



Deep Learning for Image Segmentation & GAN

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Are we all know the right AI /ML ?

"A lack of understanding of underlying AI/ML algorithms both makes it easy for companies to inflate claims and also makes it difficult for potential investors, partners, and customers to identify true breakthrough innovation. "

SPECTRUM OF ALGORITHMS UNDERPINNING AI (EXCERPT)



	EXPERT SYSTEMS	TRADITIONAL MACHINE LEARNING	FRONTIER MACHINE LEARNING
SUMMARY	Human-programmed, static program to perform a single, deterministic task	Algorithms mathematically proven to make an optimum or best prediction based on data they are trained with	Algorithms with the same characteristics as traditional machine learning (learn from and improve predictions through data) but with greater autonomy and less explainability
PERIOD OF MAJOR BREAKTHROUGHS	1980s-1990s	2000s	2010s-present
AUTONOMY	Low, program is entirely dependent on human-provided information	Medium, generally humans guide the model to take into account certain features and to remove "noisy" outlier data	High, generally the model decides on feature selection and weighting and has to account for outlier data independently
EXPLAINABILITY	High	Medium	Low, "black box"

To be an AI
Engineer !!!



MATHEMATICAL
EXPERTISE



COMPUTATIONAL
SKILLS



PROGRAMMING
SKILLS

What made AI and ML to grow faster

Neural Networks Concepts were developed many years back

The development in computational hardwares and frameworks give the moonlight for faster growth.

Huge storage and data sources available.

AI and ML Platforms

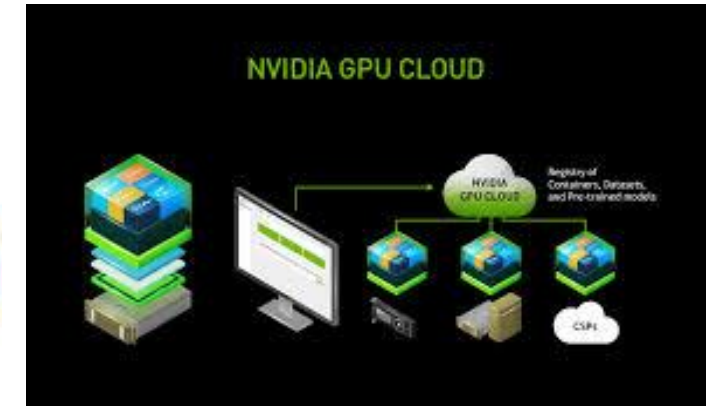


AI platforms and frameworks as a Service

- Google Cloud Platforms
- Amazon Webservices
- Nvidia Computational Hardwares & Online Platforms



Google Cloud Platform



Upgrade your Computational Systems

Most of the people started using GPU' instead of CPU's



The computations are faster



AI models can be trained in fewer days



Next trend is going with TPU's , which makes the computation faster than GPU

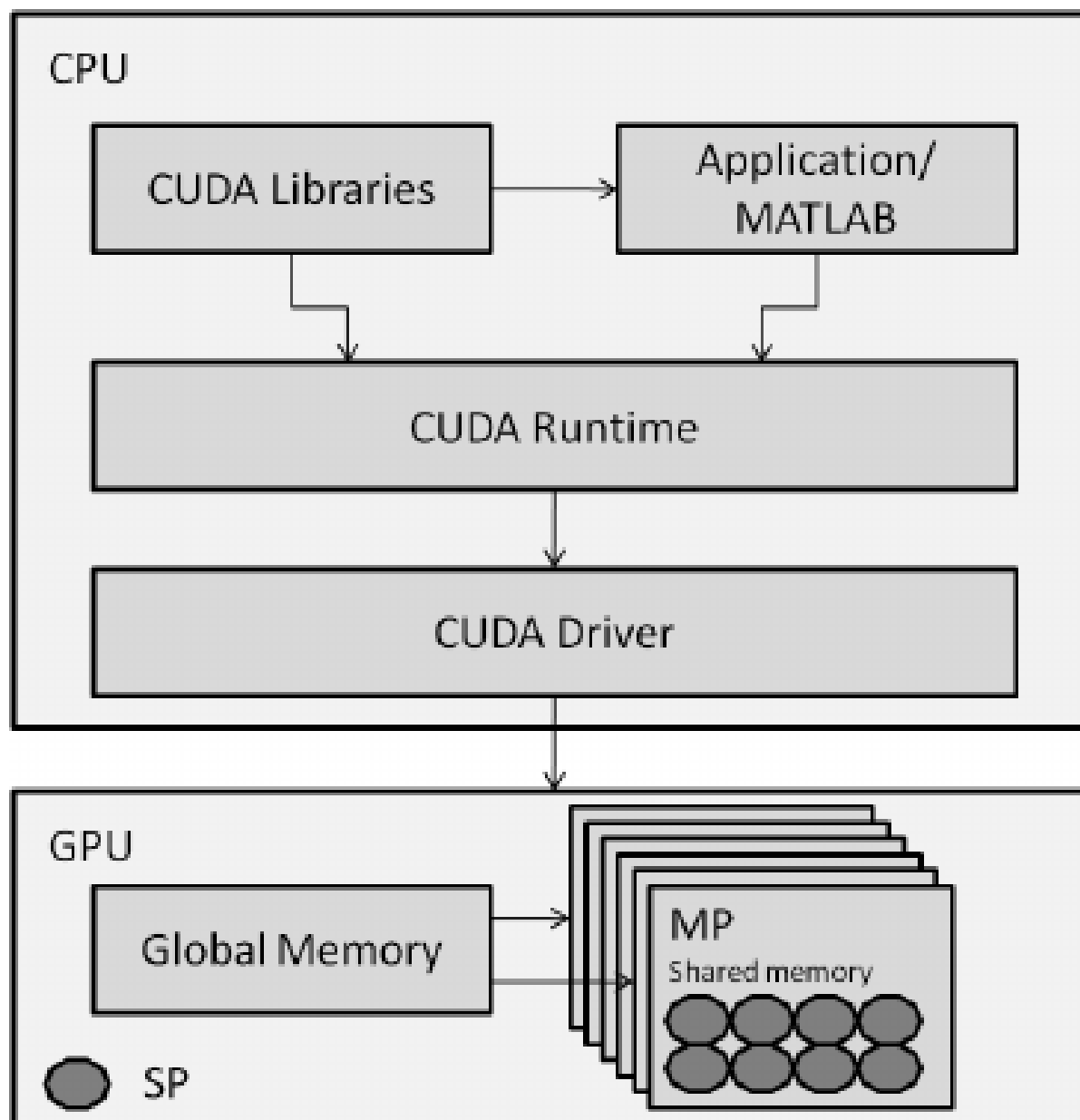


Near future we will have Quantum Computing platforms for AI

" Training machine learning models with thousands or more training examples on a CPU (central processing unit) can take days if not weeks, all the while, draining away at your patience! "

Sample Nvidia GPU Configuration

	K20X	K40
Peak Single Precision Peak SGEMM	3.93 TF 2.95 TF	4.29 TF 3.22 TF
Peak Double Precision Peak DGEMM	1.31 TF 1.22 TF	1.43 TF 1.33 TF
Memory size	6 GB	12 GB
Memory BW (ECC off)	250 GB/s	288 GB/s
Memory Clock	2.6 GHz	3.0 GHz
PCIe Gen	Gen 2	Gen 3
# of Cores	2688	2880
Core Clock	732 MHz	Base: 745 MHz Boost Clocks: 810 & 875 Mhz
Total Board Power	235W	235W
Form Factor	PCIe Passive	PCIe Passive, Active



Machine Learning / Deep learning Application



Python Compiler – 2.7, 3.3, 3.8

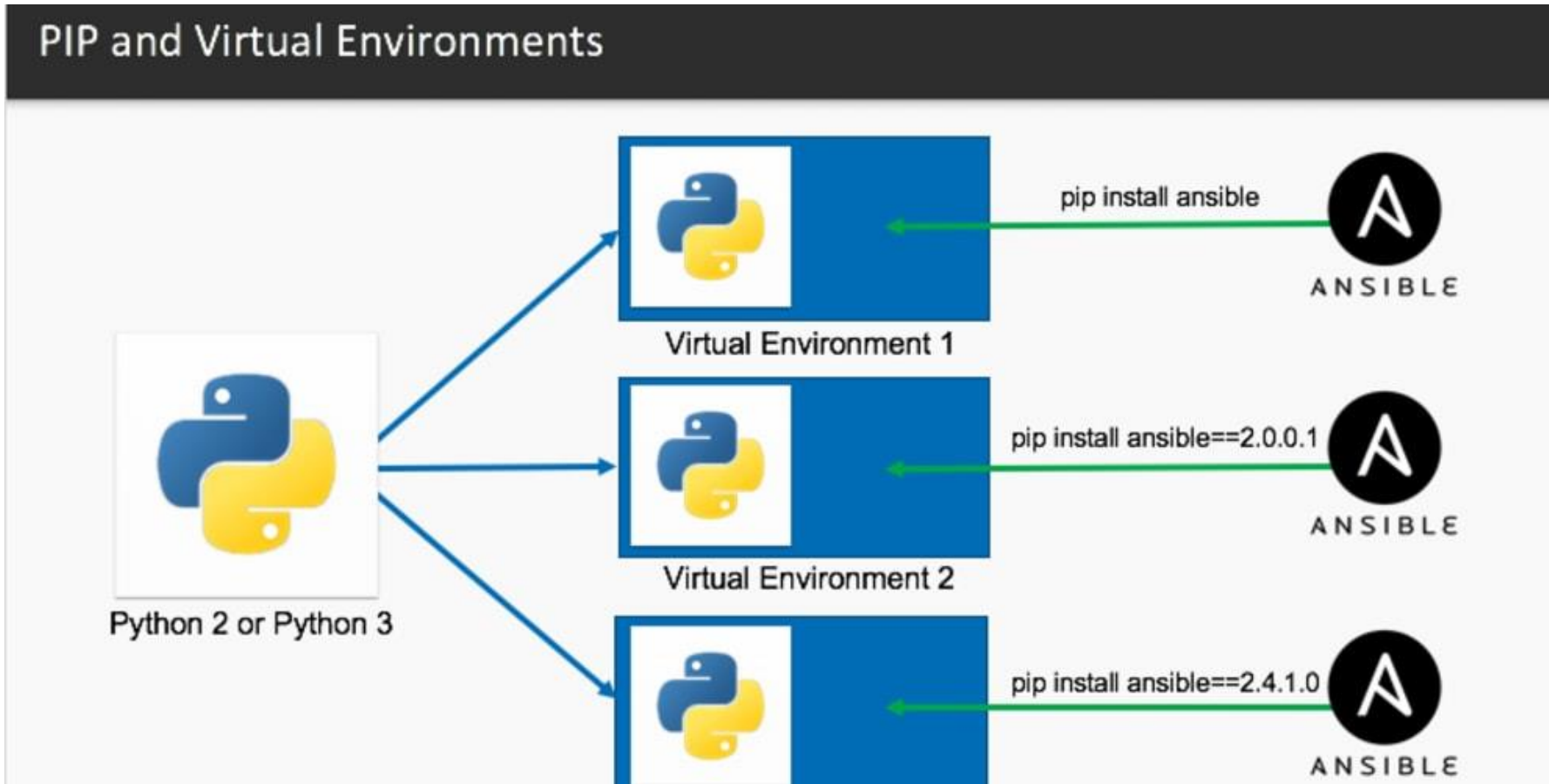
Virtual Env

CUDA Libraries / GPU Drivers

Operating System – Windows / Linux / Mac

CPU and GPU

Python virtual Environment



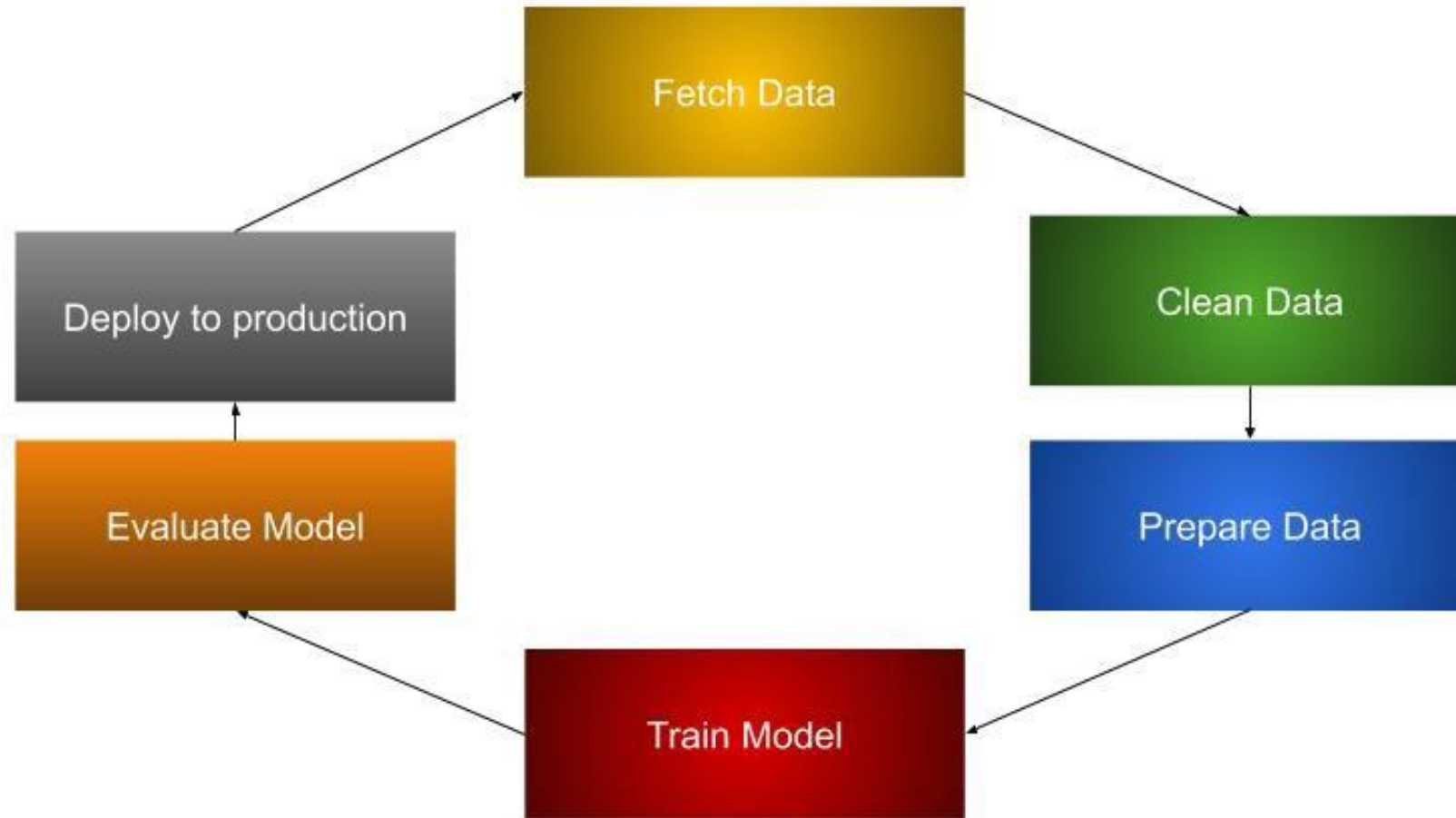
VENV

PyEnv

```
python3 -m venv /path/to/new/virtual/environment
```

Python for Deep Learning

A Basic Deep Learning Application Cycle



Data is the Gold Mine



Major Computer vision tasks

Semantic Segmentation



GRASS, CAT,
TREE, SKY

No objects, just pixels

**Classification
+ Localization**



CAT

Single Object

Object Detection



DOG, DOG, CAT

Multiple Object

Instance Segmentation



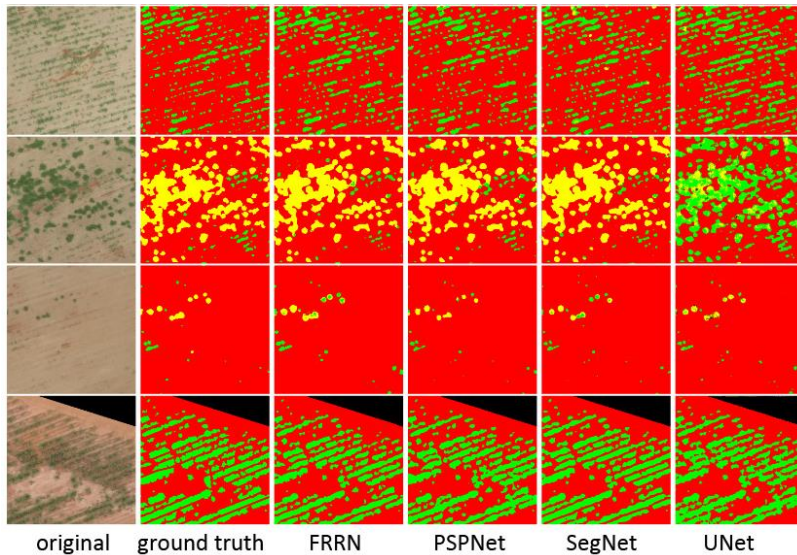
DOG, DOG, CAT

This image is CC0 public domain

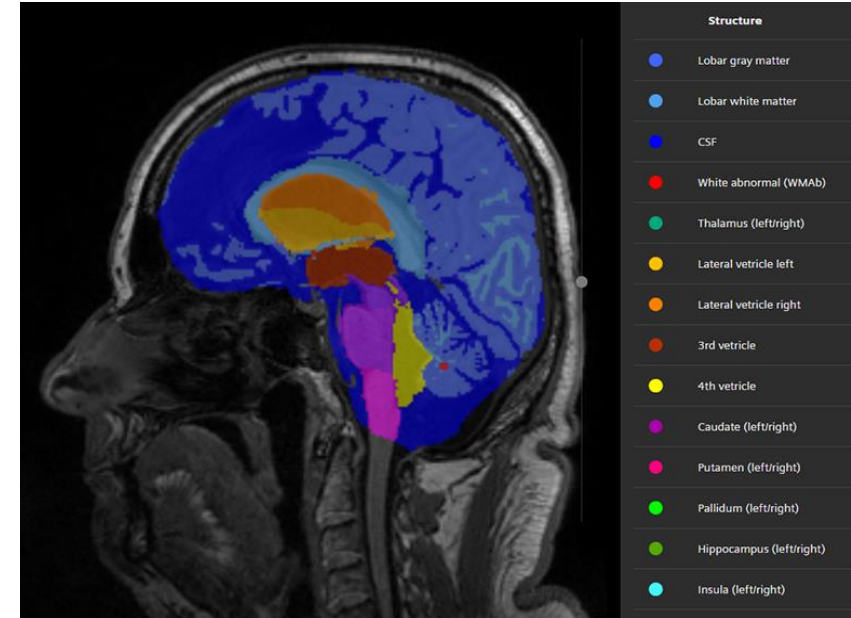
Deep learning in Image segmentation



Vehicle Automation



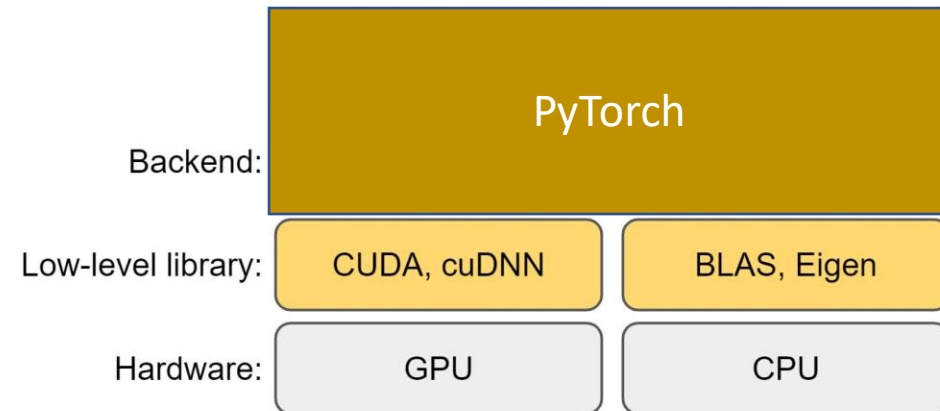
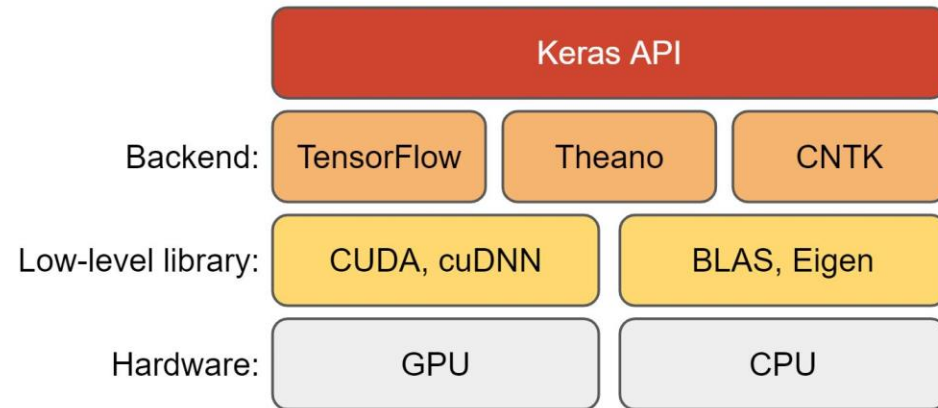
Precision Agriculture



Healthcare

Model Building In Python

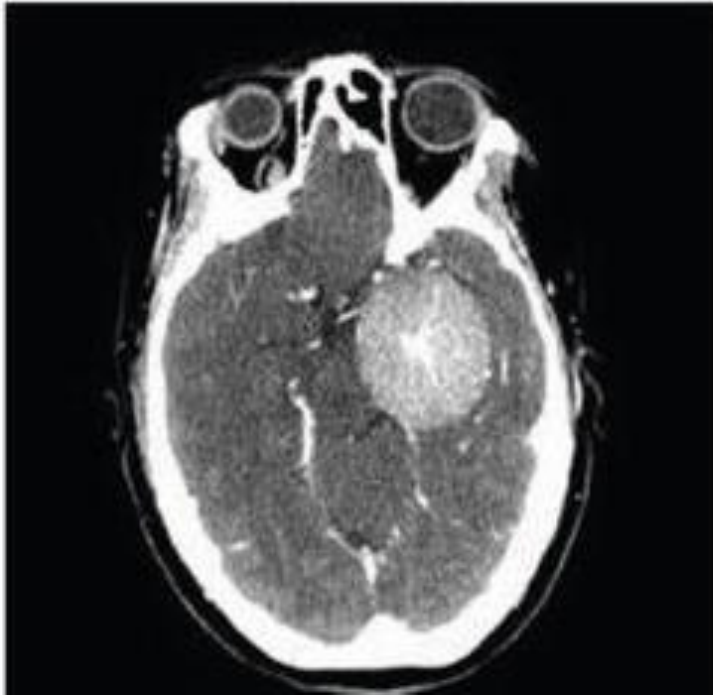
NN Front End and Back End



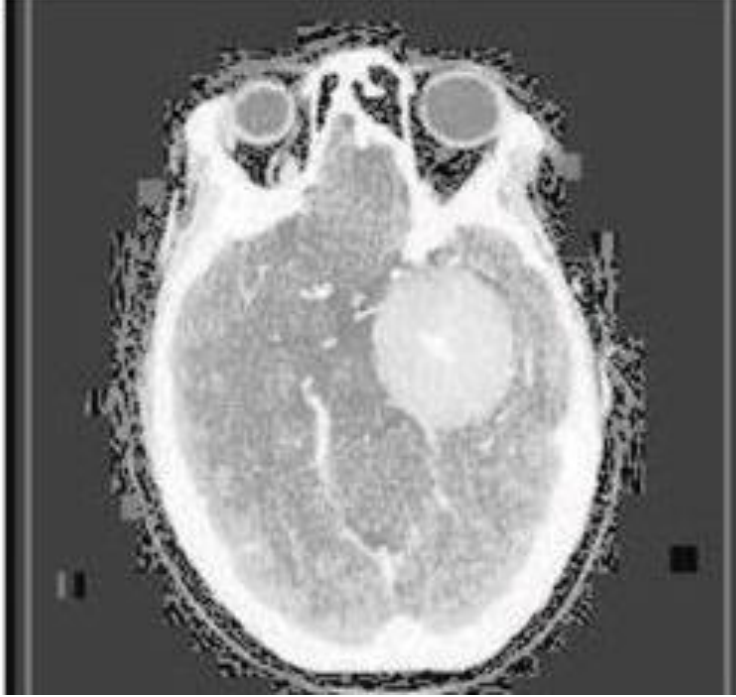
A Major Step before DL based Image Analysis

- Data Preprocessing
- Data Annotations

Imadjust



Histeq



Adapthisteq

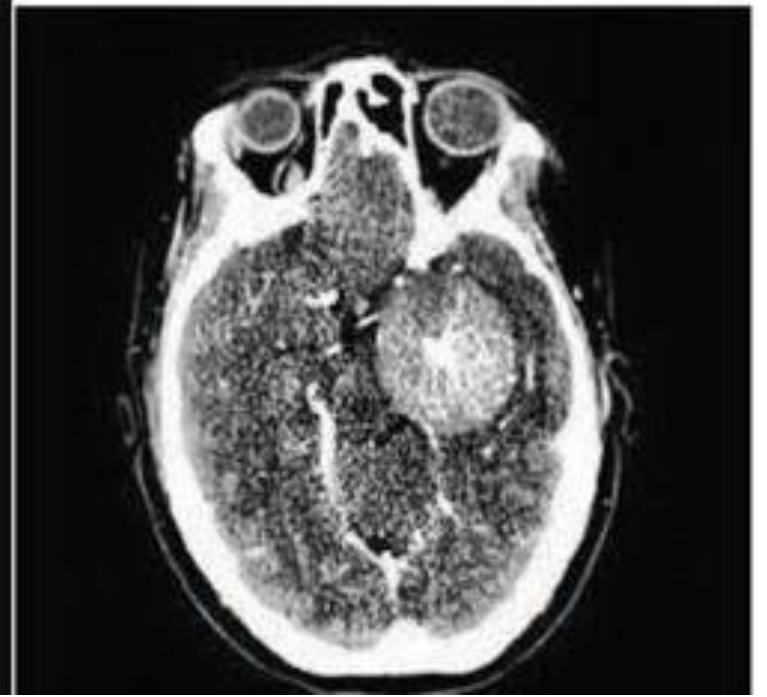


Image Preprocessing

- Contrast and Image quality are the major problems in medical imagery. Image Enhancement makes the image clear for human perception or machine analysis.

Python Image processing libraries



Image Annotation – Example 1

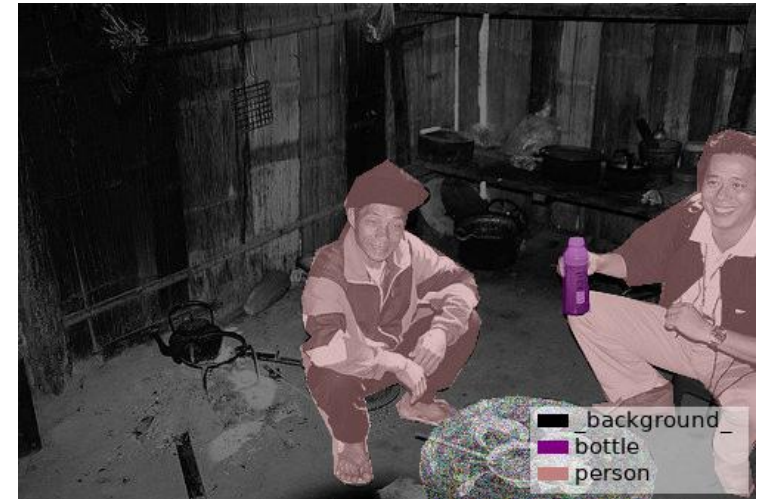
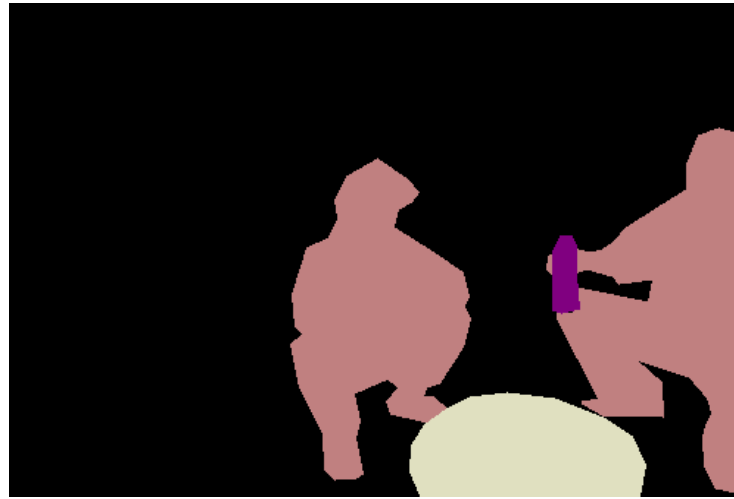


Image Annotation – Example 2

Multiple myeloma cancer is caused by the abnormal growth of plasma cells in the bone marrow.

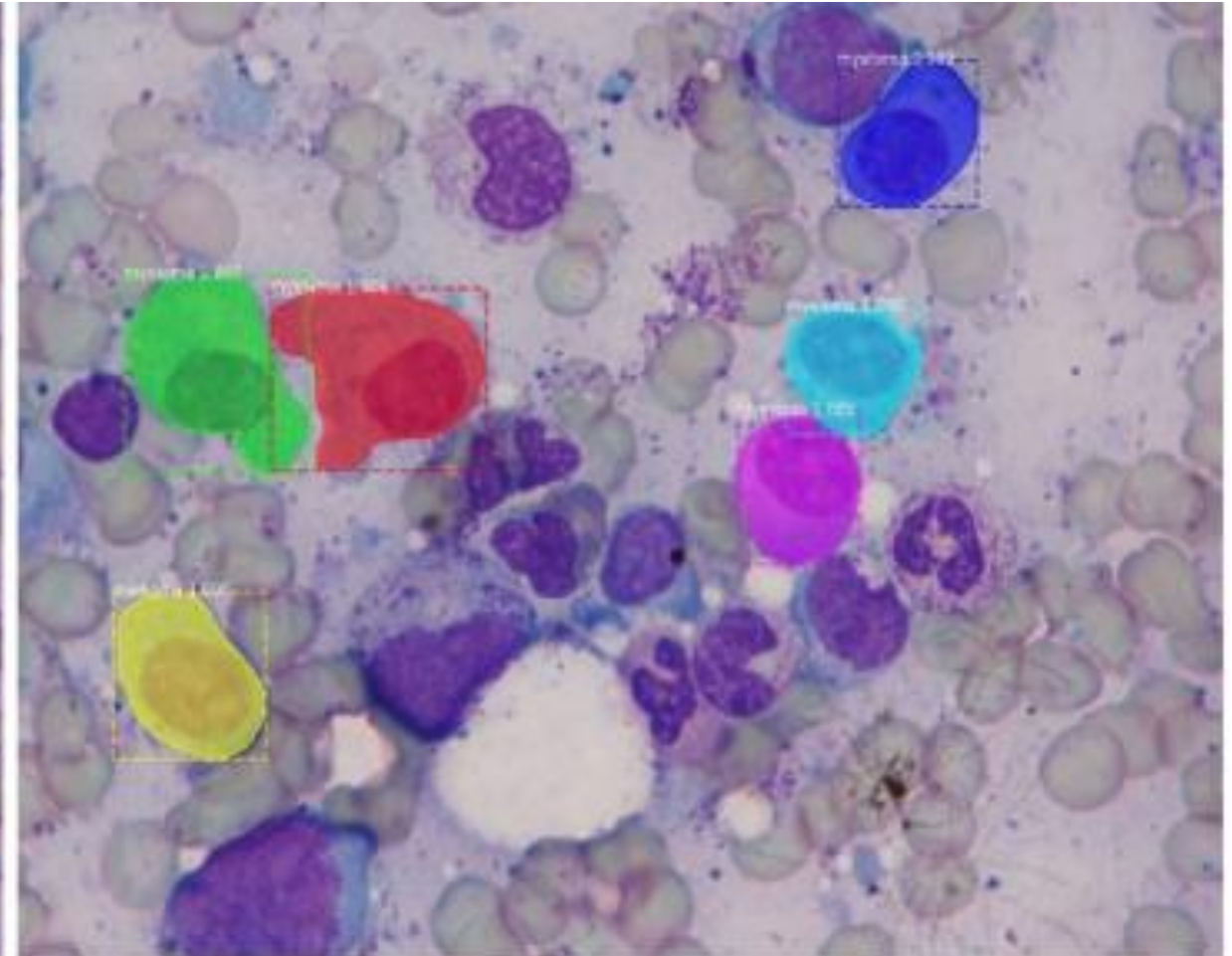
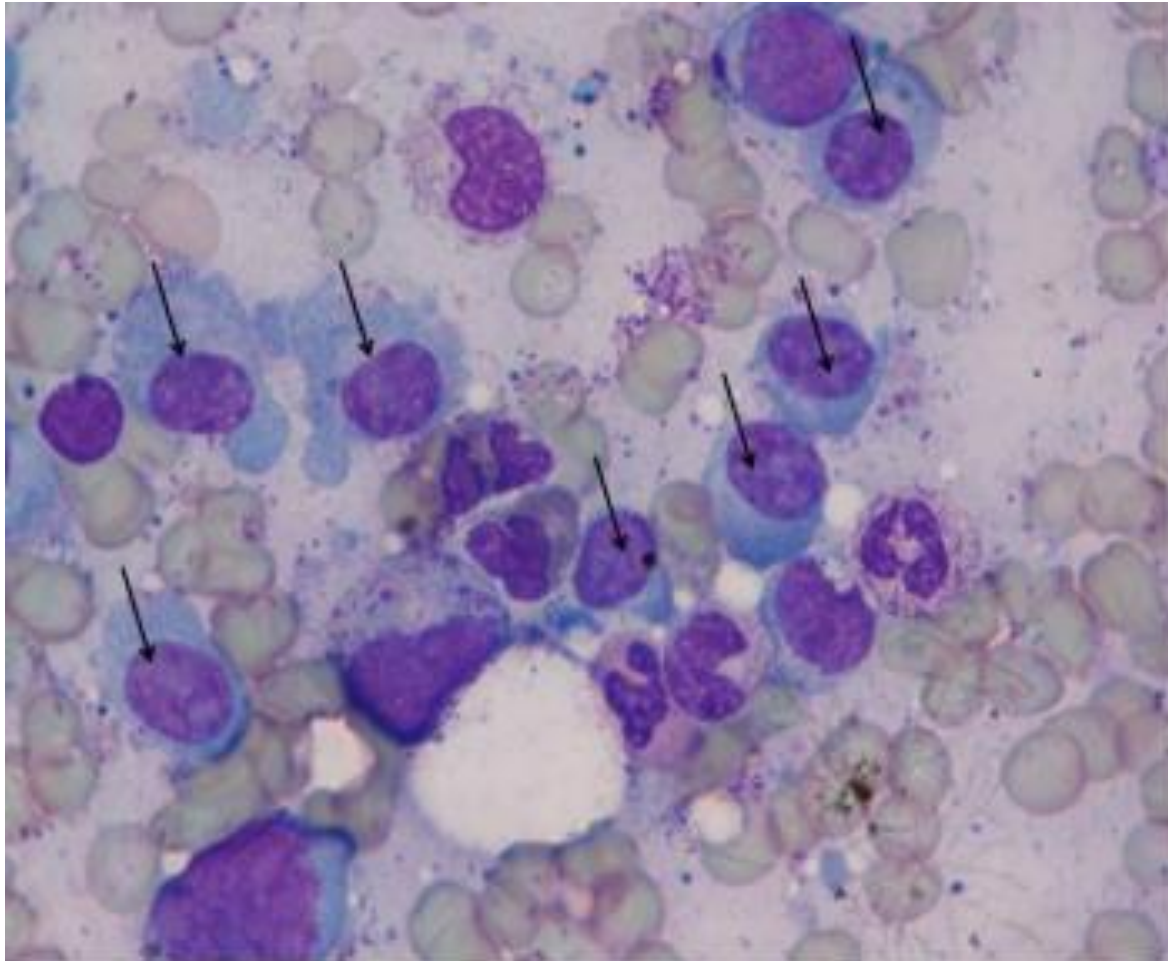


Image Annotation tools

- MATLAB Has Annotation tools as Plugins
- VGG Annotation tool – Supports Bounding Box / Pixel based segmentation also
- [TrainingData.io](https://trainingdata.io): TrainingData.io is a medical image annotation tool for data labeling. It supports DICOM image format for radiology AI.
- **LabelME** – Allows pixel wise and box annotations
- **Lionbridge AI**: Lionbridge AI has deep experience in all aspects of the medical devices vertical. We have 500,000 qualified contributors who can provide image annotation services quickly, with high precision. In addition, Lionbridge's team can help you manage your project timeline, budget, and quality control.
- **ImageJ**: ImageJ is a Java-based image processing program developed at the National Institutes of Health and the Laboratory for Optical and Computational Instrumentation.
- [OsiriX Viewer](https://www.slicer.org/): OsiriX is an image processing application for Mac dedicated to DICOM images produced by equipment. OsiriX is complementary to existing viewers, in particular to nuclear medicine viewers. It can also read many other file formats: TIFF (8,16, 32 bits), JPEG, PDF, AVI, MPEG and QuickTime.
- [ITK-SNAP](https://www.itk-snap.org/): ITK-SNAP is a free-software and cross-platform tool that provides semi-automatic segmentation using active contour methods, as well as manual delineation and image navigation.

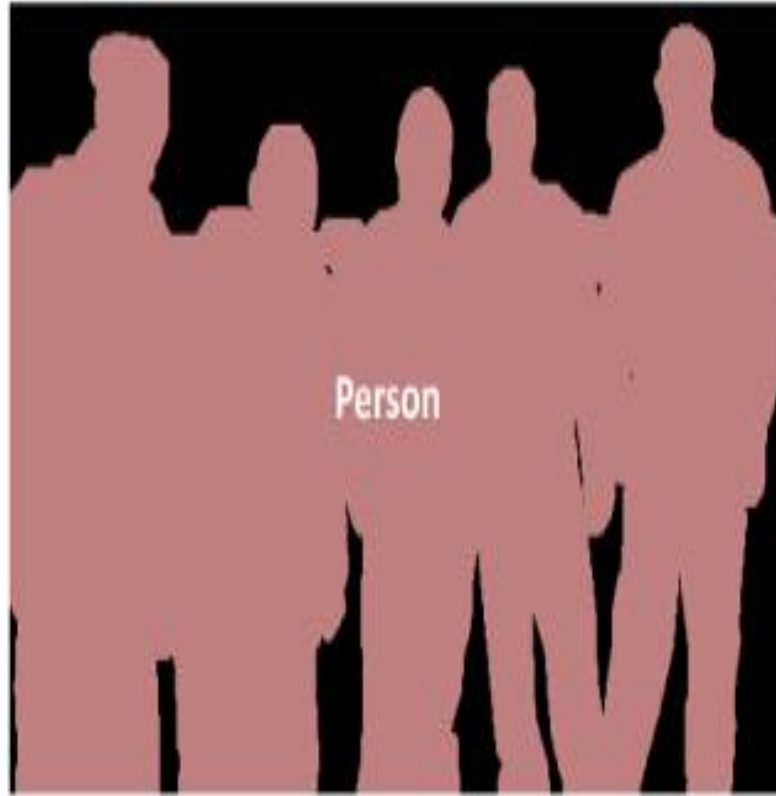
Semantic Segmentation



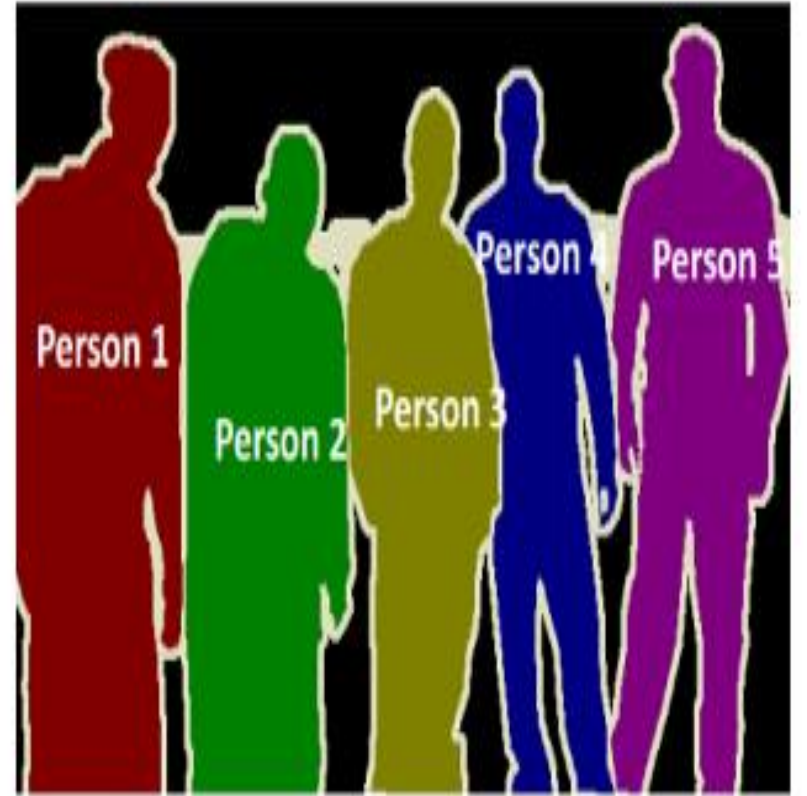
Person
Bicycle
Background



Object Detection

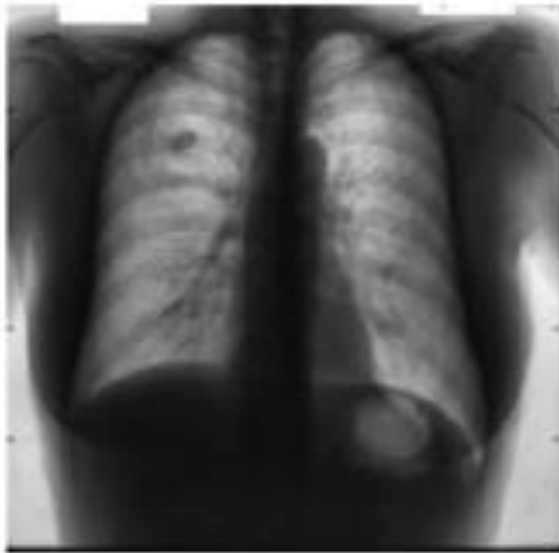


Semantic Segmentation

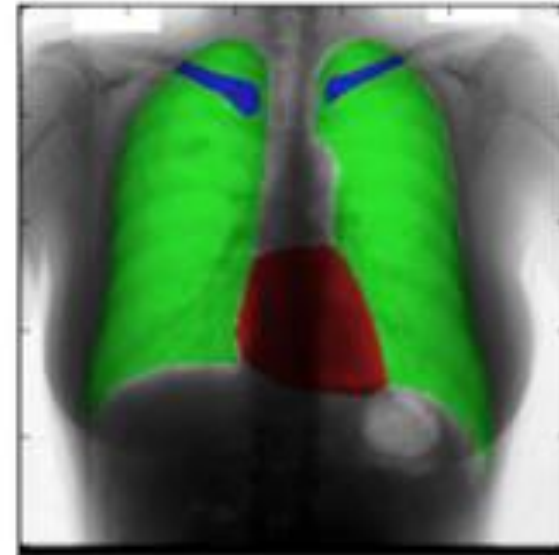


Instance Segmentation

Segmentation in Medical Image



Input Image



Segmented Image

The Unet Architecture

The **UNET** was developed by Olaf Ronneberger et al. for Bio Medical Image Segmentation.

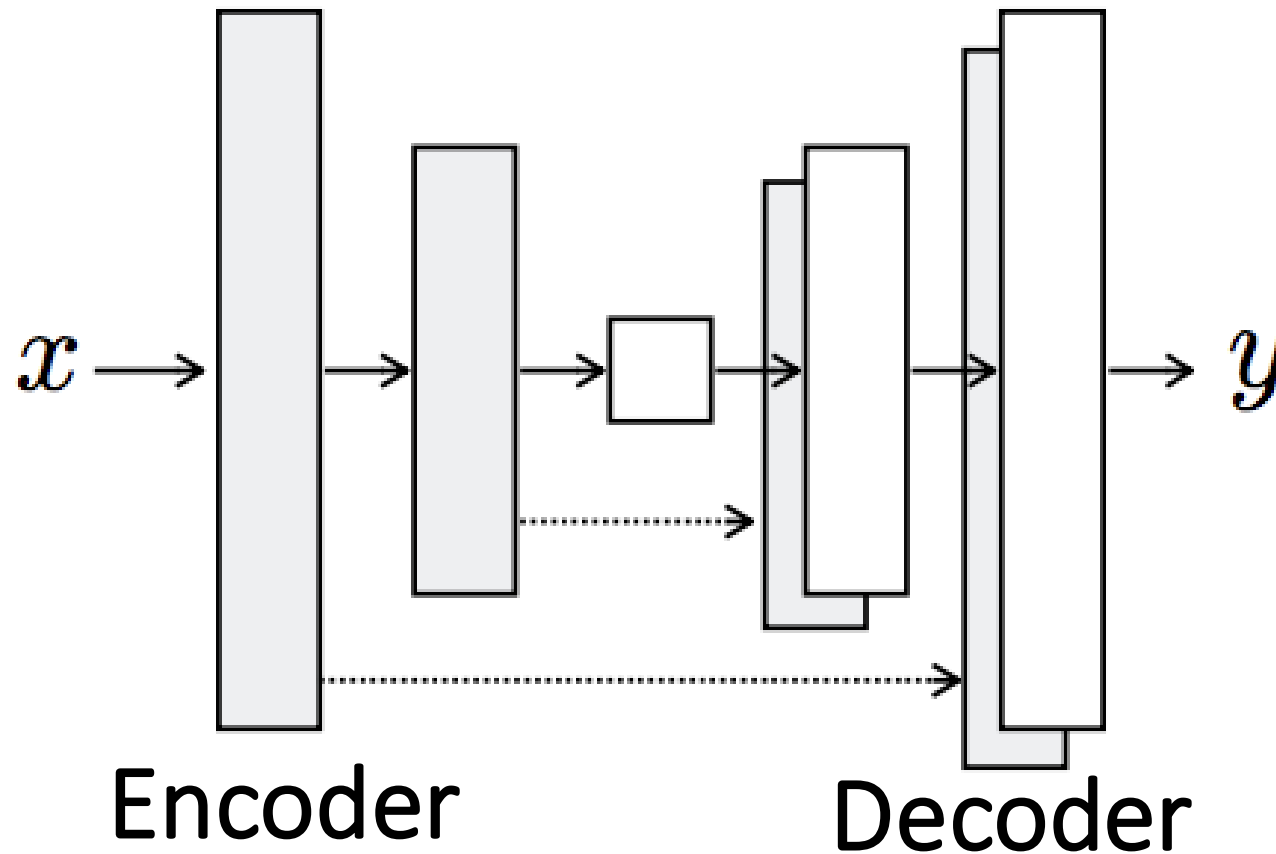
<https://arxiv.org/abs/1505.04597>

Unet - “fully convolutional network”

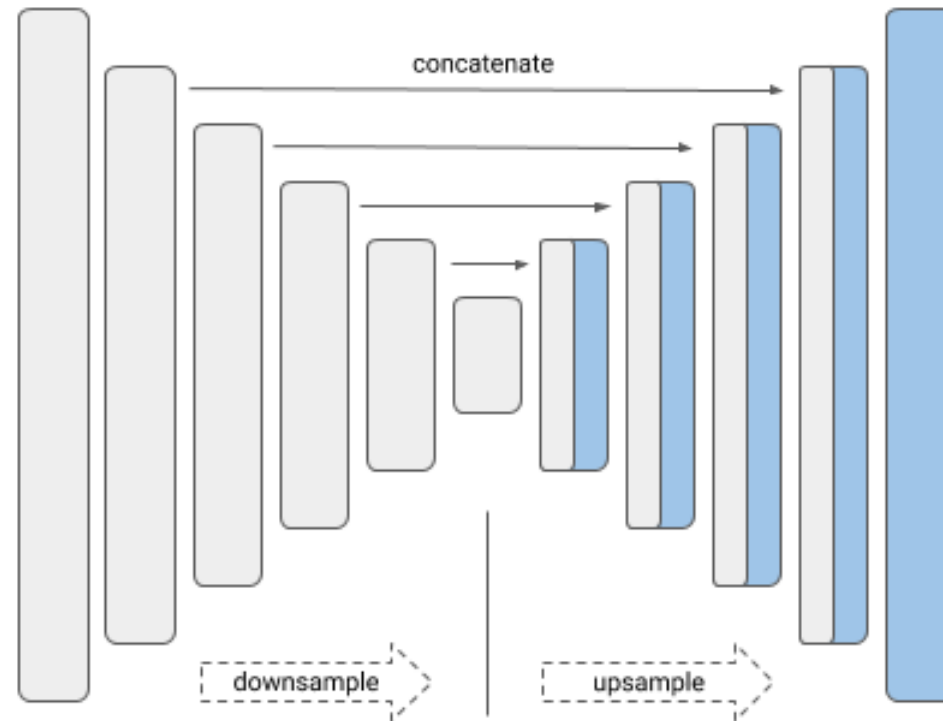
Contraction Path

U-Net

Expanding Path



Two major Operations



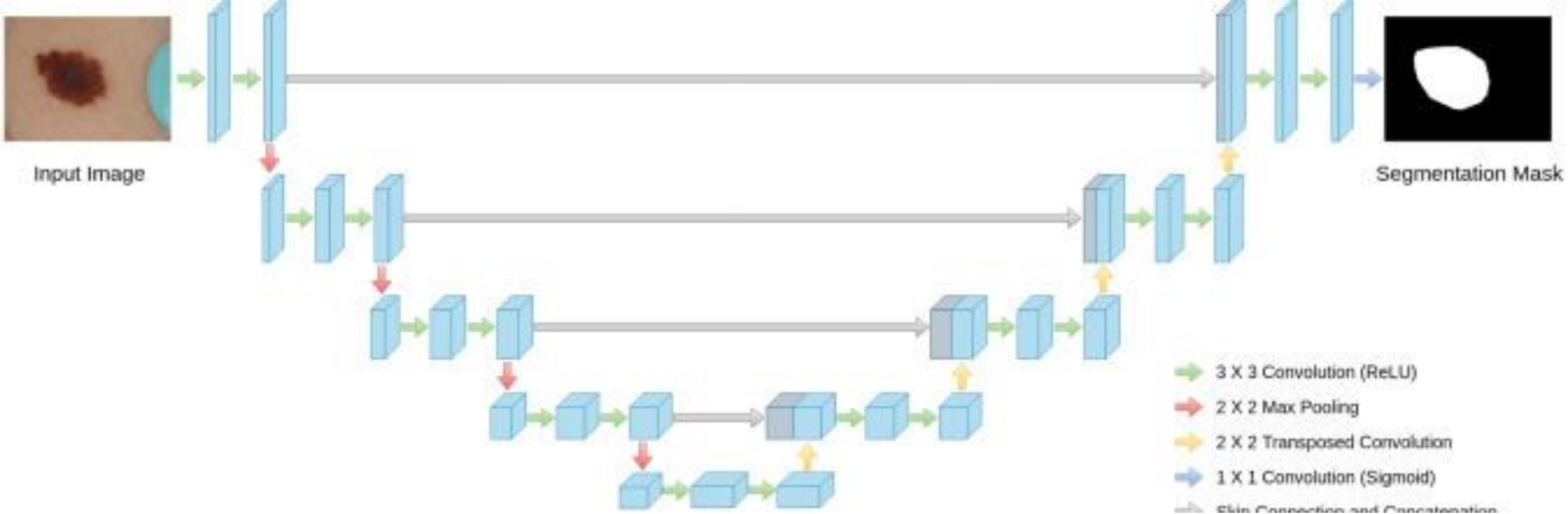
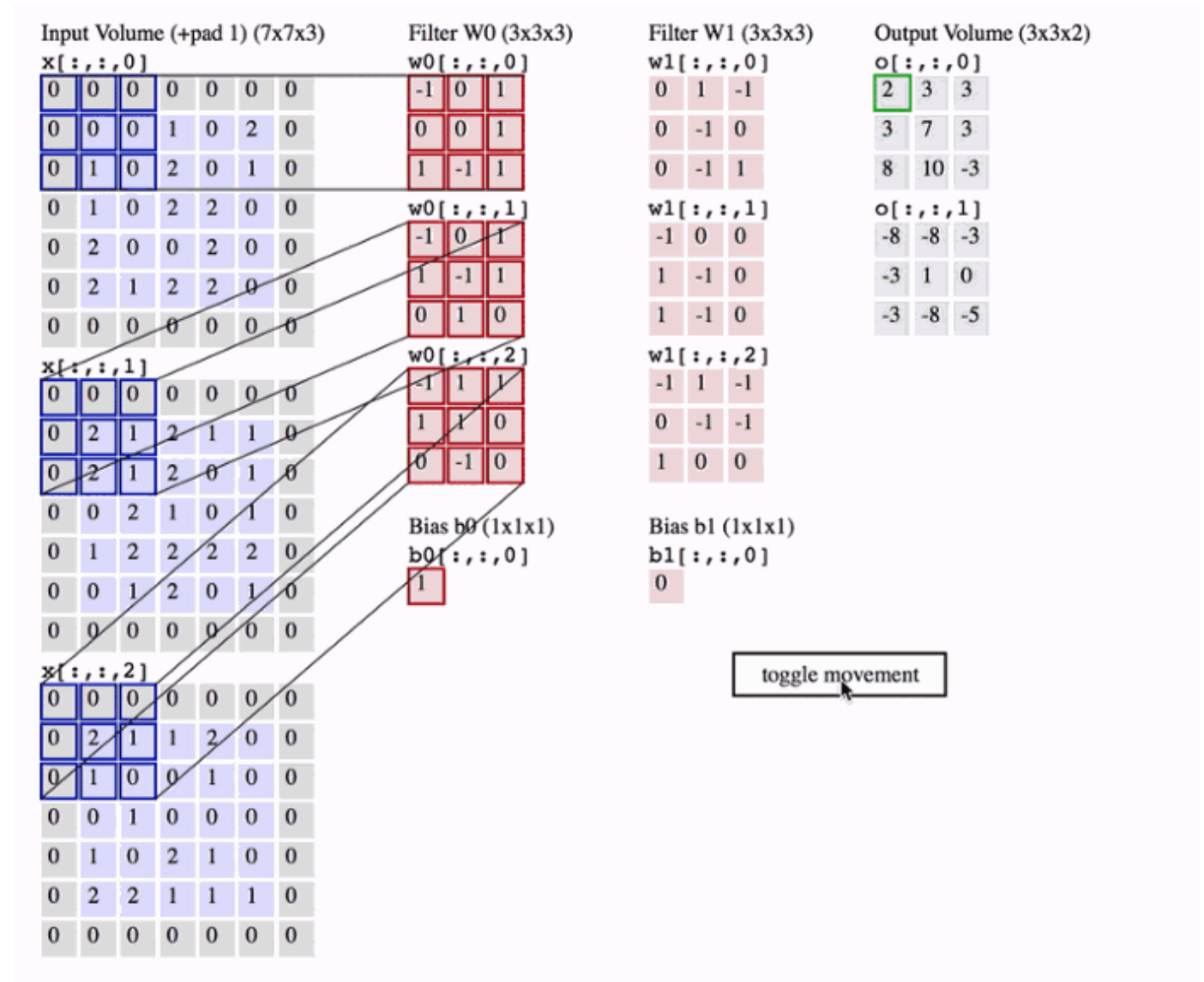


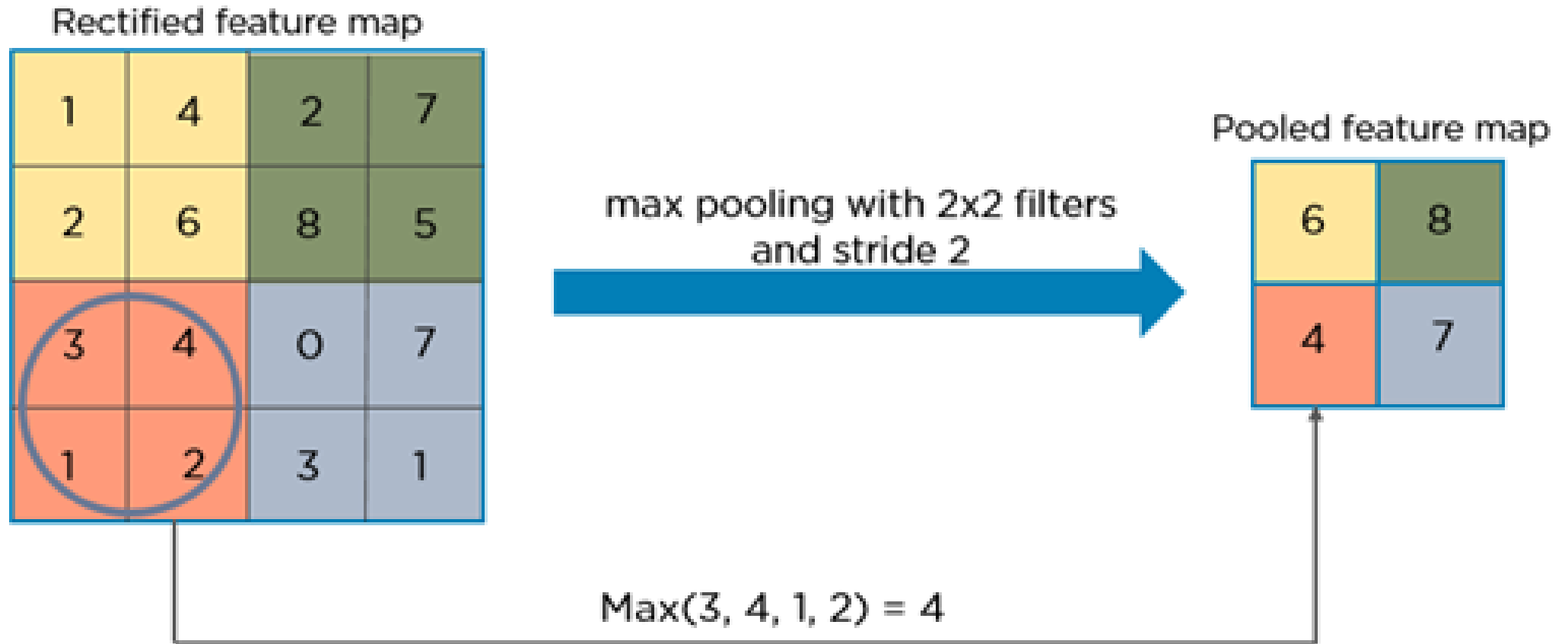
Image to Mask

- 3x3 Convolution (ReLU)
- 2x2 Max Pooling
- 2x2 **Transposed Convolution**
- 1 x 1 Convolution (Sigmoid)
- **Skip Connections and Concatinations**

Convolution Operation



Max-Pooling



Transposed convolution

1	2	3
6	5	3
1	4	1

3x3 Input

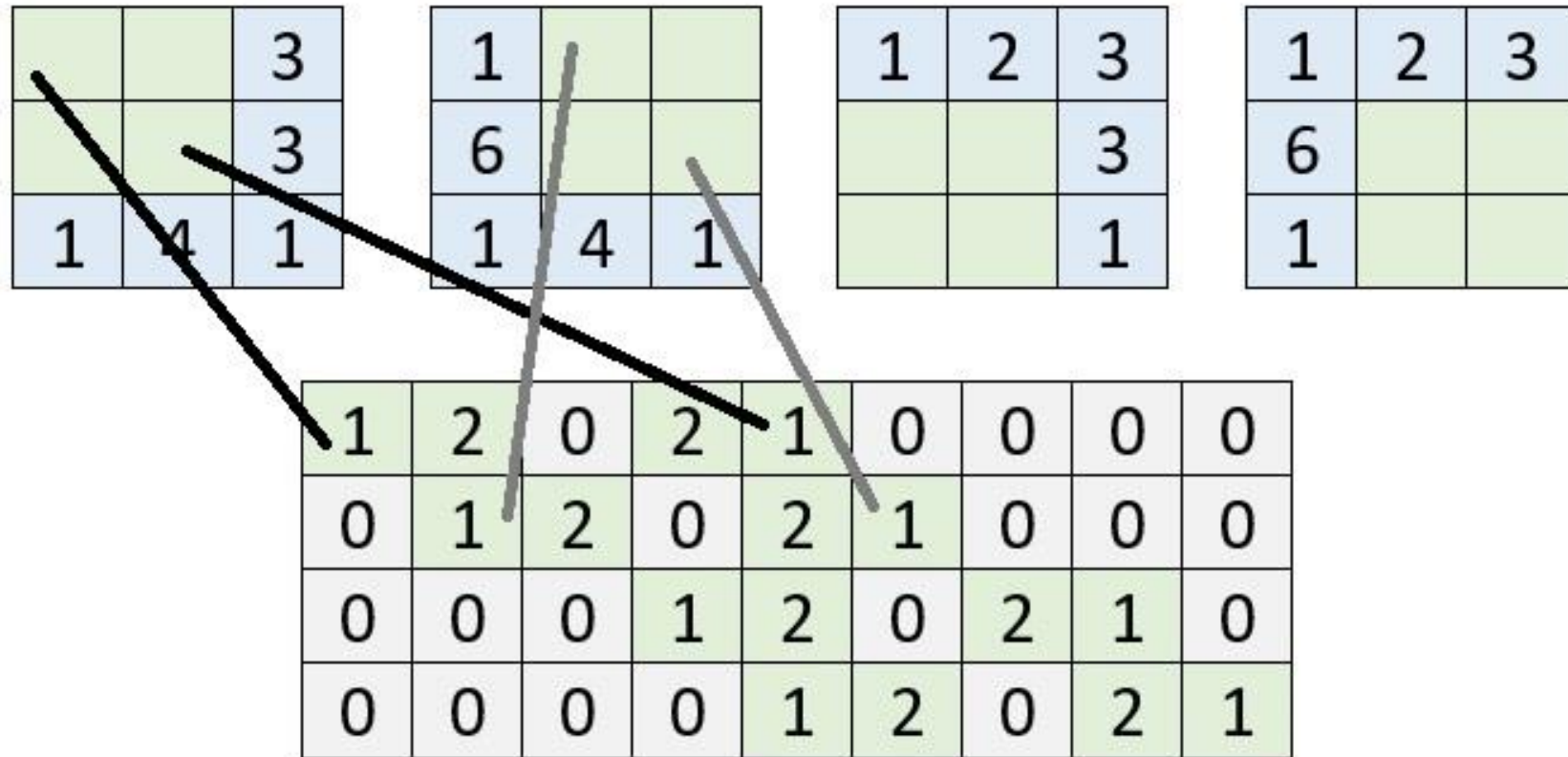
1	2
2	1

2x2 Kernel

22	21
22	20

Eg. Of Normal Convolution

Making Convolution Matrix



Compute Output with Convolution matrix

1	2	3
6	5	3
1	4	1

 $=$

1
2
3
6
5
3
1
4
1

1	2	0	2	1	0	0	0	0
0	1	2	0	2	1	0	0	0
0	0	0	1	2	0	2	1	0
0	0	0	0	1	2	0	2	1

 \times

1
2
3
6
5
3
1
4
1

 $=$

22
21
22
20

Transpose Convolution

1	0	0	0
2	1	0	0
0	2	0	0
2	0	1	0
1	2	2	1
0	1	0	2
0	0	2	0
0	0	1	2
0	0	0	1

x

1
2
2
4

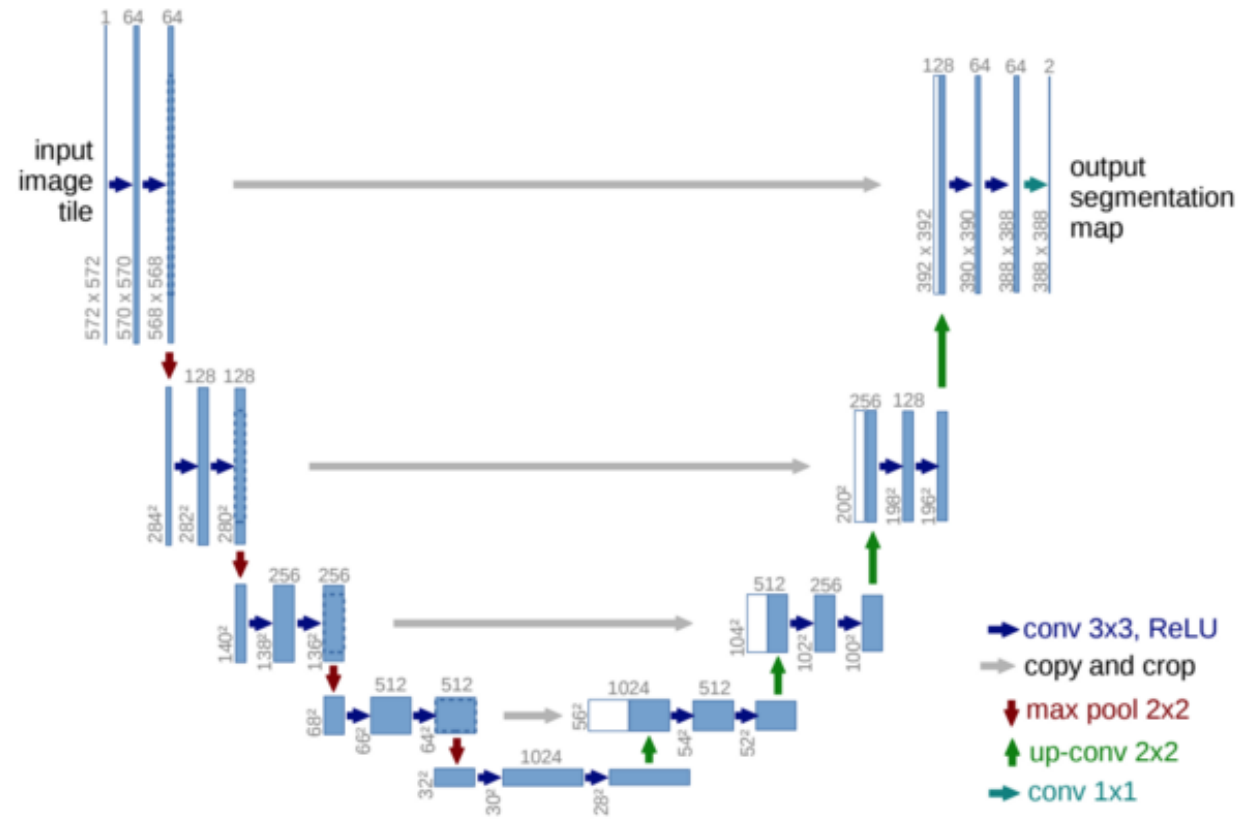
=

1
4
4
4
13
10
4
10
4

=

1	4	4
4	13	10
4	10	4

Final Architecture - UNET



Let's see the implementation

Let's

GAN Applications

- Generate Examples for Image Datasets
- Generate Photographs of Human Faces
- Generate Realistic Photographs
- Generate Cartoon Characters
- Image-to-Image Translation
- Text-to-Image Translation
- Clothing Translation
- Video Prediction
- 3D Object Generation
- Semantic-Image-to-Photo Translation
- Face Frontal View Generation
- Generate New Human Poses
- Photos to Emojis
- Photograph Editing
- Face Aging
- Photo Blending
- Super Resolution
- Photo Inpainting



man
with glasses



man
without glasses



woman
without glasses



woman with glasses

Face aging using GAN



2014



2015



2016

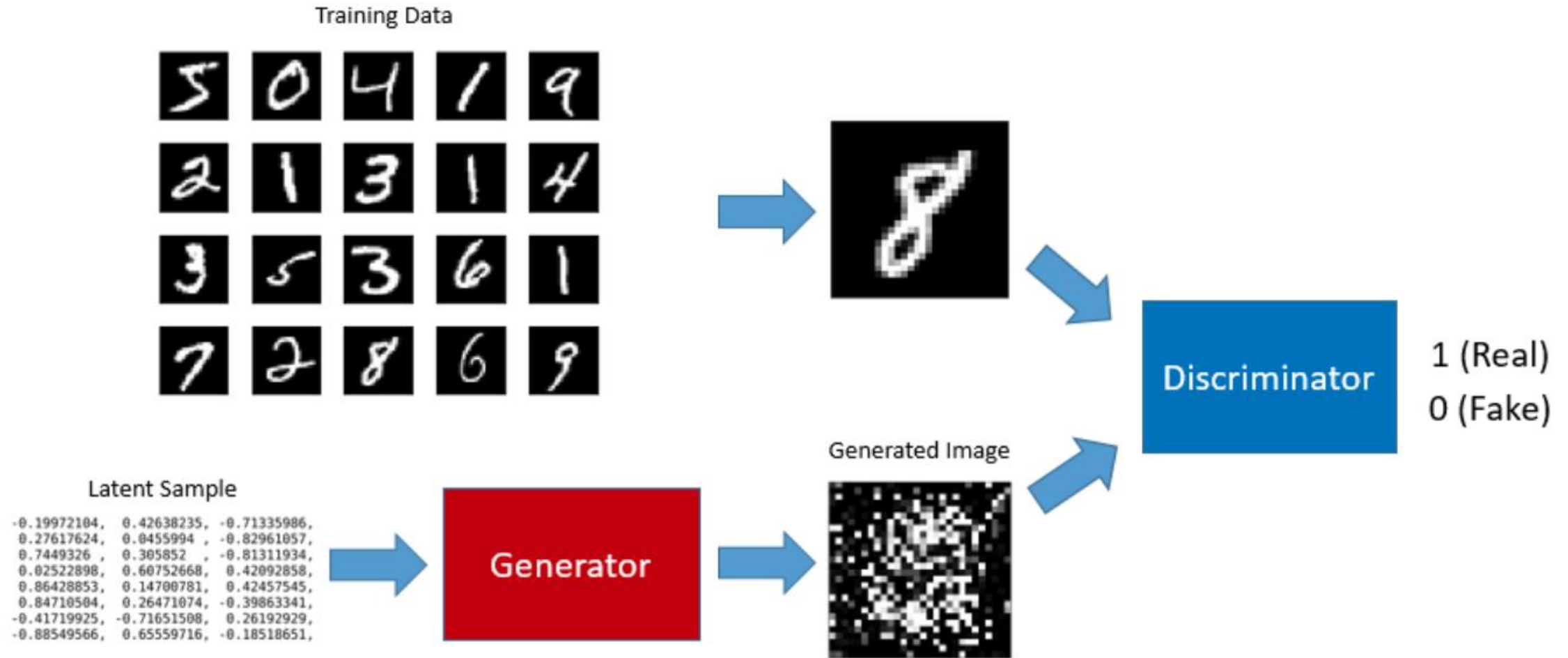


2017

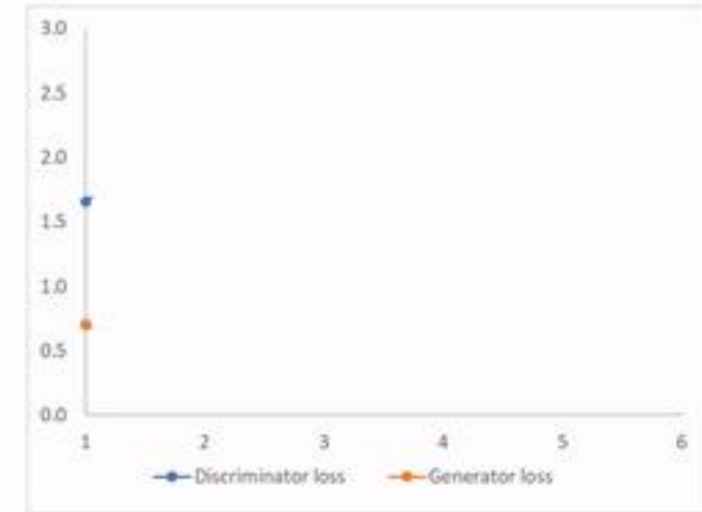
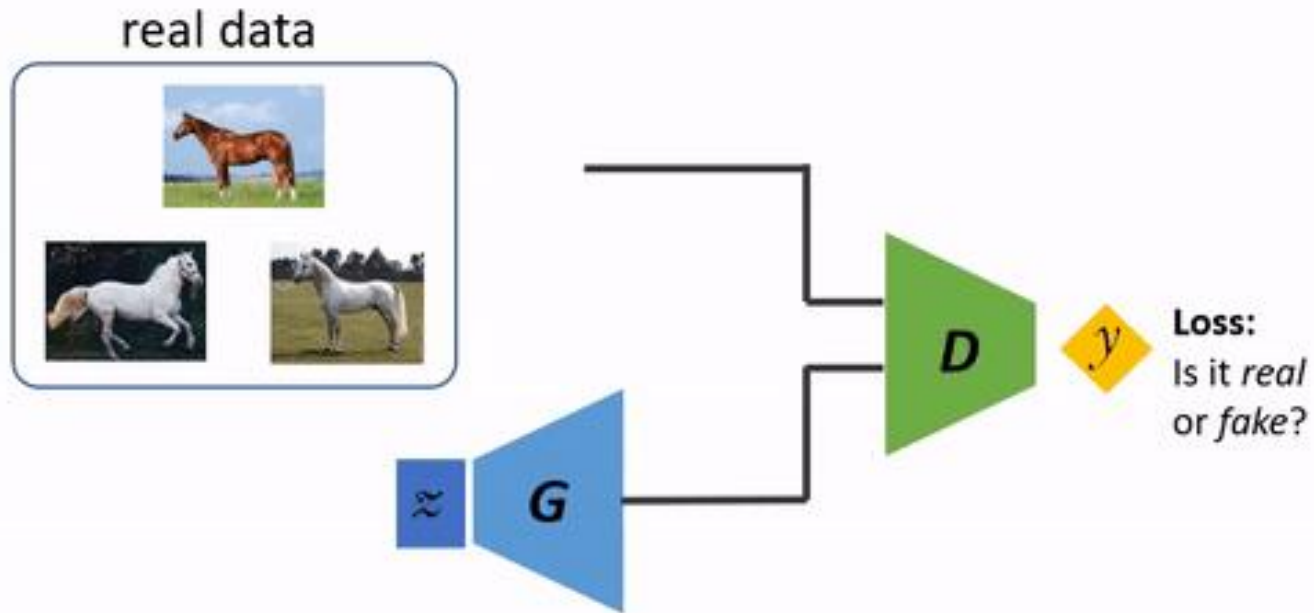
Image to Image Translation – Day to Night



How GAN Works



How GAN Works



The generator learns the data distribution

- Credits : GANLAB

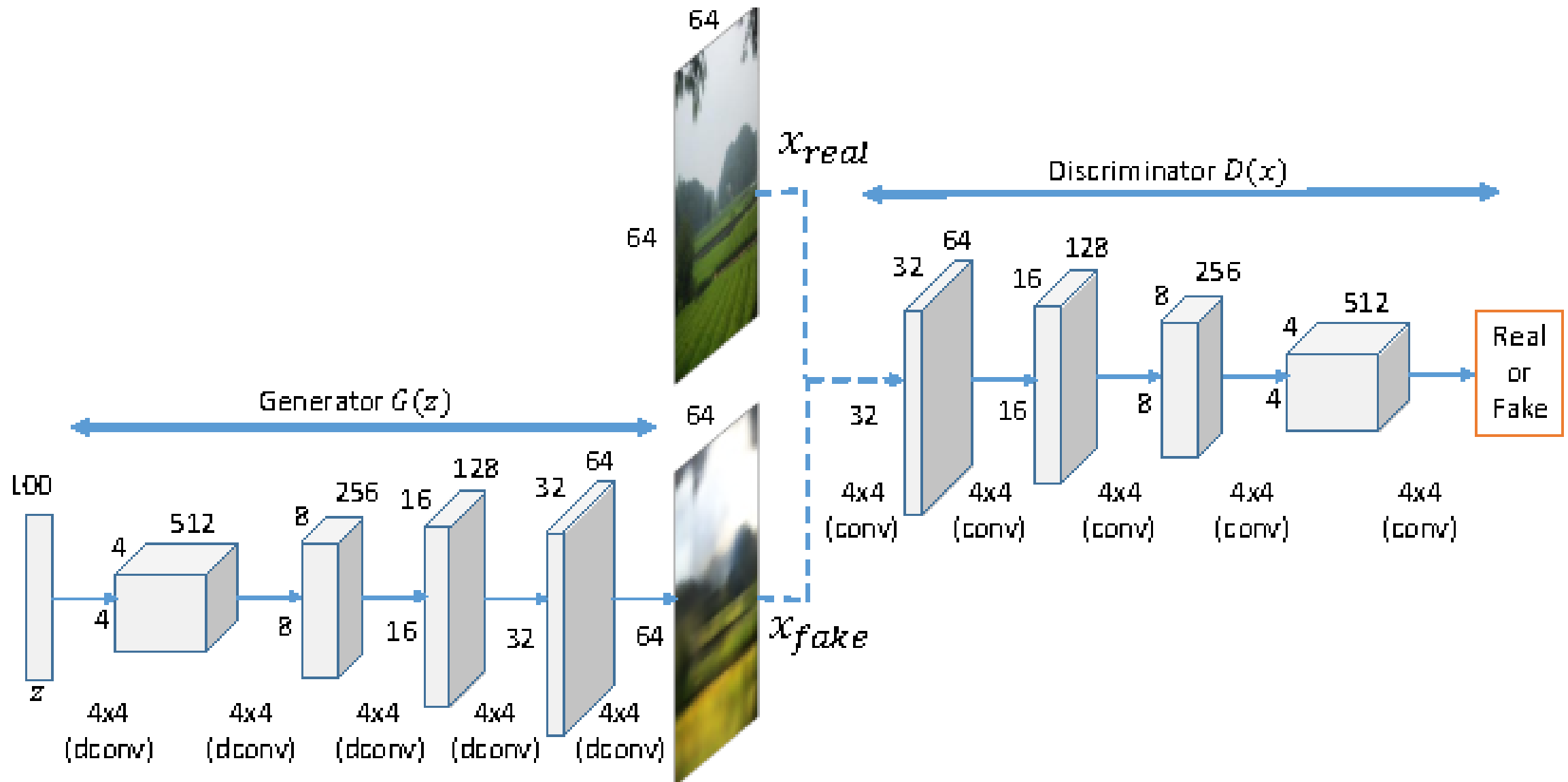
LAYERED DISTRIBUTIONS



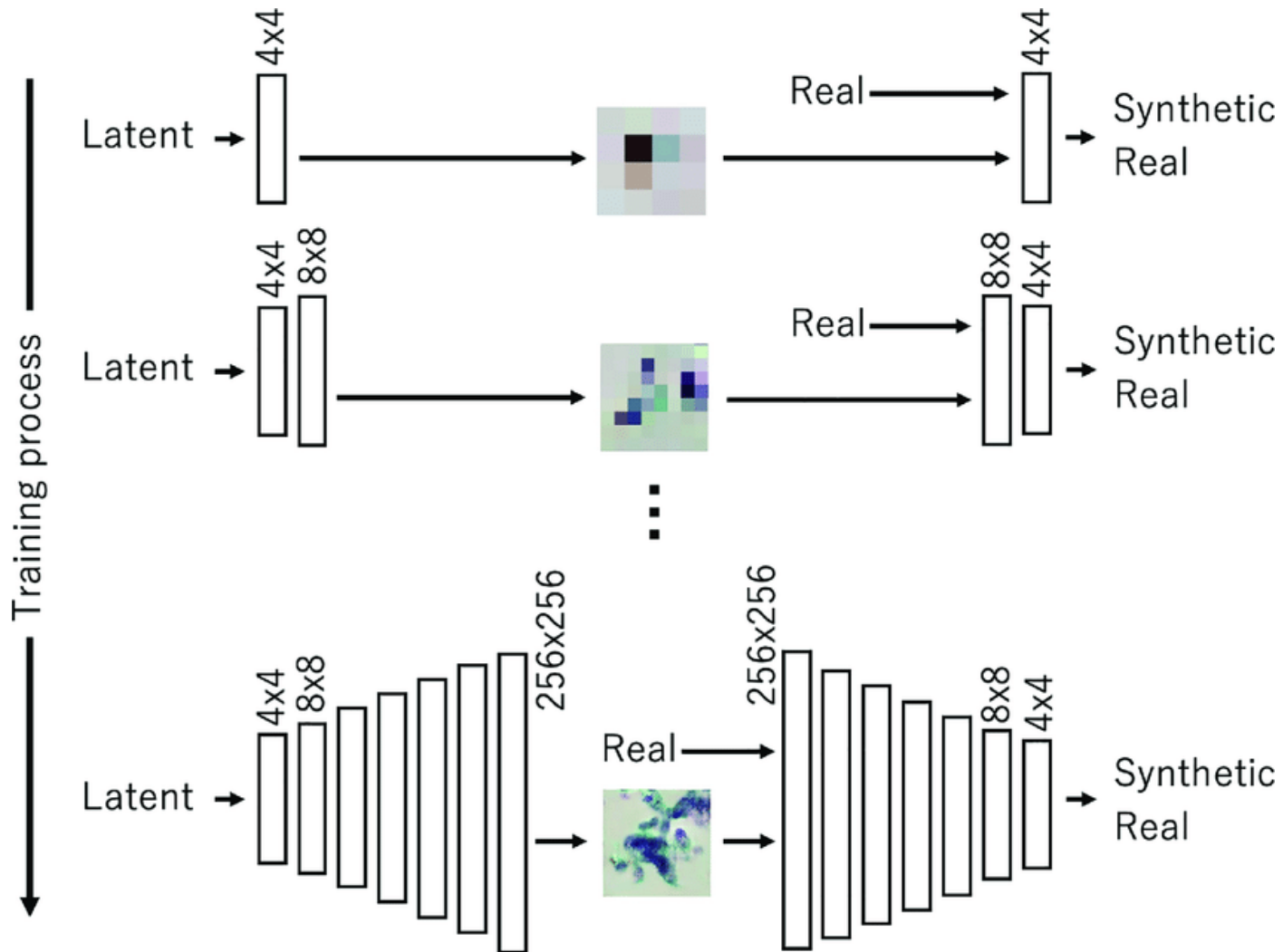
Each dot is a 2D data sample:

- Real samples
- Fake samples

GAN Networks



GAN Training Progress



- You can have your own architectures for generator and Discriminator



Let's Explore GAN implementation Using Python

Thank You