
    nn.ReLU(),  
    nn.Linear(20, 1)  
)
```

```
python Copy code  
  
class MyModel(nn.Module):  
    def __init__(self):  
        super(MyModel, self).__init__()  
        self.layers = nn.ModuleList([  
            nn.Linear(10, 20),  
            nn.ReLU(),  
            nn.Linear(20, 1)  
        ])  
  
    def forward(self, x):  
        for layer in self.layers:  
            x = layer(x)  
        return x
```

3. Tokenization

3.1. *Byte Encoding*

- `Encode()`

```

sample = text[:100]
sample
[4] ✓ 0.0s
... 'The Music of the Ainur There was Eru, the One, who in Arda is called Iluvatar; and he made first the'

tokens = sample.encode("utf-8")
tokens
[39] ✓ 0.0s
... b'The Music of the Ainur There was Eru, the One, who in Arda is called Iluvatar; and he made first the'

```

- Convert byte-encoded text to numbers

```

tokens = sample.encode("utf-8")
print(int(tokens[0]))
[40] ✓ 0.0s
... 84

print(list(map(int,tokens))[:10])
[41] ✓ 0.0s
... [84, 104, 101, 32, 77, 117, 115, 105, 99, 32]

```

- Alternatively

```

tokens = list(sample.encode("utf-8"))
# tokens = list(map(int,tokens))
tokens[:3]
[3] ✓ 0.0s
... [84, 104, 101]

```

4. Work with files

file_object = *open(file_name,mode)*

- mode:
 - "r" – read model – reading a file (default mode if not specified)
 - "w" – write mode – used for writing data to a file, create a new file if it doesn't exist, and overwrites the content if the file already exists
 - "a" – append mode – used for appending data to an existing file, create a new file if it doesn't exist
 - "x" – create mode – used for creating a new file, raises an error if the file exists
 - "b" – binary mode – used for reading and writing binary files, must be combined with other modes (e.g., "rb", "wb", ...)

file_object.close() – close the file after performing all the operations

4.1. *read binary vs. read*



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You should use `"r"` for opening text files. Different operating systems have slightly different ways of storing text, and this will perform the correct translations so that you don't need to know about the idiosyncracies of the local operating system. For example, you will know that newlines will always appear as a simple `"\n"`, regardless of where the code runs.

You should use `"rb"` if you're opening non-text files, because in this case, the translations are not appropriate.

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answered Feb 1, 2010 at 5:49



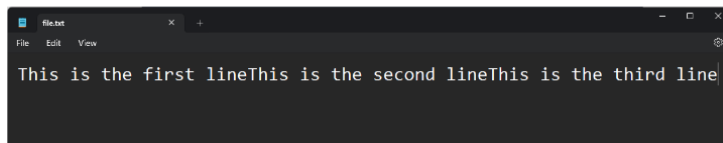
caf

236k 40 326 466

4.2. *The write() method*

```
f = open('file.txt', 'w')
f.write('This is the first line')
f.write('This is the second line')
f.write('This is the third line')

f.close()
```



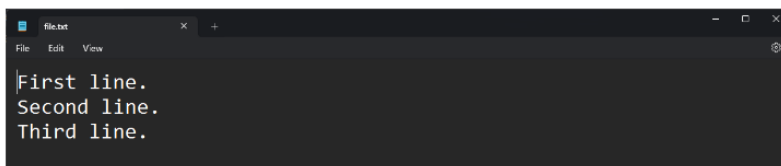
4.3. *The writelines() method*

2. Write the data using the **writelines()** method:

```
lines = ['First line.\n', 'Second line.\n', 'Third line.\n']
f.writelines(lines)
```

3. Close the file using the **close()** method:

```
f.close()
```



4.4. *Printing to a file*

1. Open the file using the **open()** function:
`f = open('file.txt', 'w')`
2. Use the **print()** function with the **file** parameter set to the file object:
`print('This is a sample text.', file=f)`
3. Close the file using the **close()** method:
`f.close()`

4.5. *“with” statement*

- The “with” keyword automatically makes sure the file is properly closed once the block of code is executed

```
with open('example.txt', 'r') as file:  
    content = file.read()
```

Link:

<https://blog.enterprisedna.co/python-write-to-file/>

5. *Work with Folders*

5.1. *Common functions involve os module*

`os.path.exists()` – checks whether a given path exists

`os.makedirs()` – creates a new directory or multiple directories (including intermediate ones) at the given path

`os.path.join()` – joins various components of a path to form one absolute or relative file path (typically used to access files in subdirectories)

```
import os

# Check if directory exists, otherwise create it
dir_path = "example_dir"
if not os.path.exists(dir_path):
    os.makedirs(dir_path)

# Create file within the directory
file_path = os.path.join(dir_path, "test.txt")
with open(file_path, 'w') as file:
    file.write("This is an example.")
```

5.2. Delete folders

Use one of these methods:

- `pathlib.Path.unlink()` removes a file or symbolic link.
- `pathlib.Path.rmdir()` removes an empty directory.
- `shutil.rmtree()` deletes a directory and all its contents.

On Python 3.3 and below, you can use these methods instead of the `pathlib` ones:

- `os.remove()` removes a file.
- `os.unlink()` removes a symbolic link.
- `os.rmdir()` removes an empty directory.

6. Python Classes

6.1. Basics

- Class definition

```
>>> class Dog:
...     species = "Canis familiaris"
...     def __init__(self, name, age):
...         self.name = name
...         self.age = age
... 
```

- Print a class object without `__str__` defined

```
>>> miles = Dog("Miles", 4)
```

```
>>> print(miles)
<__main__.Dog object at 0x00aeff70>
```

- o Add `__str__` definition

```
class Dog:
    # ...

    def __str__(self):
        return f"{self.name} is {self.age} years old"
```

```
>>> miles = Dog("Miles", 4)
>>> print(miles)
'Miles is 4 years old'
```

6.2. Inheritance

- You can inherit all attributes and methods from parent class, overwrite it, or extend it
 - o Inherit – child's hair color is brown

```
# inheritance.py

class Parent:
    hair_color = "brown"

class Child(Parent):
    pass
```

- o Overwrite the hair color to be purple

```
# inheritance.py

class Parent:
    hair_color = "brown"

class Child(Parent):
    hair_color = "purple"
```

- o Extend

```
# inheritance.py

class Parent:
    speaks = ["English"]

class Child(Parent):
    def __init__(self):
        super().__init__()
        self.speaks.append("German")
```

6.3. *Example of inheritance – create Bread subclass of Dog class*

- Motivation: different breeds of dog have different barking sound, but otherwise similar, so we need to create subclasses for breed with default barking sound, so we don't have to pass it as argument every time
- The parent class

```
# dog.py

class Dog:
    species = "Canis familiaris"

    def __init__(self, name, age):
        self.name = name
        self.age = age

    def __str__(self):
        return f"{self.name} is {self.age} years old"

    def speak(self, sound):
        return f"{self.name} says {sound}"
```

- The child classes (initial)

```
# dog.py

# ...

class JackRussellTerrier(Dog):
    pass

class Dachshund(Dog):
    pass

class Bulldog(Dog):
    pass
```

- Create instances

```
>>> miles = JackRussellTerrier("Miles", 4)
>>> buddy = Dachshund("Buddy", 9)
>>> jack = Bulldog("Jack", 3)
>>> jim = Bulldog("Jim", 5)
```

- Check which subclass it belongs to, or whether it is inherited

```
>>> type(miles)
<class '__main__.JackRussellTerrier'>
```

```
>>> isinstance(miles, Dog)
True
```

- Work on the bark sound

```
# dog.py

class Dog:
    # ...

    def speak(self, sound):
        return f"{self.name} barks: {sound}"

# ...
```

- o Access the parent class from inside a method of a child class by using super()

```
# dog.py

# ...

class JackRussellTerrier(Dog):
    def speak(self, sound="Arf"):
        return super().speak(sound)

# ...
```

```
>>> miles = JackRussellTerrier("Miles", 4)
>>> miles.speak()
'Miles barks: Arf'
```

6.4. Custom exception


```
# Raise a custom exception
class CustomError(Exception):
    pass

raise CustomError("This is a custom error message")
```

7. Common Practices

.item() – get a single number out of a list/tensor as a python regular int/float

set(list) – create a set object that contains unique values in the list

sorted(list) – create a list object that contains sorted values in the list

itemgetter(index_list)(list)* – retrieve multiple items from a list with a list of index, operator module

string.find("pattern") – return the index of the substring

list(map(function, target)) – apply the function on target

mylist.index(element, start, end) – start and end are optional indices

mystring.find(pattern, start, end) – find the index where the pattern occurred

7.1. Random Class

random.choice(mylist) – choose a random sample from the list

random.sample(mylist, k = n) – choose n random samples from the list

7.2. Dictionary

- Traversing through a dictionary
 - o With keys

```
>>> likes = {"color": "blue", "fruit": "apple", "pet": "dog"}

>>> for key in likes:
...     print(key)
...
color
fruit
pet
```

- With item

```
>>> for item in likes.items():  
...     print(item)  
...  
( 'color', 'blue' )  
( 'fruit', 'apple' )  
( 'pet', 'dog' )
```

- Get multiple values with itemgetter

```
from operator import itemgetter  
  
my_dict = {x: x**2 for x in range(10)}  
  
itemgetter(1, 3, 2, 5)(my_dict)  
#>>> (1, 9, 4, 25)
```

`itemgetter` will return a tuple if more than one argument is passed. To pass a list to `itemgetter`, use

```
itemgetter(*wanted_keys)(my_dict)
```

Keep in mind that `itemgetter` does not wrap its output in a tuple when only one key is requested, and does not support zero keys being requested.

- Save dictionary to pickle file

```
import pickle  
  
with open('saved_dictionary.pkl', 'wb') as f:  
    pickle.dump(dictionary, f)  
  
with open('saved_dictionary.pkl', 'rb') as f:  
    loaded_dict = pickle.load(f)
```

- Retrieve value from key

`dict.get(keyname, value)` – value is optional, it is a value to return if the specified key does not exist

- Retrieve the value where the key is the largest with max

`top_vale = max(stats, key = stats.get)` – stats is the dictionary

- Sort dictionary based on value

`sorted_dict = sorted(dict.items(), key = lambda x: x[1], reverse = True)`

- Get the key with the largest value in the dictionary

```
top_key = max(dict, key = dict.get)
```

7.3. Use Python to Copy files

```
# import module
import shutil

# copy the contents of the demo.py file to a new file called demo1.py
shutil.copyfile('./demo.py', './demo1.py')
```

7.4. Try and Assert

- assert

```
#if condition returns False, AssertionError is raised:
assert x == "goodbye", "x should be 'hello'"
```

- try, except

```
try:
    print("Hello")
except:
    print("Something went wrong")
else:
    print("Nothing went wrong")
```

```
finally:
    print("The 'try except' is finished")
```

- the finally block will be executed regardless
- the else block will be executed if there's no error

7.5. tqdm

```
from tqdm.auto import tqdm
```

```
progress_bar = tqdm(range(num_steps))
```

`progress_bar.update(n)` – n usually is 1, it is the amount of num_steps completed

7.6. string functions

```
'a d c b'.split(' ') → ['a', 'd', 'c', 'b']
```

'|'.join(['a','b','c']) → 'a|b|c'

`string.strip()` – removing leading and trailing spaces

7.7. *zip*

- take two lists, iterate through each one and pair up the values from each list at the same index

```
a = [1,2]
b = [11,22]
c = list(zip(a,b))
c
✓ 0.0s
[(1, 11), (2, 22)]
```

7.8. *pip install to a different location*

▲ The `--target` switch is the thing you're looking for:

819 `pip install --target=d:\somewhere\other\than\the\default package_name`

▼ But you still need to add `d:\somewhere\other\than\the\default` to `PYTHONPATH` to actually use them from that location.

🔖

🕒

-t, --target <dir>
Install packages into <dir>. By default this will not replace existing files/folders in <dir>. Use --upgrade to replace existing packages in <dir> with new versions.

Upgrade pip if target switch is not available:

On Linux or OS X:

```
pip install -U pip
```

On Windows (this works around [an issue](#)):

```
python -m pip install -U pip
```

7.9. *enforcing argument data type*

- force it to be string or None type

```
from typing import Optional

def fn(text: Optional[str]):
```

- for it to be string or integer

```
from typing import Union

def fn(value: Union[str, int]):
```

7.10. saving datapoints with numpy

```
>>> with open('test.npy', 'wb') as f:
...     np.save(f, np.array([1, 2]))
...     np.save(f, np.array([1, 3]))
>>> with open('test.npy', 'rb') as f:
...     a = np.load(f)
...     b = np.load(f)
>>> print(a, b)
# [1 2] [1 3]
```

7.11. save array as text, load with np

```
1 array = np.load("training_data/train_85_split_vocabsize2k.npy")
2 len(array)
[39] ✓ 0.0s
... 895514

1 array2 = list(map(str,array))
2 array3 = array2
3 array3[:10]
[51] ✓ 0.1s
... ['32', '1446', '101', '1280', '84', '318', '760', '256', '1573', '358']
```

```
1 array4 = " ".join(array3)
2 array4[:20]
[72] ✓ 0.0s
... '32 1446 101 1280 84 '

1 with open("training_data/train_85_split_vocabsize2k.txt", "w") as f:
2     f.write(array4)
[73] ✓ 0.0s
```

```
1 b = np.loadtxt("training_data/train_85_split_vocabsize2k.txt", dtype='int')
2 b
[76] ✓ 0.1s
... array([ 32, 1446, 101, ..., 628, 387, 46])

1 (array == b).all()
[77] ✓ 0.0s
... True
```

7.12. negating through Path

```
>>> from pathlib import Path

>>> p = Path('C:\\Program Files\\Internet Explorer\\iexplore.exe')

>>> str(p.parent)
'C:\\Program Files\\Internet Explorer'

>>> p.name
'iexplore.exe'

>>> p.suffix
'.exe'

>>> p.parts
('C:\\', 'Program Files', 'Internet Explorer', 'iexplore.exe')

>>> p.relative_to('C:\\Program Files')
WindowsPath('Internet Explorer/iexplore.exe')

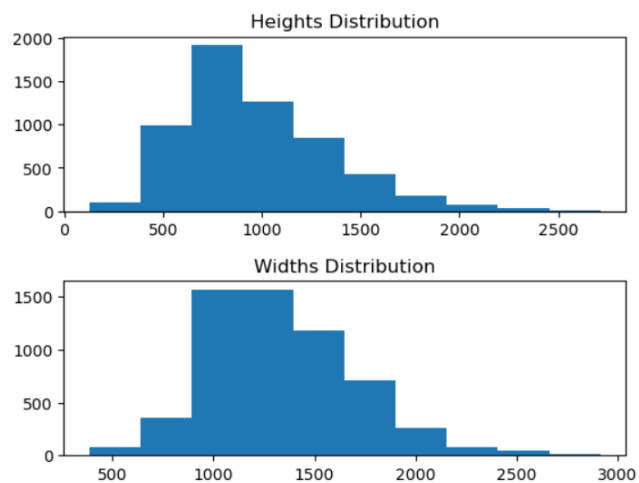
>>> p.exists()
True
```

8. Plots

8.1. Create subplot

```
In [82]: 1 # plot the distributions
2 plt.figure(figsize=(8,8))
3 fig, axs = plt.subplots(nrows=2, ncols=1)
4 axs[0].hist(heights)
5 axs[0].set_title("Heights Distribution")
6 axs[1].hist(widths)
7 axs[1].set_title("Widths Distribution")
8 plt.subplots_adjust(hspace=0.4)
9 plt.show()
```

<Figure size 800x800 with 0 Axes>



- Subplot doc:
https://matplotlib.org/stable/gallery/subplots_axes_and_figures/subplots_demo.html
- Adjust subplot spacing doc:
https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.subplots_adjust.html

8.2. Auto Encoder plot comparison

