

# Deep Learning

## PyTorch Programming

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- PyTorch & Colab

- a. Setup
  - i. Google Colab
    - ...easier to set up
  - ii. NCC / local
    - ...a bit more responsive...
    - visdom
- b. Tensors
  - i. Dynamic graph
- c. Devices



<https://github.com/cwkw/ml-materials>



<https://colab.research.google.com/gist/cwkw/d1e5bb1776fd65b00fe2921f59c88871/classifier.ipynb>

- Typical approach

- a. Data loaders
- b. Transforms
- c. Networks
  - i. Init
  - ii. Forward
- d. Setup optimisation strategy
- e. Training
  - i. Sample
  - ii. Zero grad
  - iii. Forward
  - iv. Loss
  - v. Backward
  - vi. Step
- f. Testing
- g. Plotting

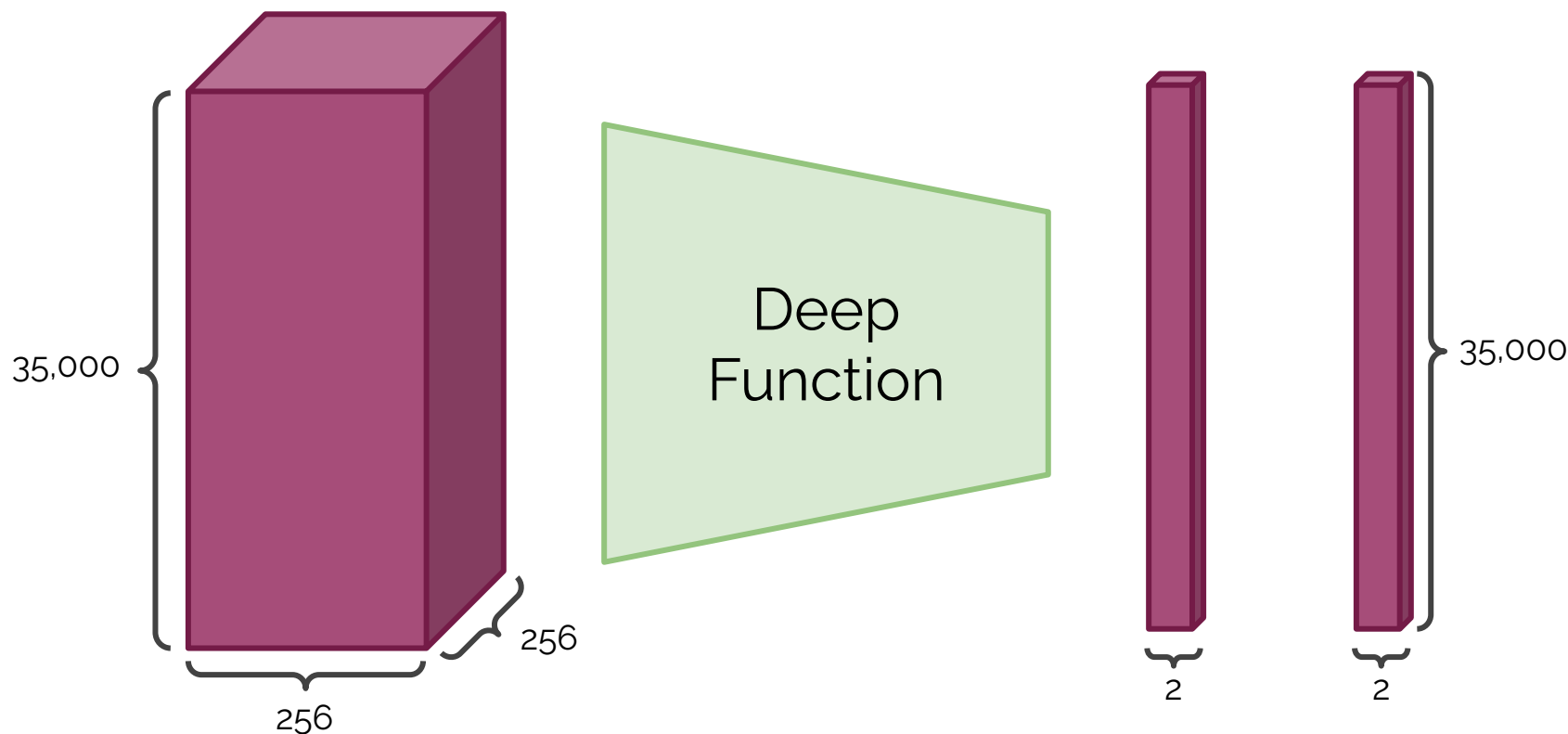
$$\theta^{(t+1)} = \theta^{(t)} - \eta \nabla_{\theta} \mathcal{L}(\theta)$$

**Note:** this lecture is a live programming demonstration. The slides are minimal. The material can be downloaded here:

<https://github.com/cwkkx/ml-materials>

# The dataset doesn't fit in memory...

$35,000 * 3 * 256 * 256 * (32 \text{ bits}) = \mathbf{27.52 \text{ gigabytes}}$  *not including the model!*



# We run out of memory...

Try and create the tensor

```
(root) ✖ chris@chris-lab > ~/repos/deep-learning master • ipython
Python 3.6.2 |Continuum Analytics, Inc.| (default, Jul 20 2017, 13:51:32)
Type 'copyright', 'credits' or 'license' for more information
IPython 6.1.0 -- An enhanced Interactive Python. Type '?' for help.

In [1]: import torch

In [2]: input = torch.zeros(35000, 3, 256, 256)
-----
RuntimeError                                Traceback (most recent call last)
<ipython-input-2-8ca165dcec32> in <module>()
----> 1 input = torch.zeros(35000, 3, 256, 256)

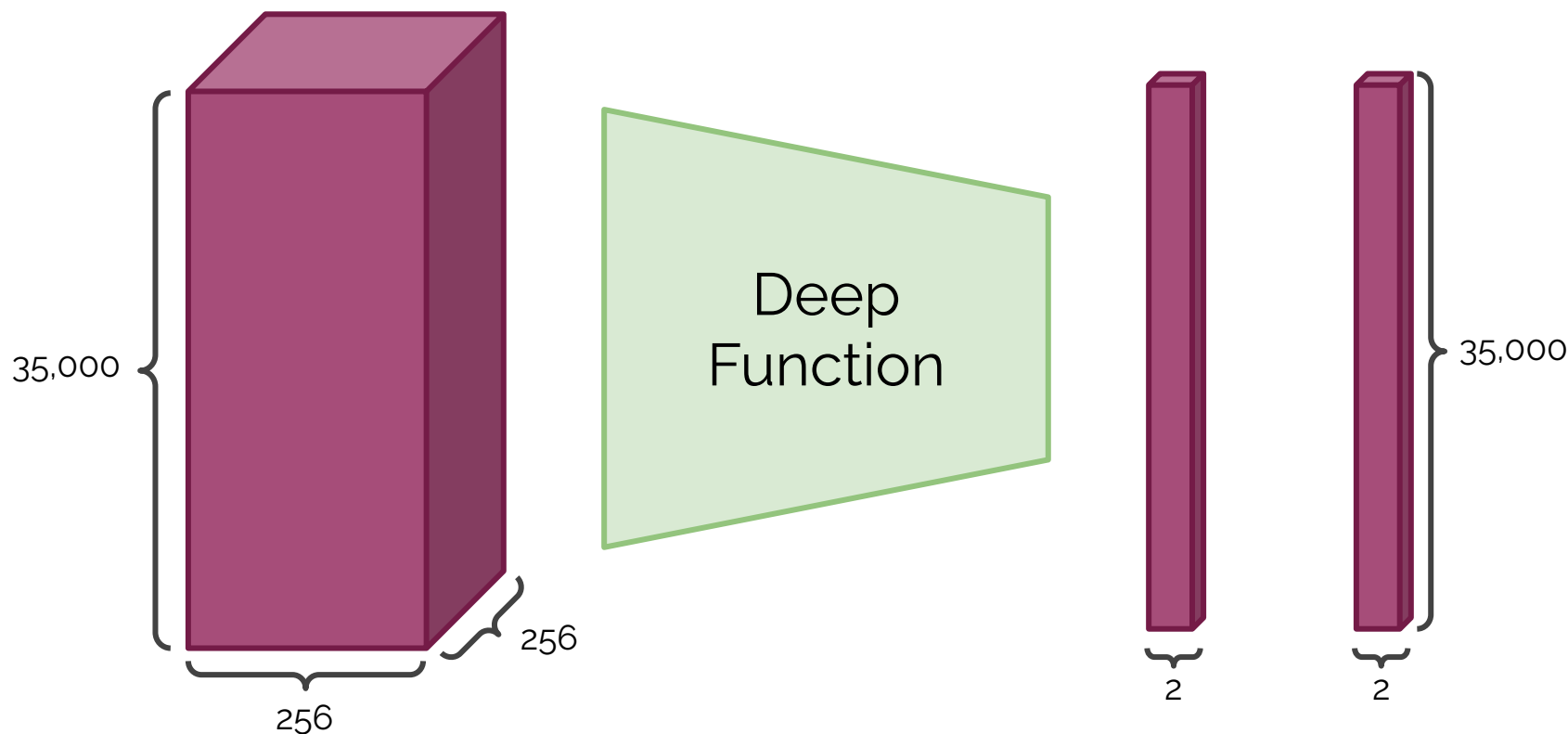
RuntimeError: $ Torch: not enough memory: you tried to allocate 25GB. Buy new RAM!
opt/conda/conda-bld/pytorch_1502009910772/work/torch/lib/TH/THGeneral.c:270

In [3]: □
```

Nope!

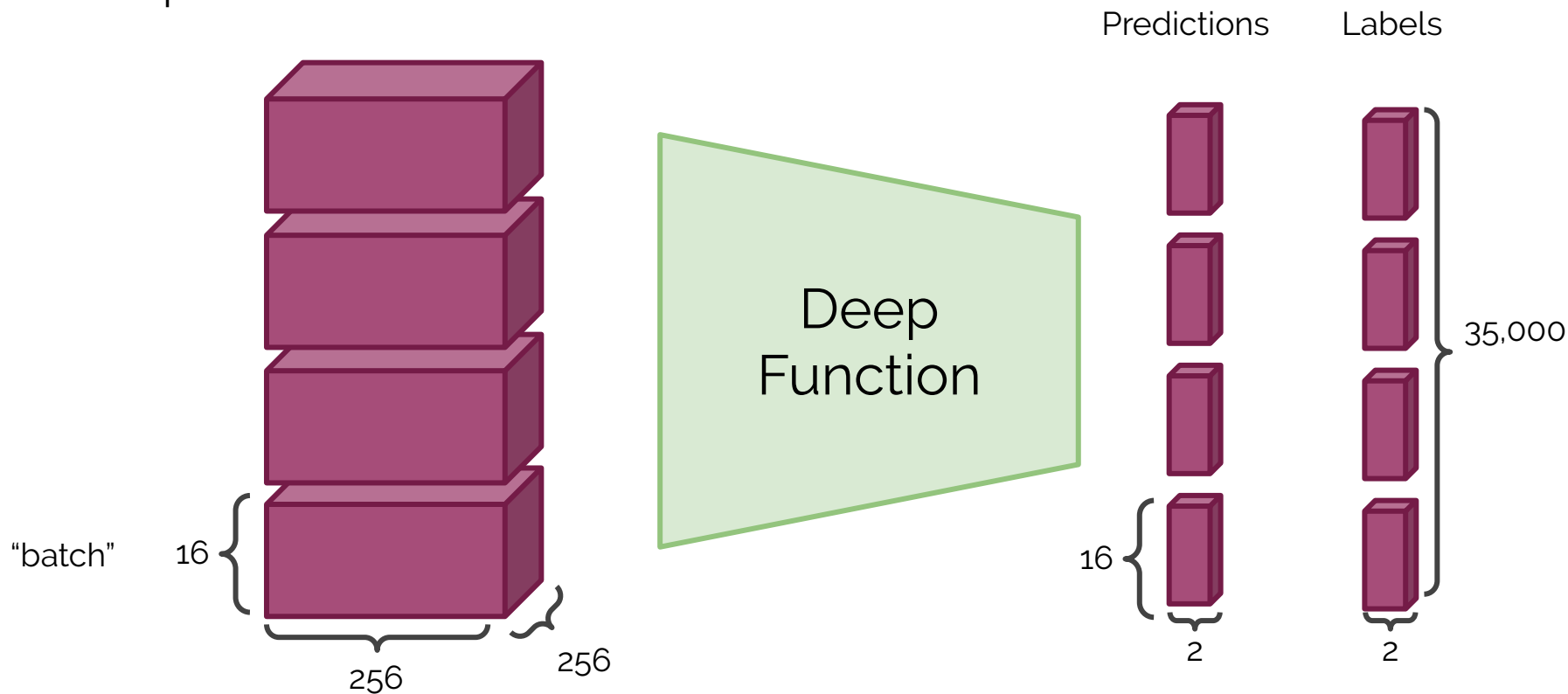
# We run out of memory...

$35,000 * 256 * 256 * 3 * (32 \text{ bits}) = \mathbf{27.52 \text{ gigabytes}}$  *not including the model!*



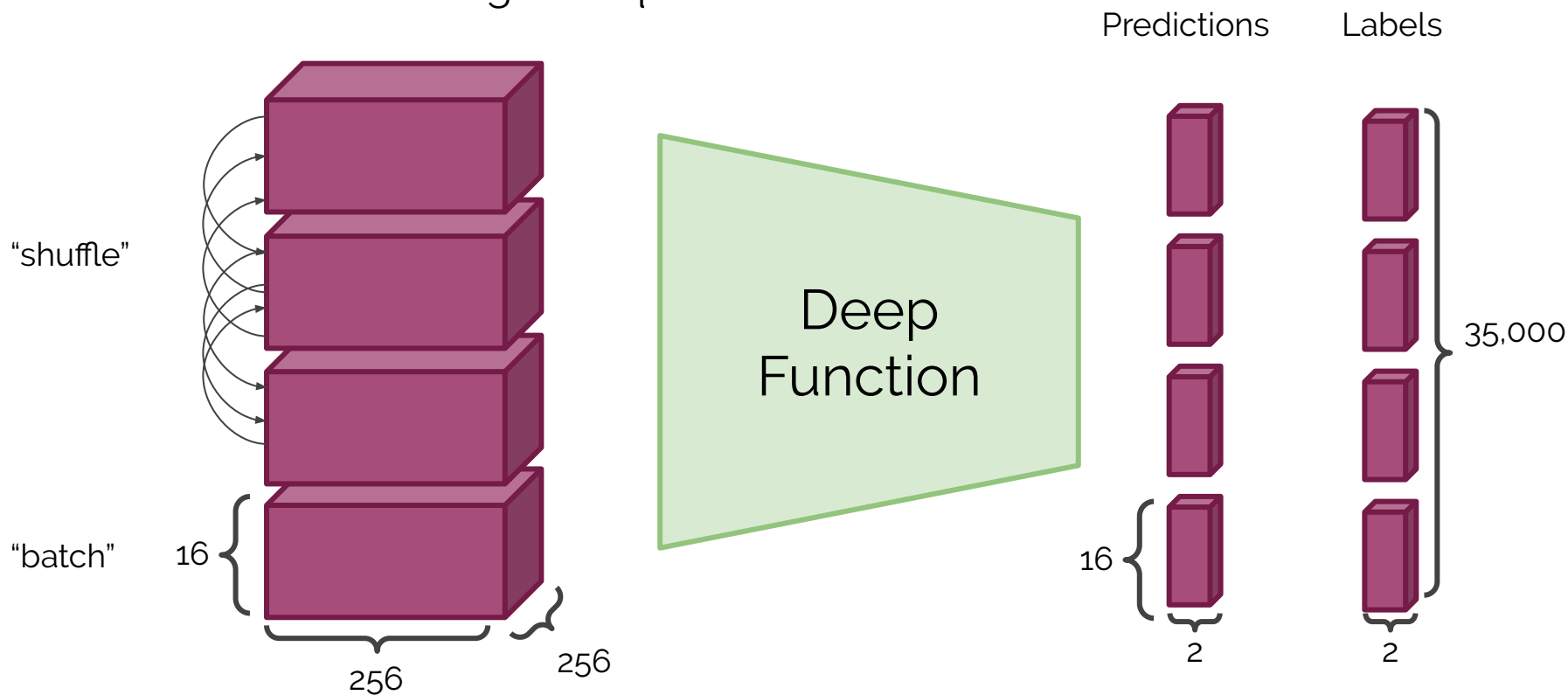
# The Data Loader

- Split dataset into mini batches each iteration



# The Data Loader

- Shuffle dataset to get unique batches





# Mini batches in memory

```
(root) chris@chris-lab > ~/repos/deep-learning / master • ipython
Python 3.6.2 |Continuum Analytics, Inc.| (default, Jul 20 2017, 13:51:32)
Type 'copyright', 'credits' or 'license' for more information
IPython 6.1.0 -- An enhanced Interactive Python. Type '?' for help.
```

```
In [1]: import torch
```

```
In [2]: images = torch.zeros(16,3,256,256)
```

```
In [3]: output = torch.zeros(16,2,1,1)
```

```
In [4]: images.size()
```

```
Out[4]: torch.Size([16, 3, 256, 256])
```

```
In [5]: output.size()
```

```
Out[5]: torch.Size([16, 2, 1, 1])
```

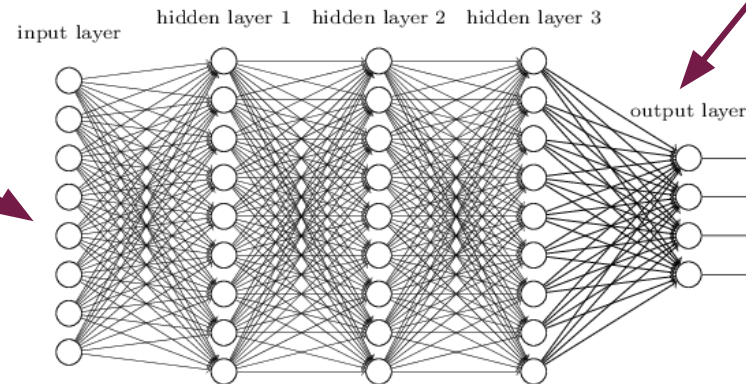
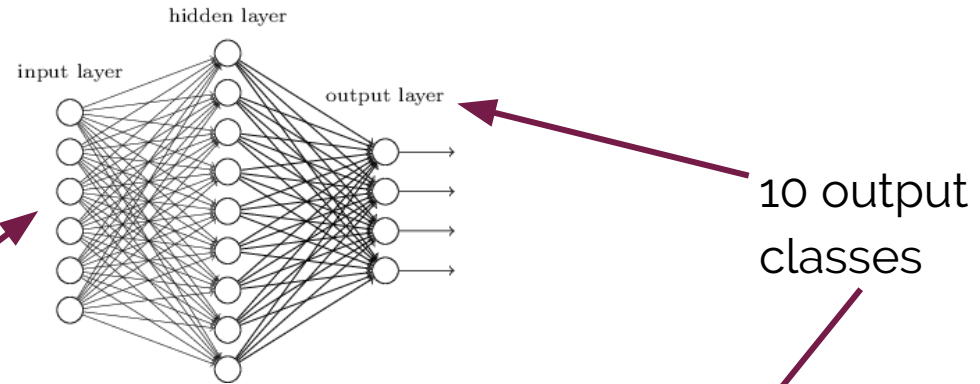
```
In [6]: []
```

**12.58 megabytes**  
much better!

# Two simple networks on Fashion MNIST



$32 * 32 =$   
1024 pixels



# Lecture Materials



<https://github.com/cwkx/ml-materials>

## Homework:



<https://pytorch.org/tutorials/>

## NCC documentation:



<http://ncc.clients.dur.ac.uk/>

- You need to request access and read the documentation.

## Colab:



<http://colab.research.google.com/>