

# Lecture 12 - Generative Adversarial Networks

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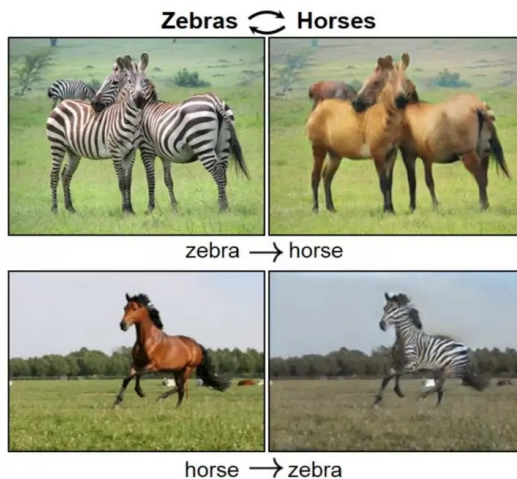
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# Topics

- Review of Lecture 11 – Image Segmentation
  - Object Segmentation (Bounding Box Level)
  - Instance / Semantic Segmentation (Pixel Level)
- Generative Adversarial Networks
  - DCGAN
  - PIX2PIX
- Practice

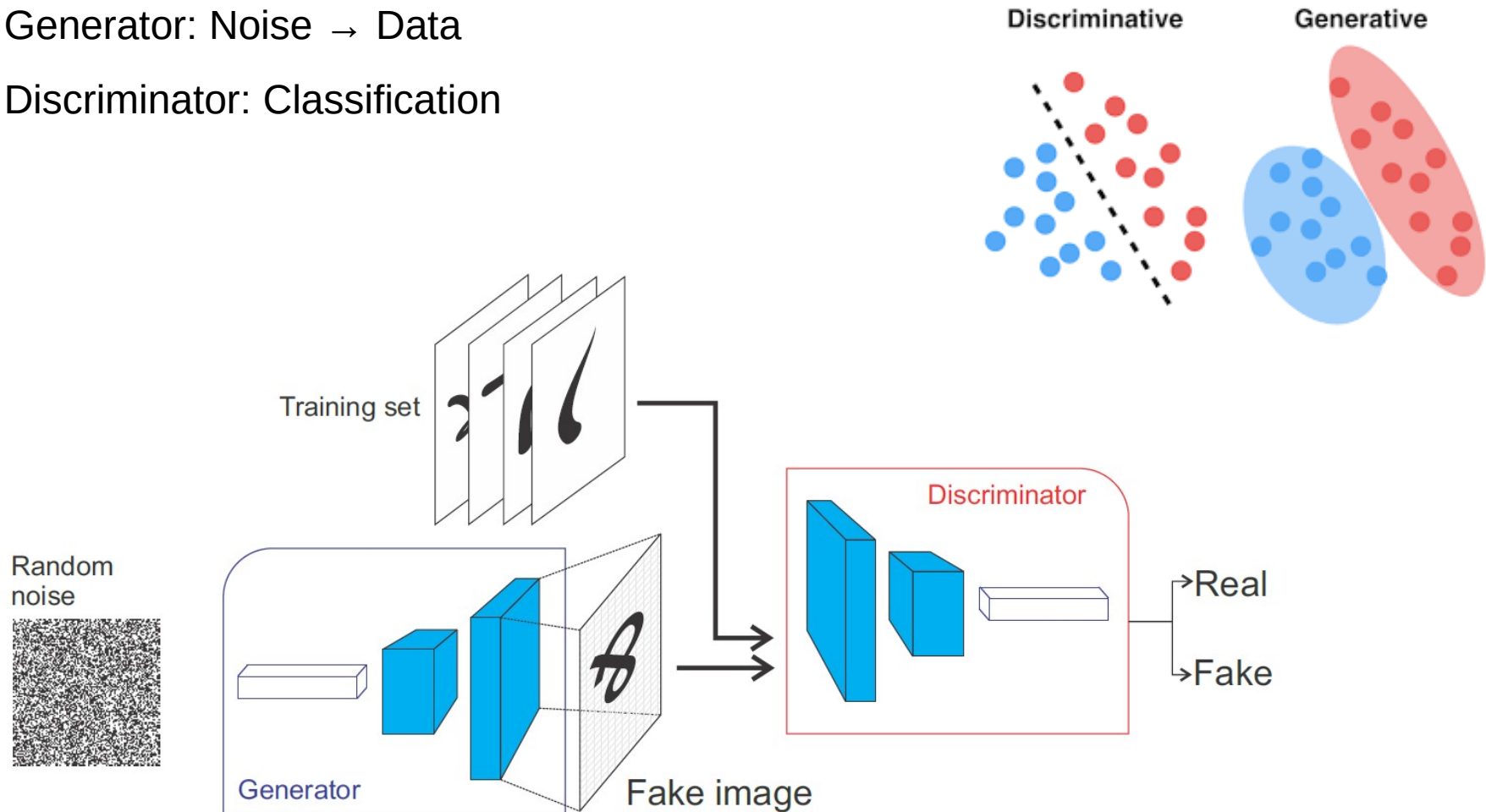
# Deep Fakes

- Generalization: Synthetic data produced from the learning of real data distribution
- Several Applications
  - Movies (Fake Scenes)
  - Photo Enhancement (Pose Estimation, Gray2Color, Noise Reduction)
  - Image Translation
  - .....



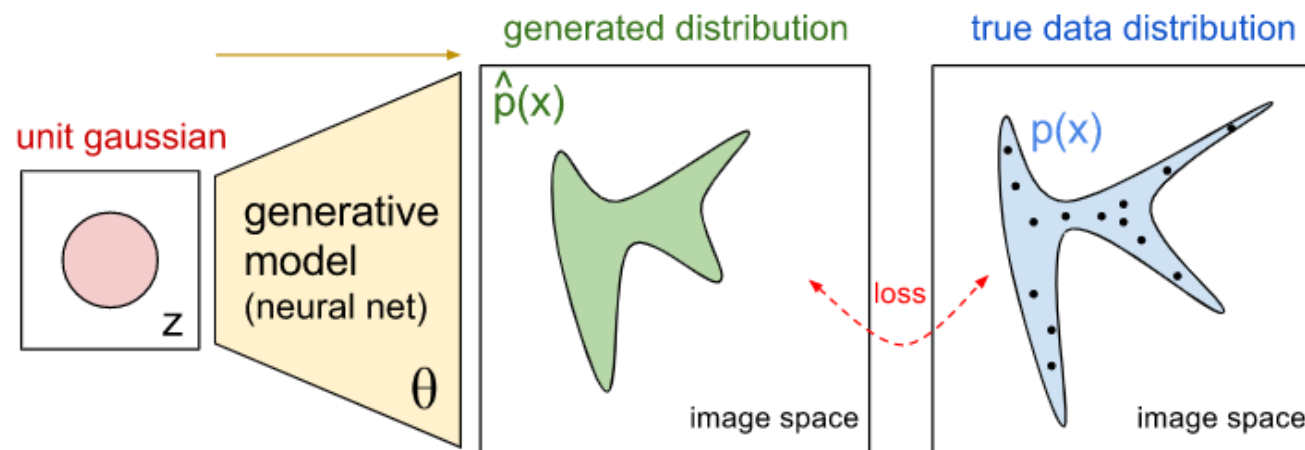
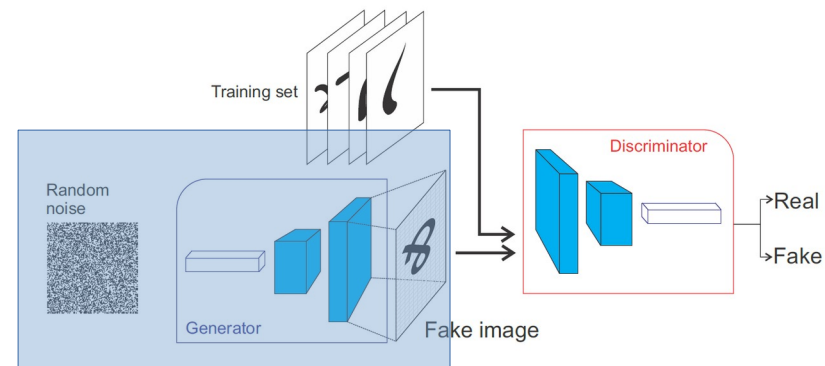
# Generative Adversarial Networks (GAN's)

- Generator: Noise  $\rightarrow$  Data
- Discriminator: Classification

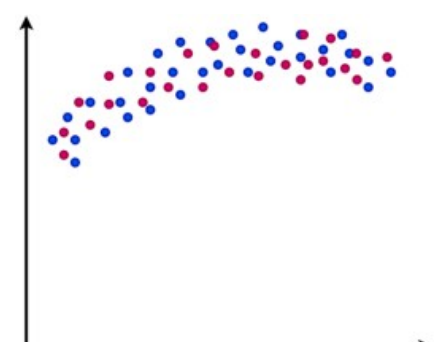
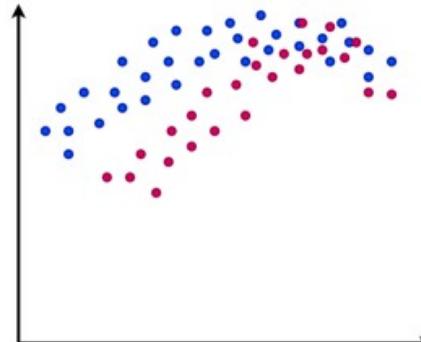
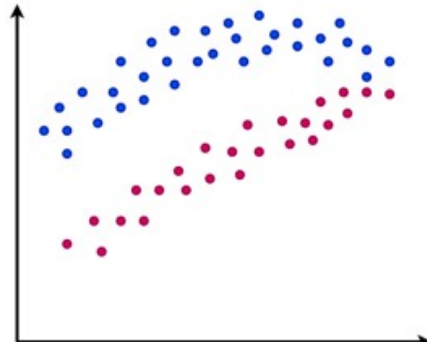
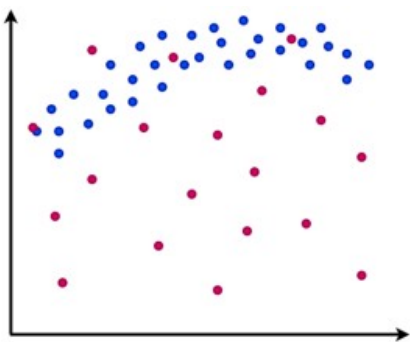
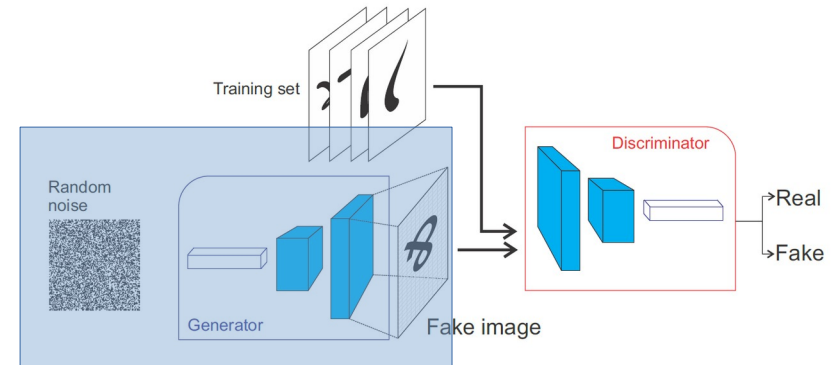
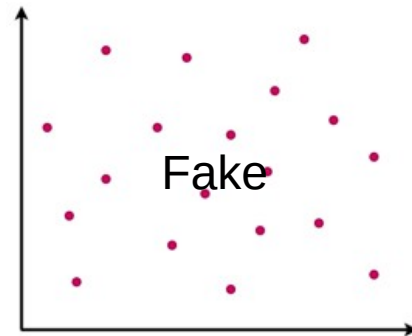
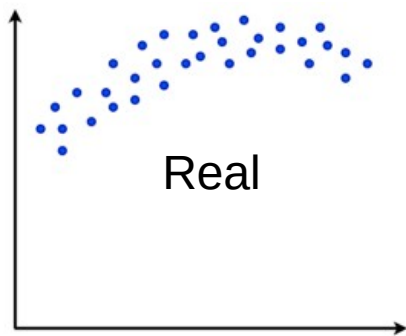


# Generative Model

- Learns data distribution



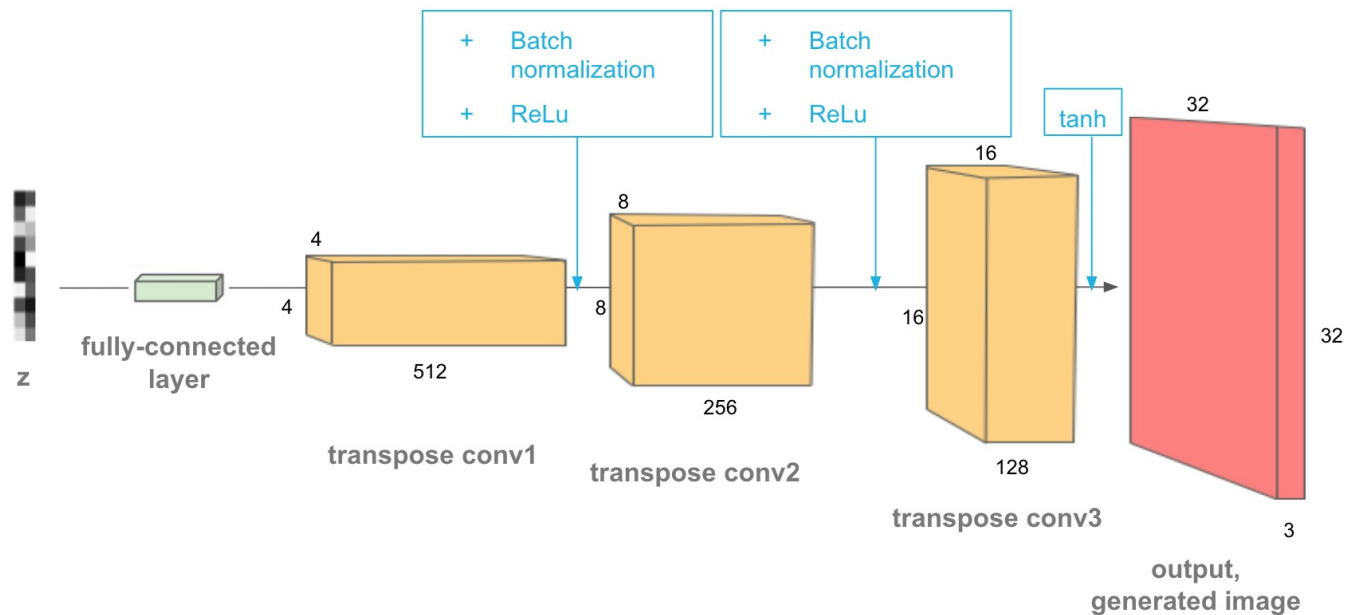
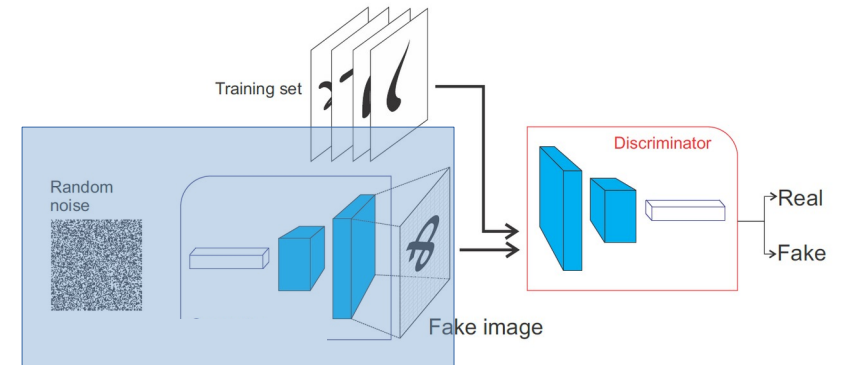
# Generative Model



Training

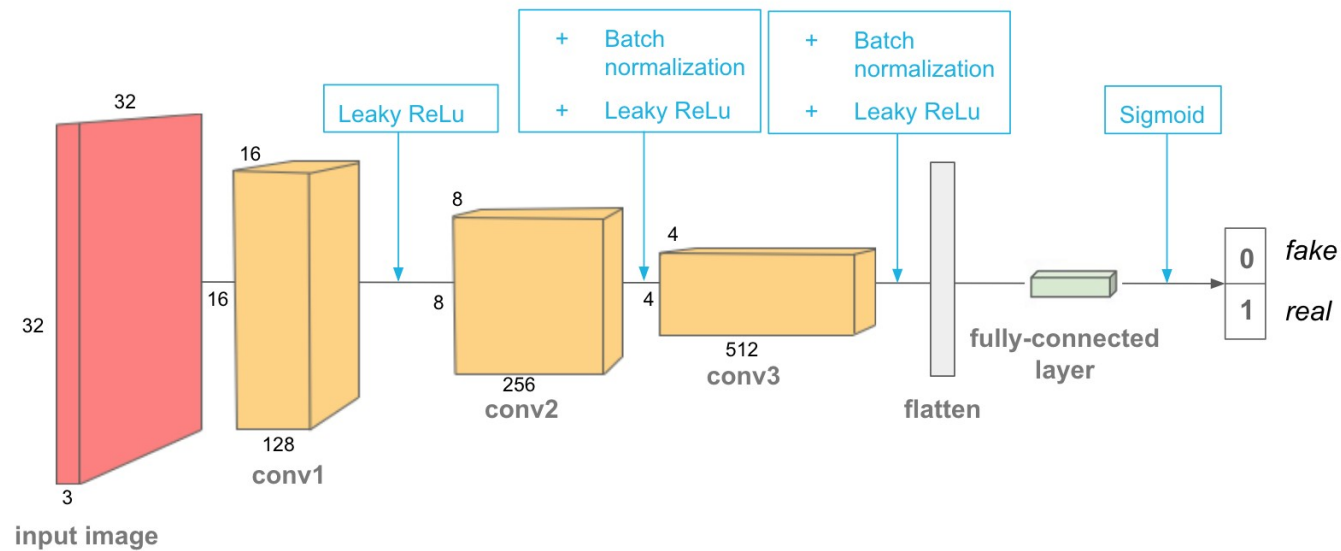
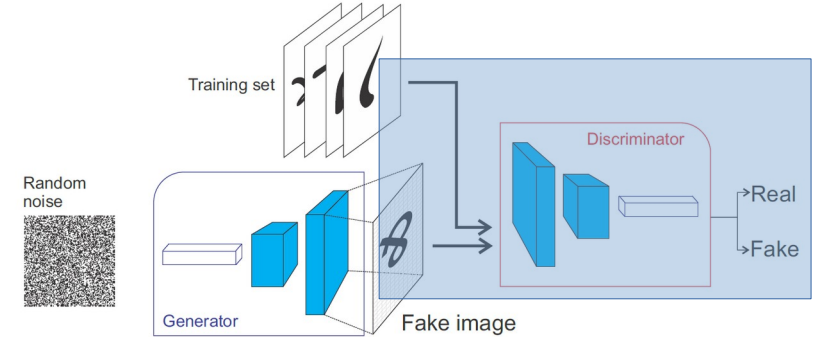
# Deep Generative Model

- De-Convolutional Layers (upsampling)
  - Noise to Fake Image



# Discriminator Model

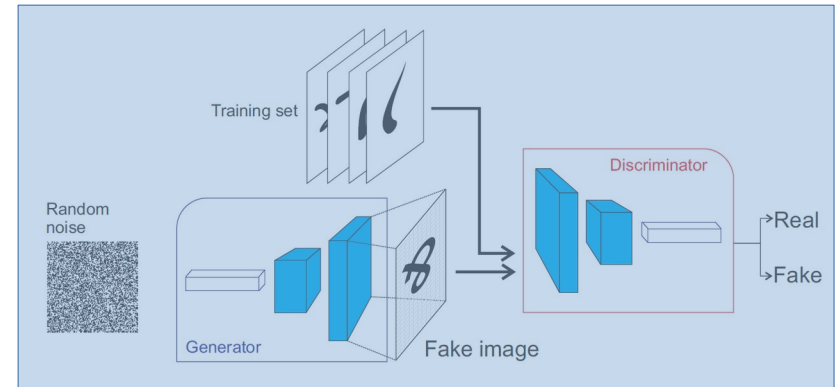
- Classification: Fake or Real
  - CNN



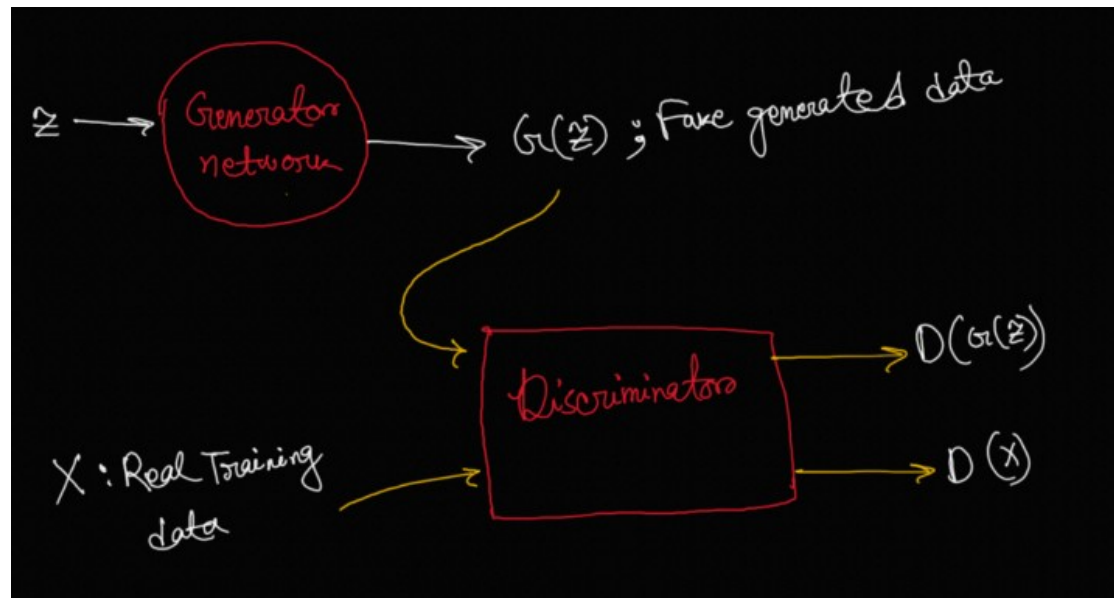


# Adversarial Training

- Adversarial Loss (Min-Max)
  - Minimize Generator
  - Maximize Discriminator

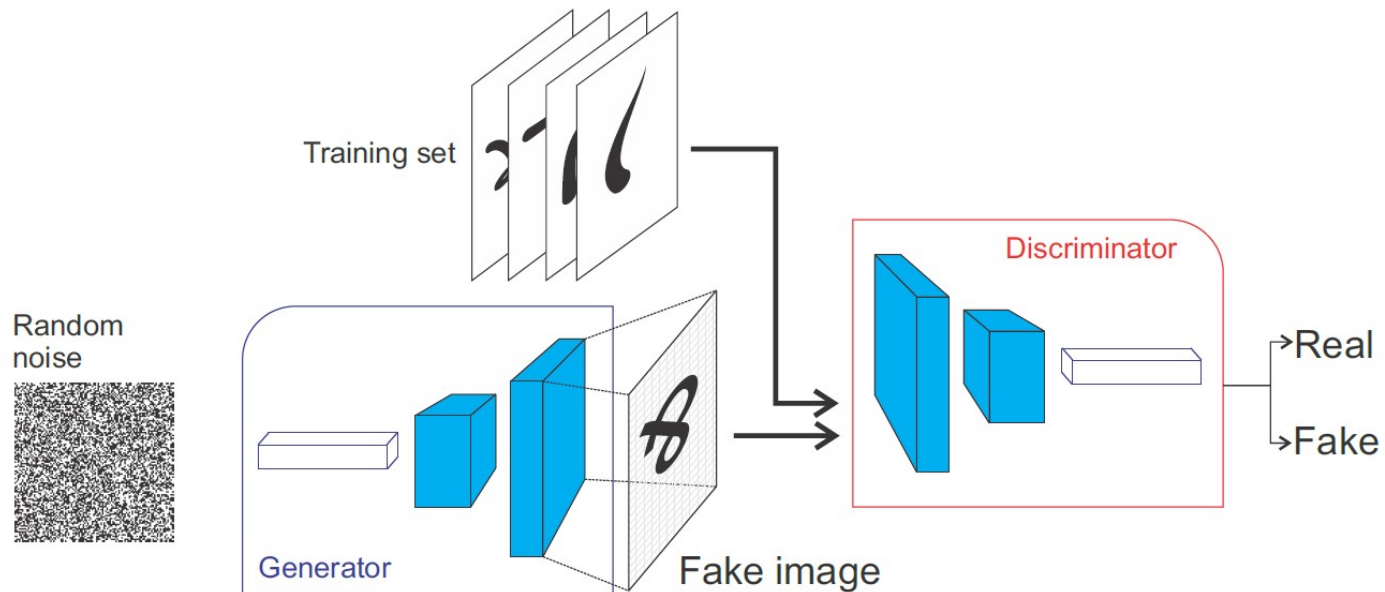


$$\min_G \max_D V(D, G) = \mathbb{E}_{x \sim p_{data}} [\log D(x)] + \mathbb{E}_{z \sim p_z(z)} [\log(1 - D(G(z)))]$$



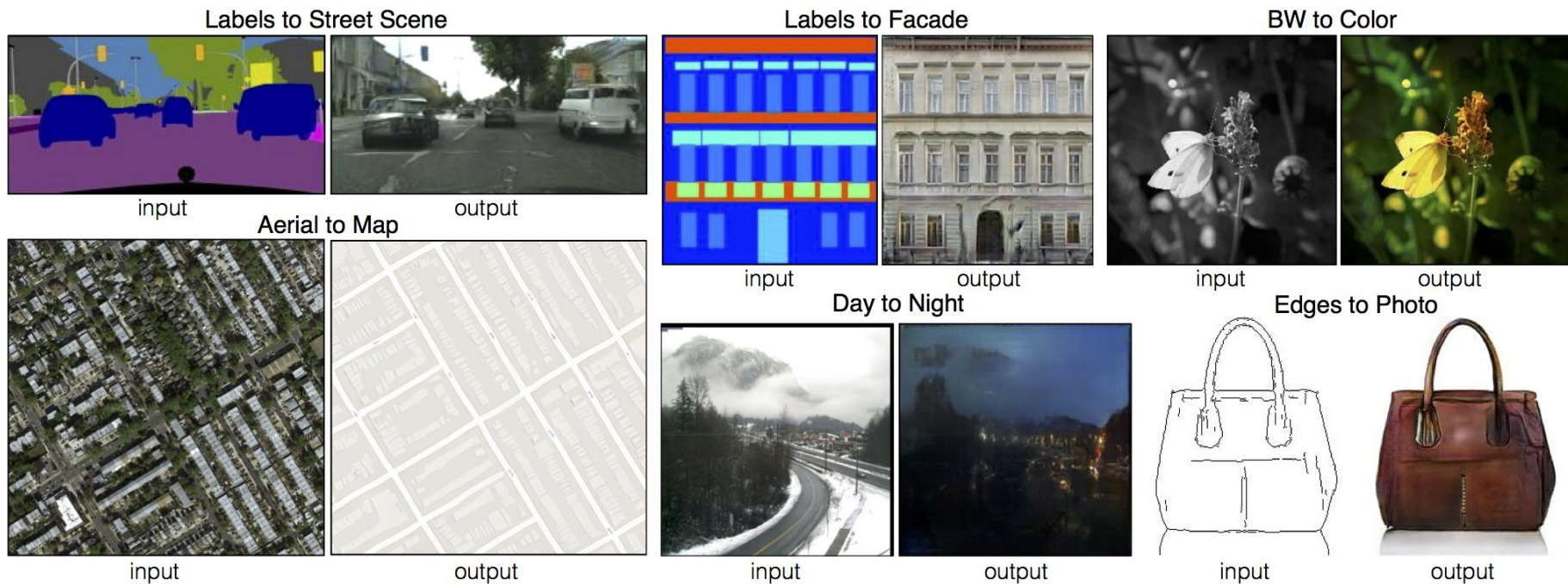
# Let's Code

- [LINK: Lecture\\_12-DCGAN.ipynb](#)



# Pix2Pix

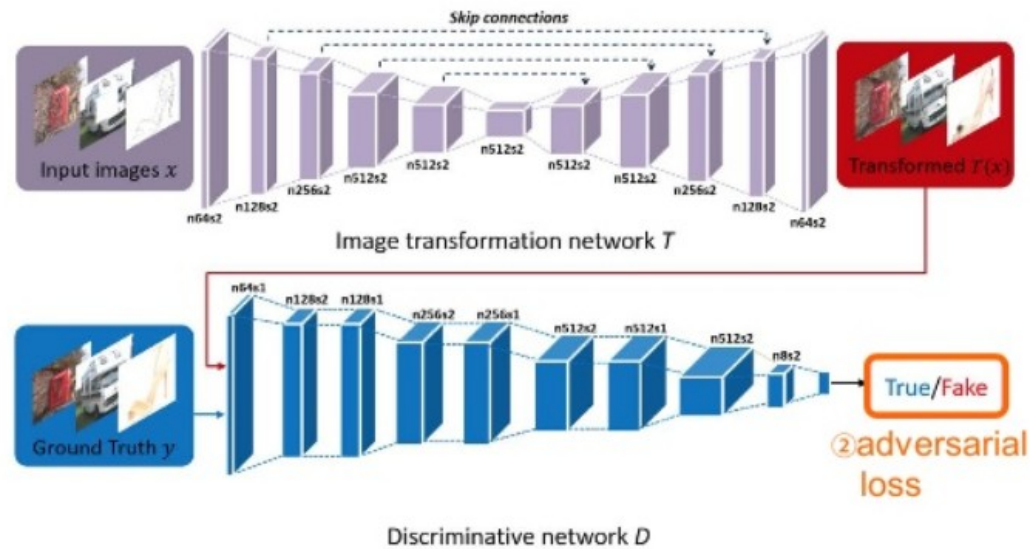
- Image-Translation



# Pix2Pix

- Generative Model: Encoder-Decoder Architecture (i.e U-Net)
- Paired Annotated Dataset

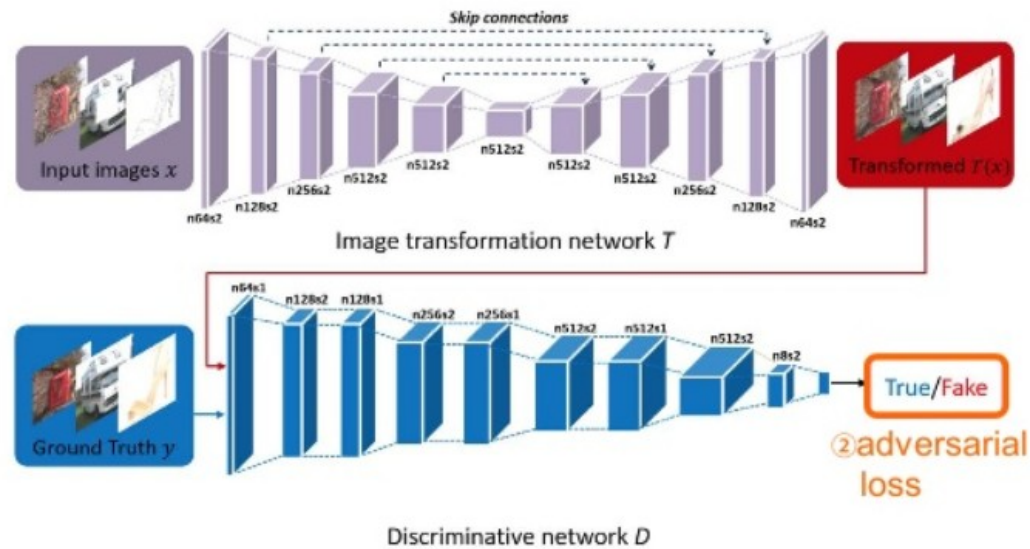
## Pix2Pix (①+②)



# Let's Code

- [LINK: Lecture\\_12-pix2pix.ipynb](#)

## Pix2Pix (①+②)



# Course Final Remarks

- 12 Lectures / Topics
  - Image Processing
  - Image Segmentation
  - Image Classification
    - Feature Extraction
    - Shallow Classification
  - Deep Learning
    - Classification
    - Segmentation
    - GANs
- 04 assessment tasks
  - License Plate Segmentation
  - Simpsons Classification (Shallow Based Models)
  - Simpsons Classification (CNN Based)
  - Simpsons Bart2Homer (GANs based)