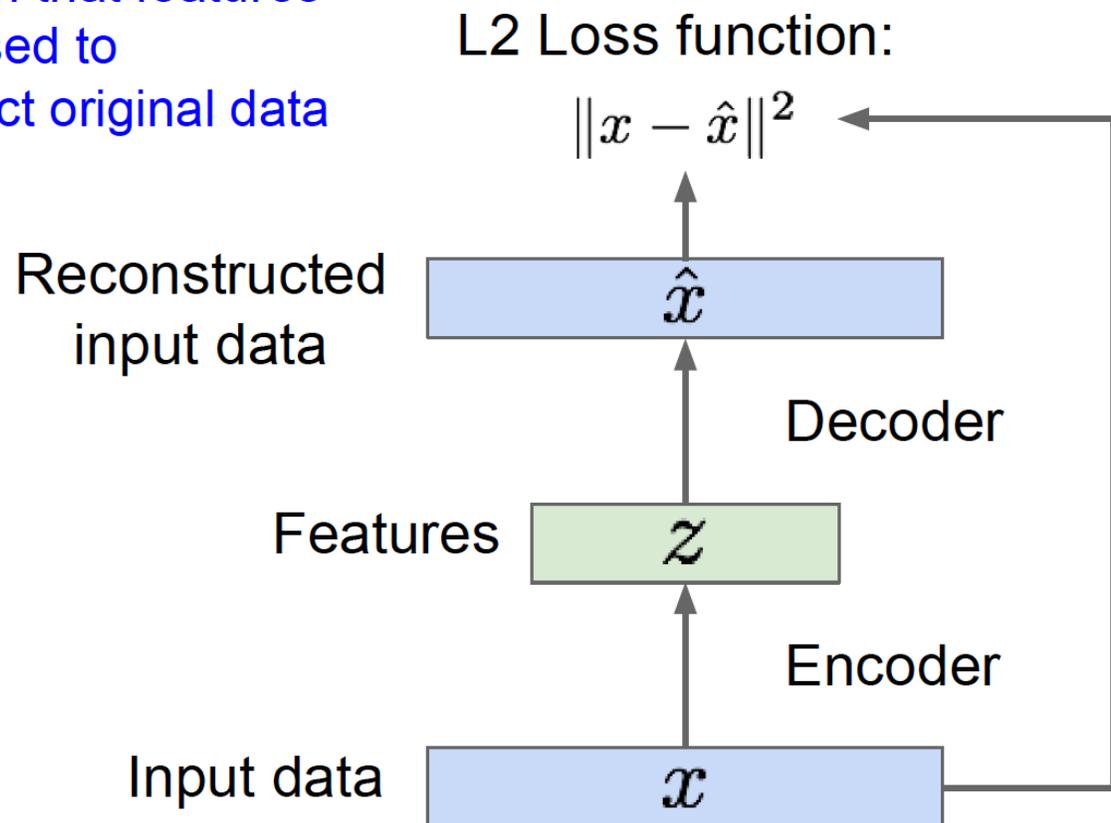


Generative Adversarial Networks (GANs)

Bindita Chaudhuri

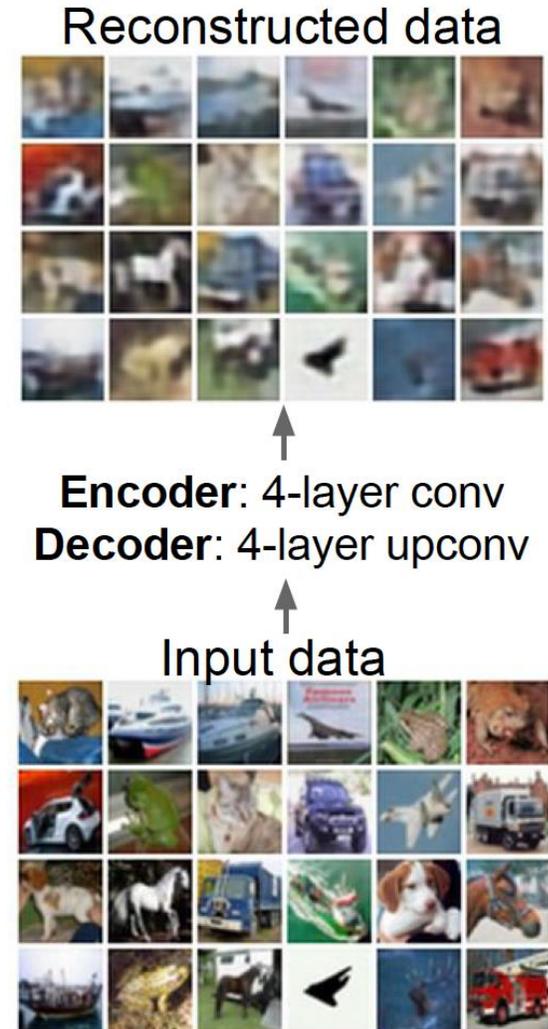
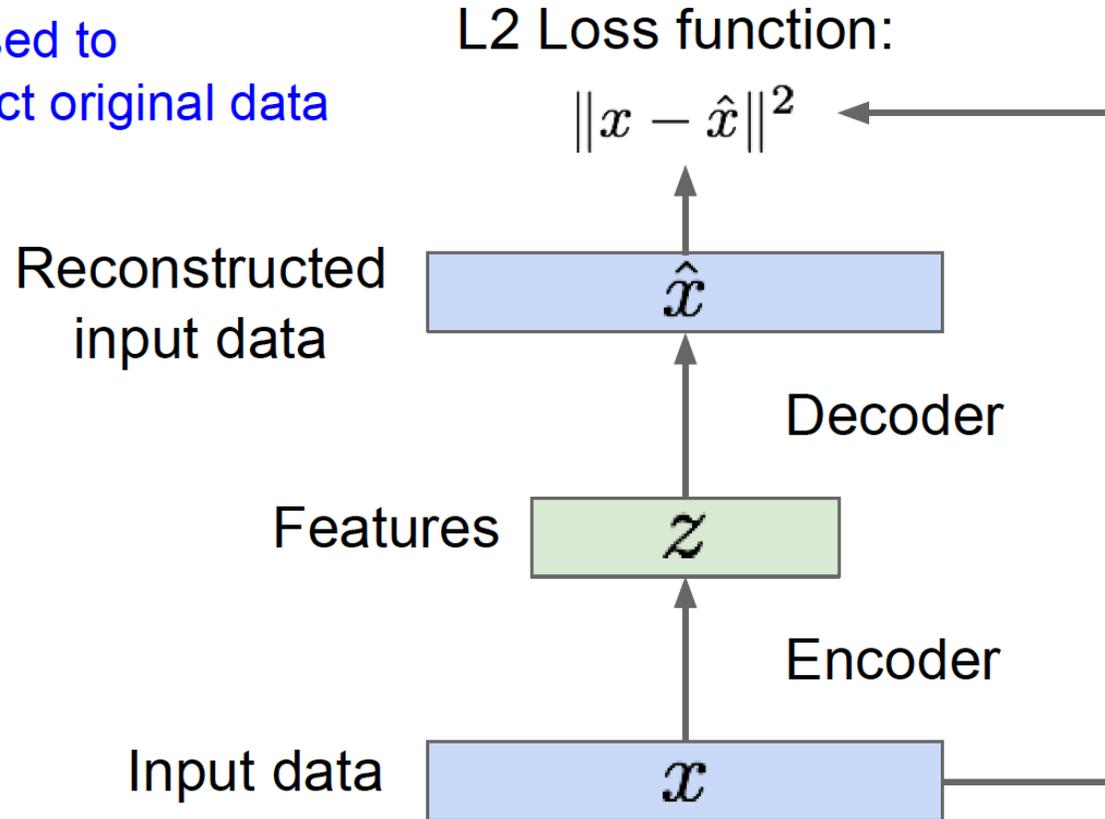
Unsupervised Learning: Autoencoders

Train such that features
can be used to
reconstruct original data

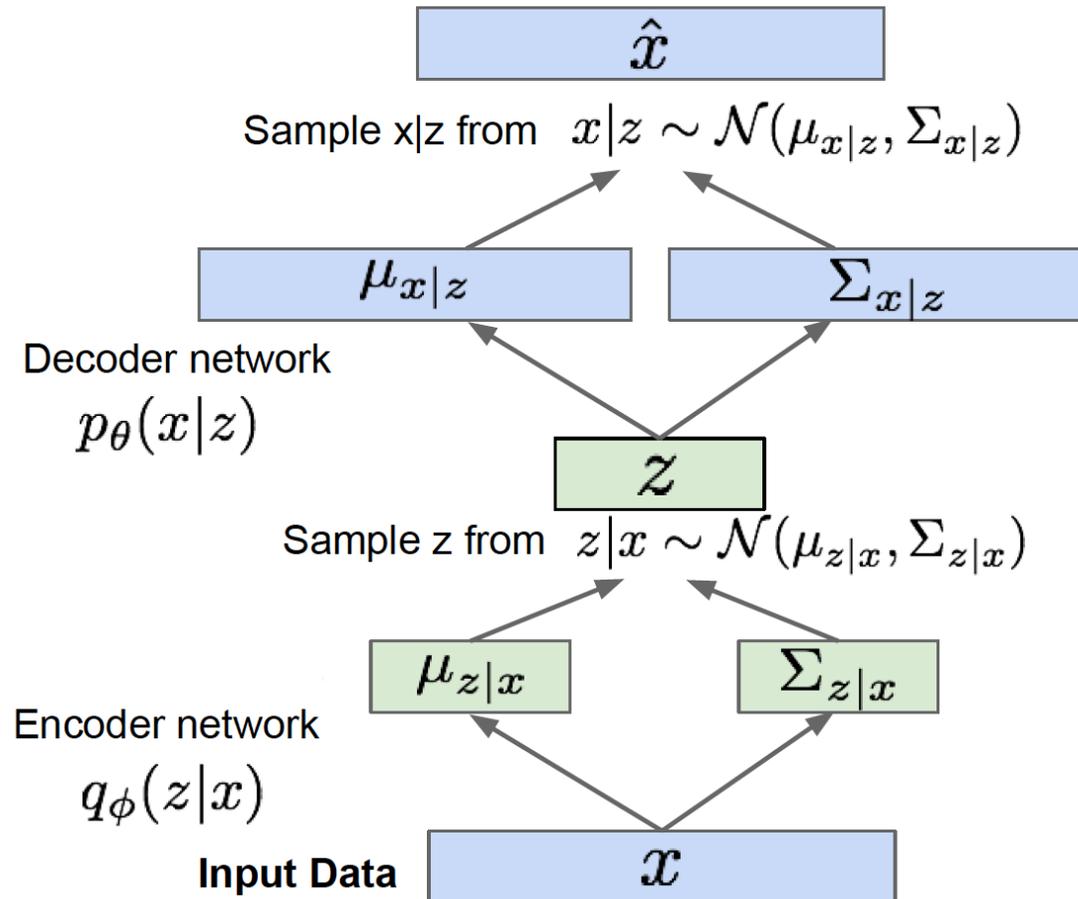


Unsupervised Learning: Autoencoders

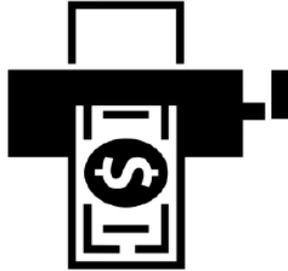
Train such that features can be used to reconstruct original data



Unsupervised Learning: Variational Autoencoders



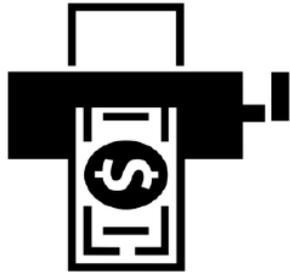
Generative Adversarial Networks: Idea



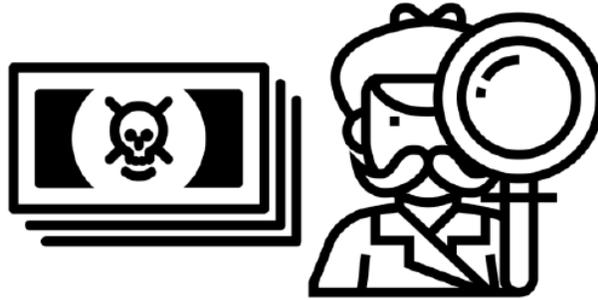
Generator

(Counterfeiter):
Creates fake data
from random
input

Generative Adversarial Networks: Idea



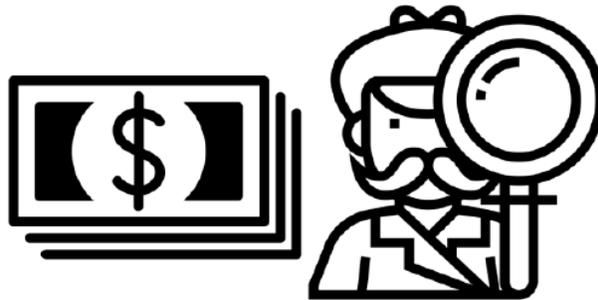
Generator
(Counterfeiter):
Creates fake data
from random
input



Discriminator
(Detective): Distinguish
real data from fake
data

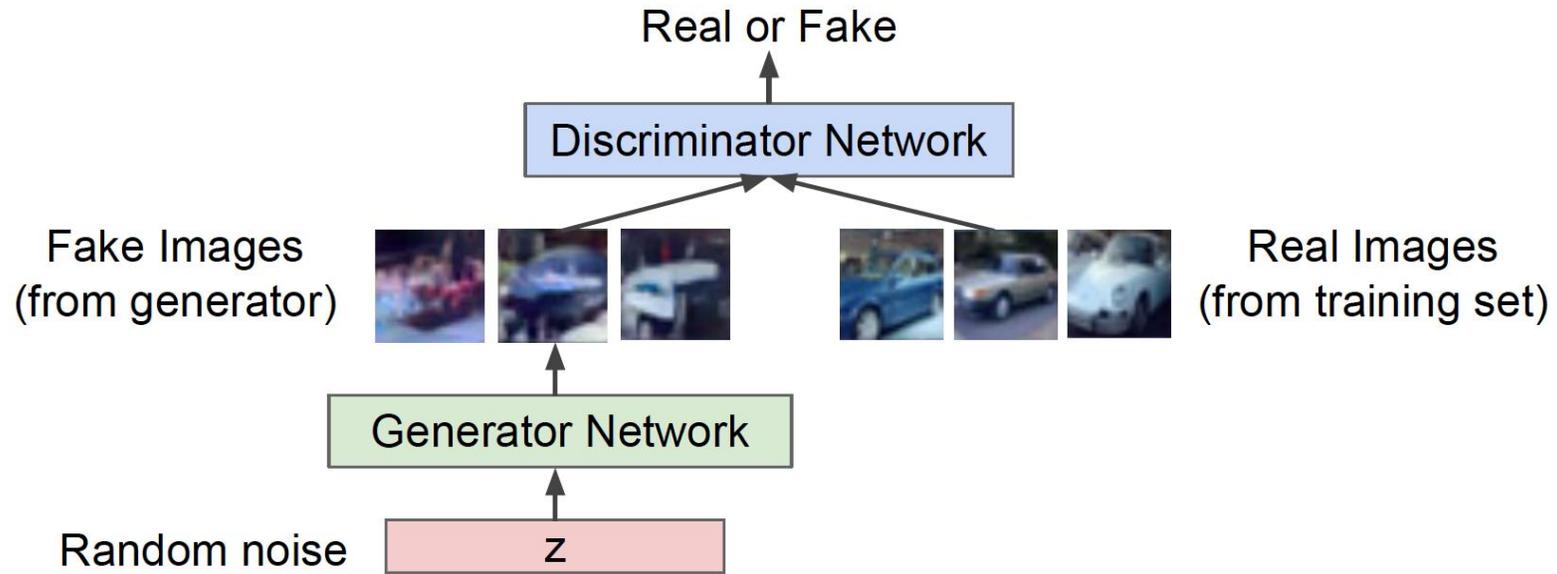


Looks Fake!

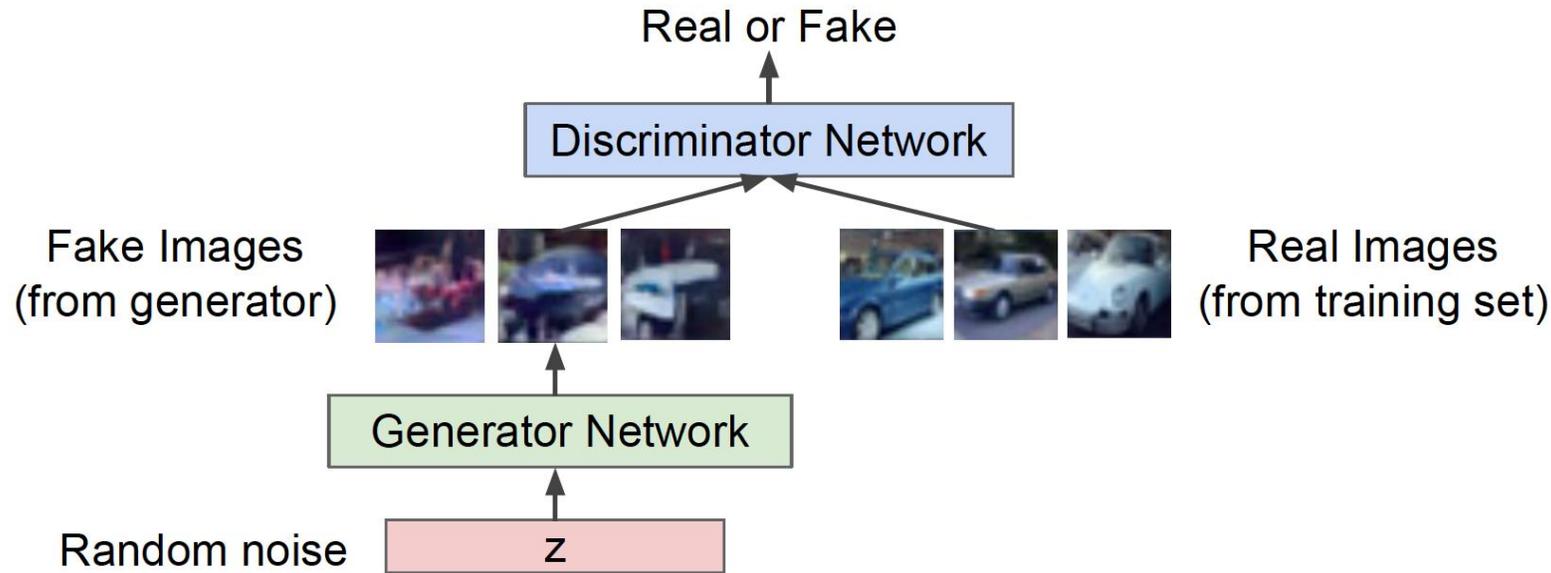


Looks Real!

Generative Adversarial Networks



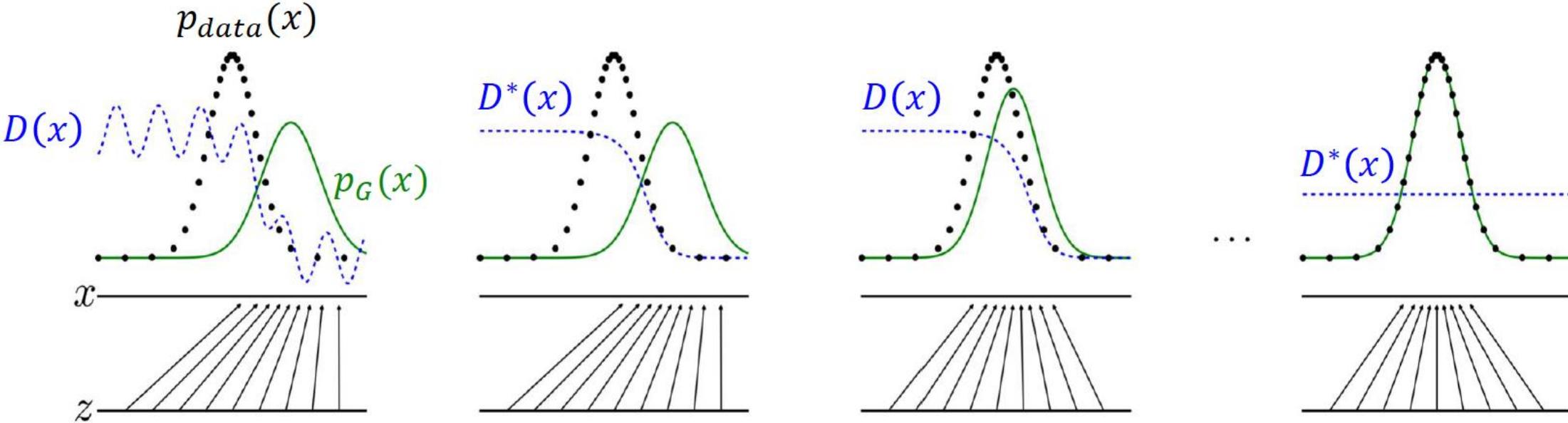
Generative Adversarial Networks



Minimax objective function:

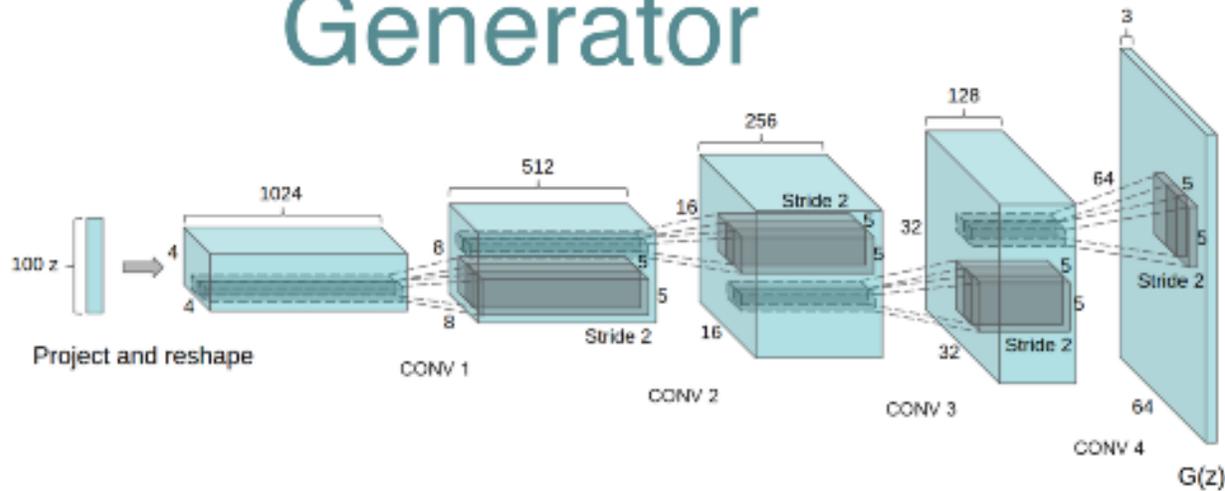
$$\min_{\theta_g} \max_{\theta_d} \left[\mathbb{E}_{x \sim p_{data}} \log \underbrace{D_{\theta_d}(x)}_{\substack{\text{Discriminator output} \\ \text{for real data } x}} + \mathbb{E}_{z \sim p(z)} \log \left(1 - \underbrace{D_{\theta_d}(G_{\theta_g}(z))}_{\substack{\text{Discriminator output for} \\ \text{generated fake data } G(z)}} \right) \right]$$

Distributions during training

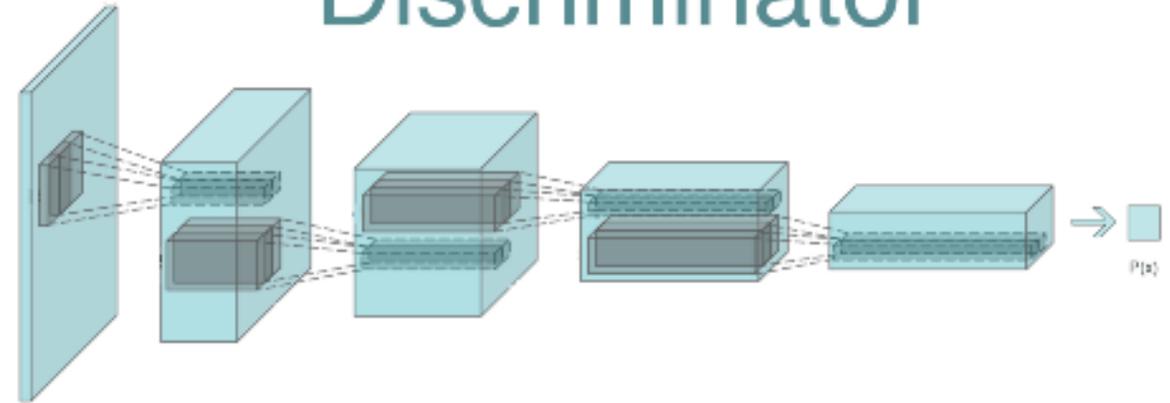


GAN: Sample Architecture (DC-GAN)

Generator

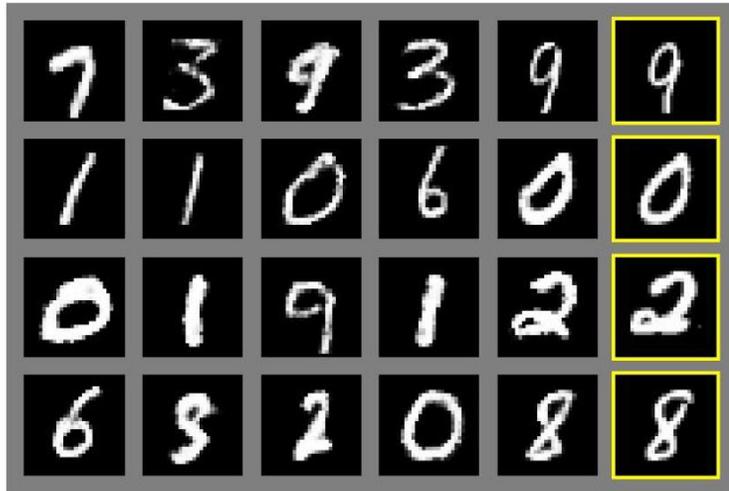


Discriminator



Generated Samples

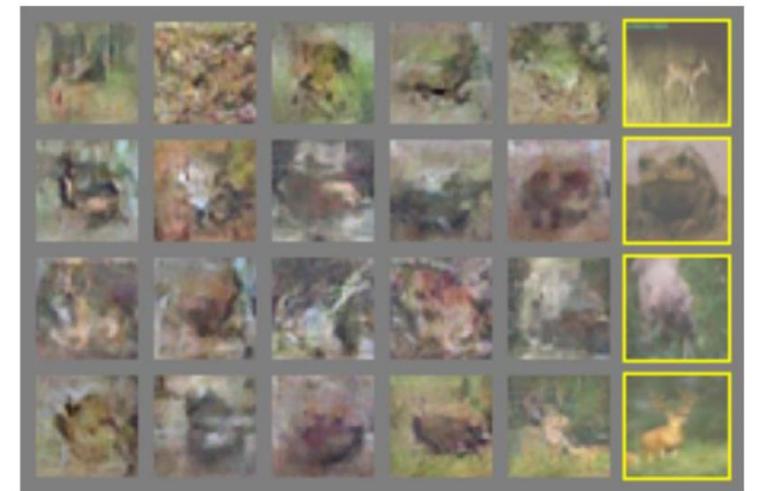
MNIST



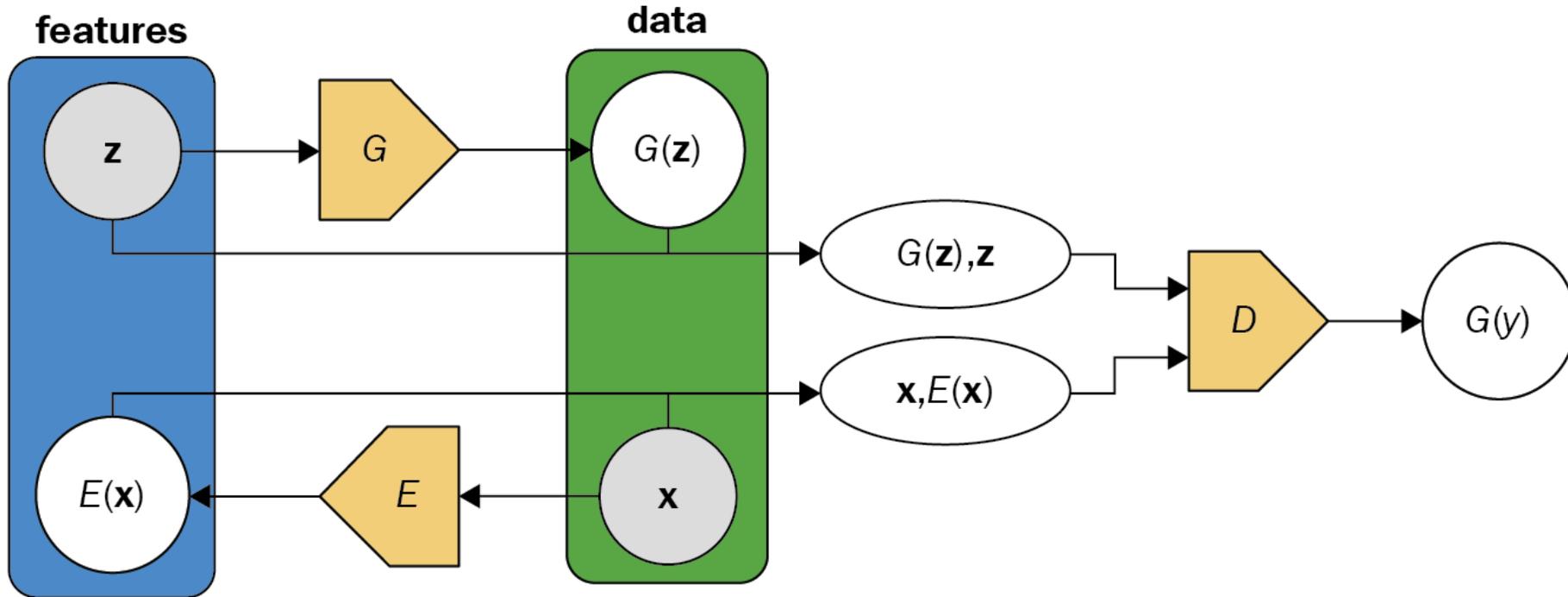
Faces



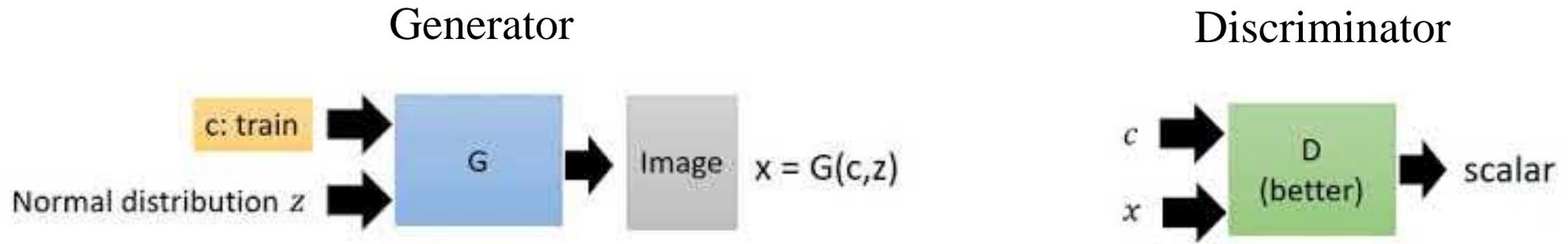
CIFAR 10



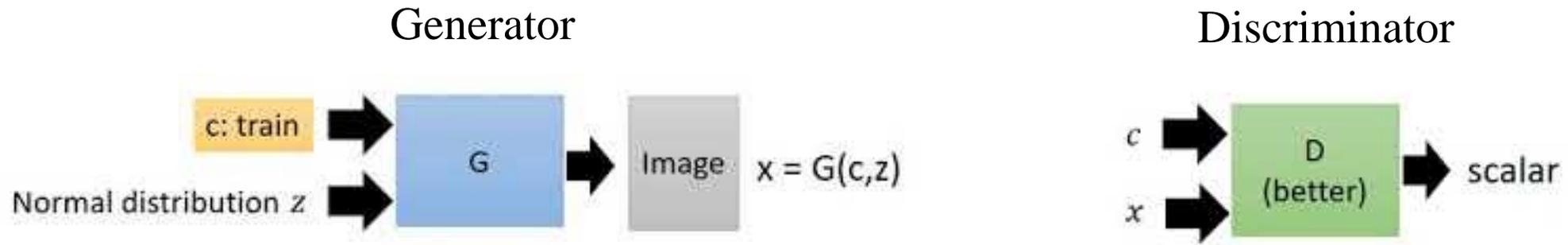
Bidirectional GAN (BiGAN)



Conditional GAN (cGAN)



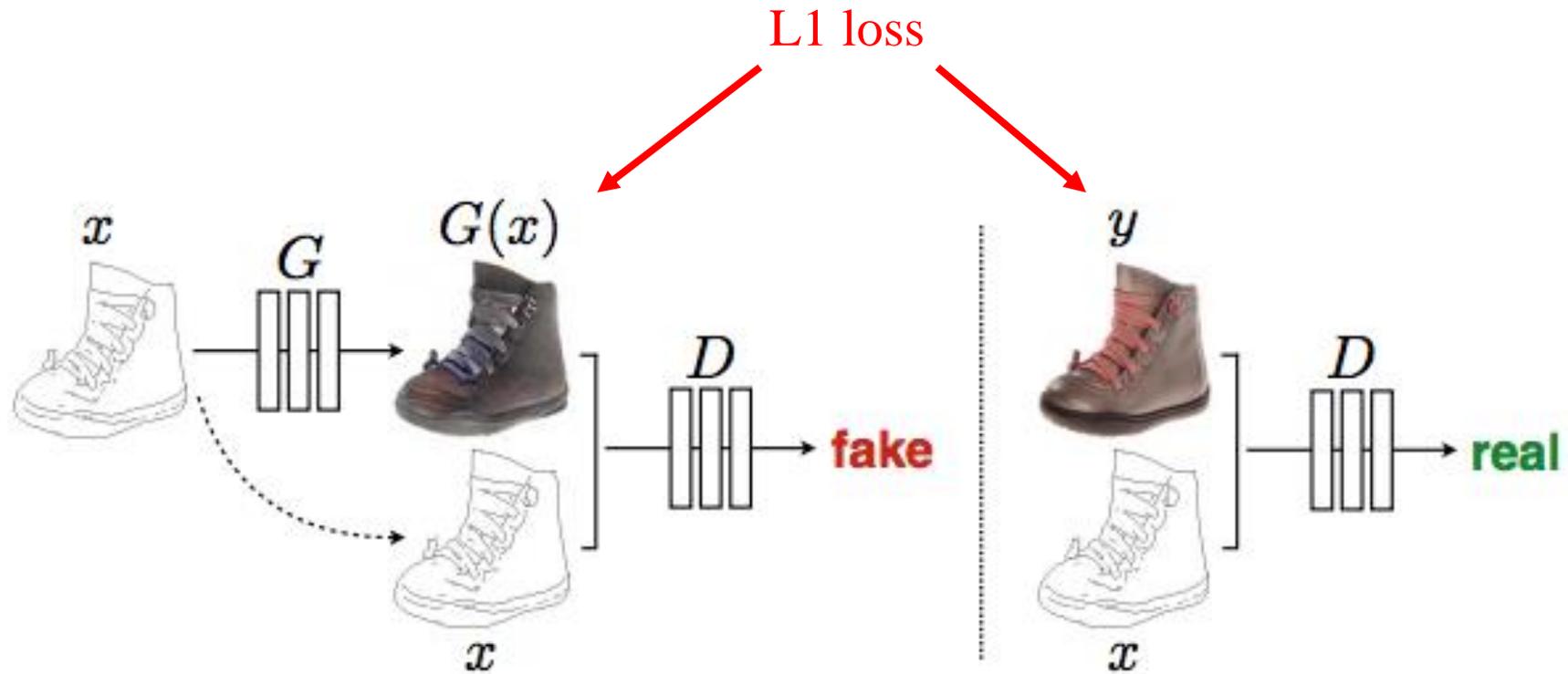
Conditional GAN (cGAN)



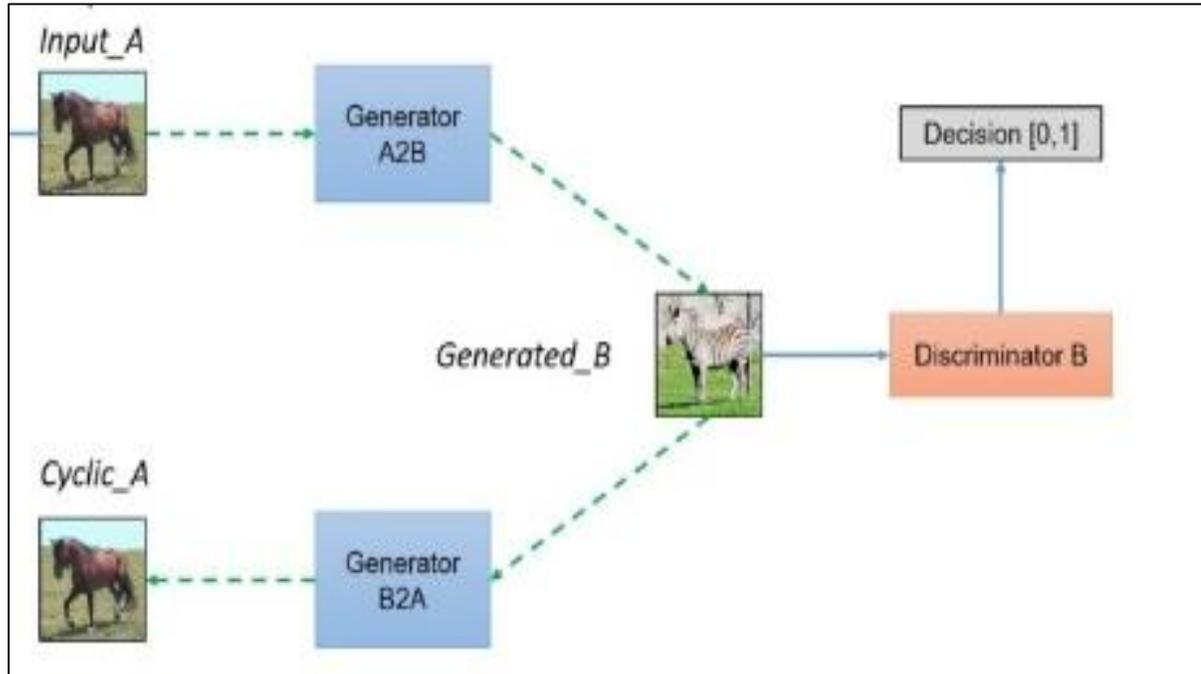
True text-image pairs: (train, ) 1

(cat, ) 0 (train, ) 0

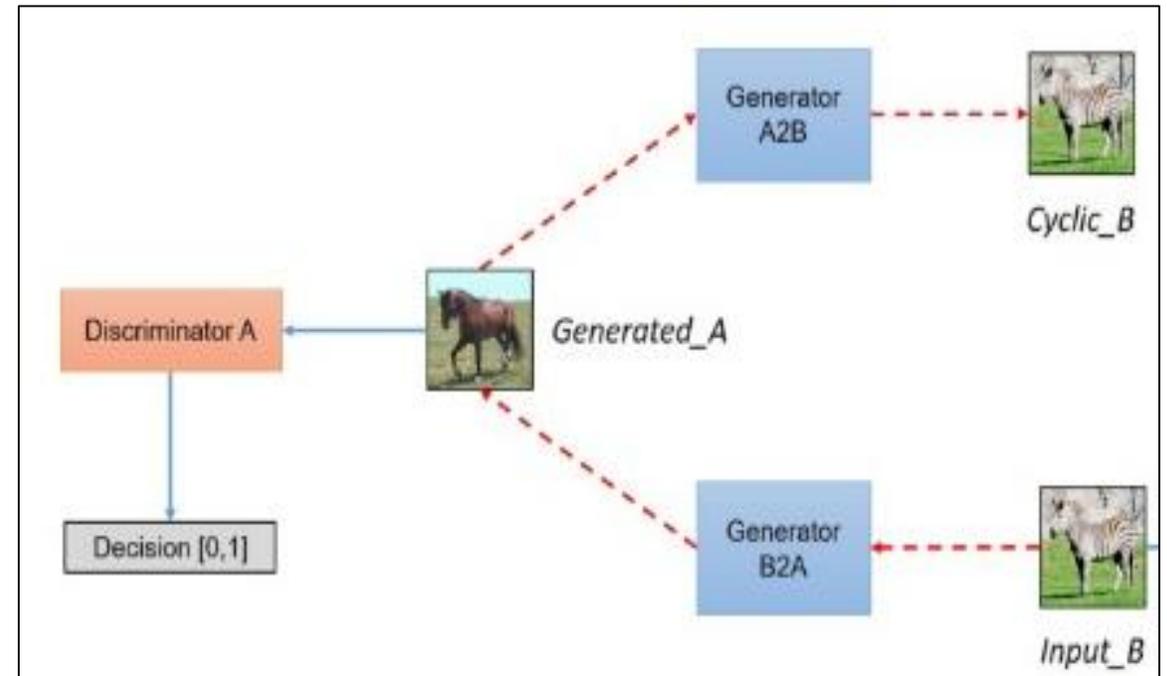
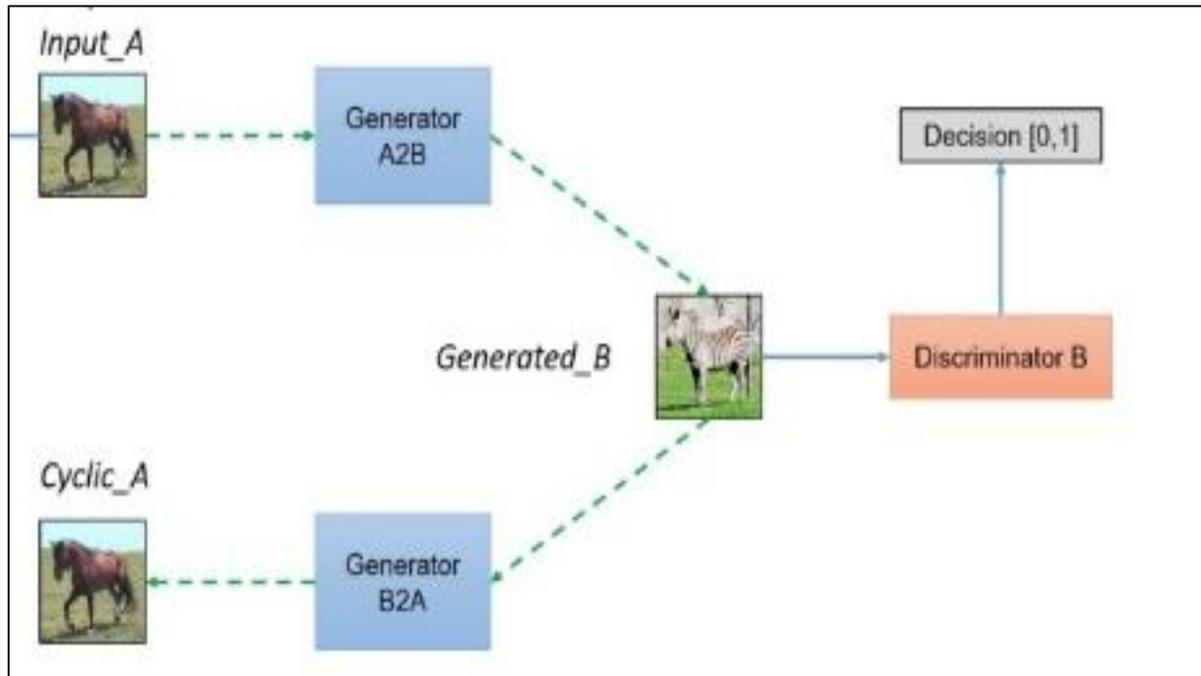
Pix2Pix: Type of cGAN



CycleGAN: Unsupervised Pix2Pix



CycleGAN: Unsupervised Pix2Pix



CycleGAN Results

Monet ↔ Photos



Monet → photo



photo → Monet

Zebras ↔ Horses



zebra → horse



horse → zebra

Summer ↔ Winter

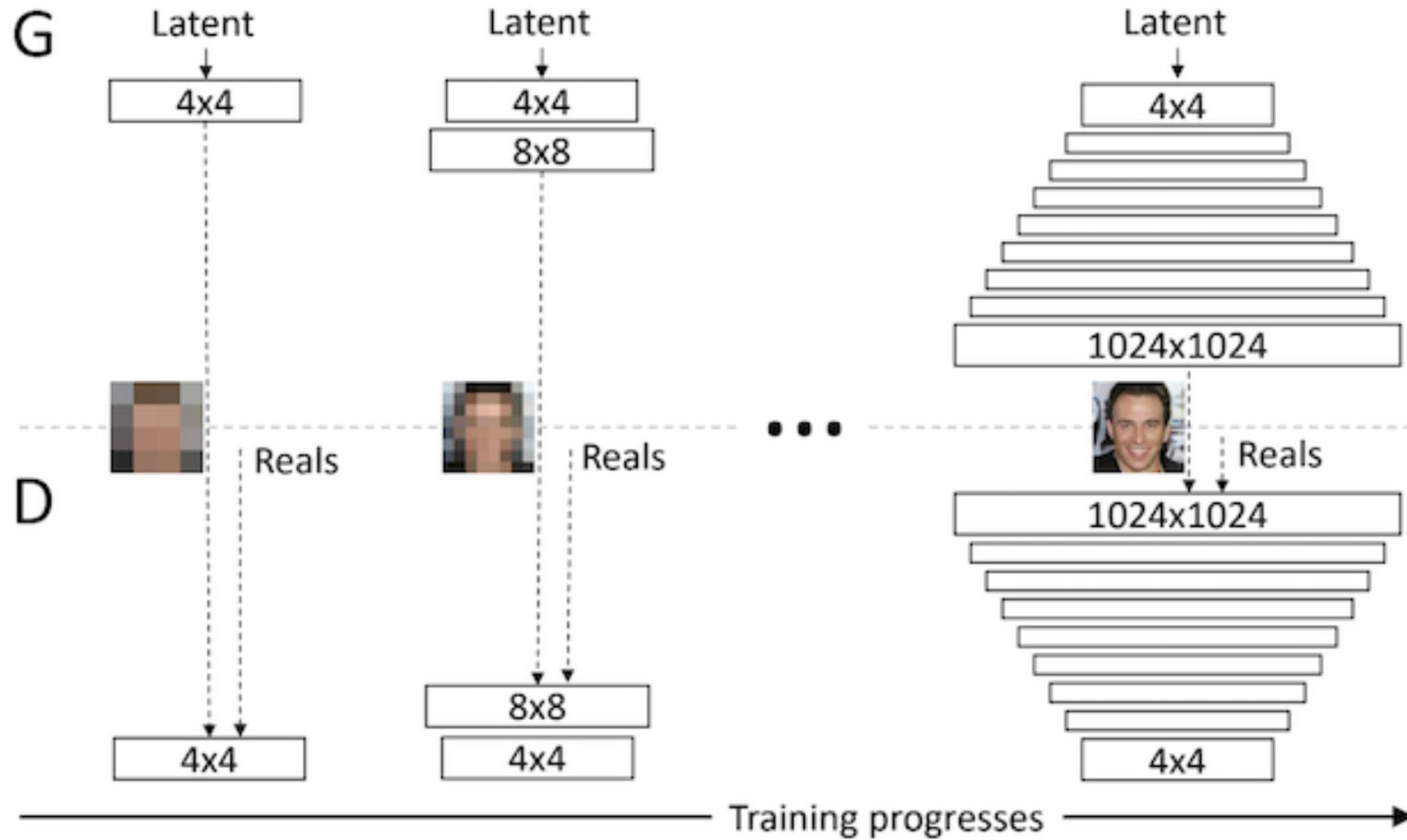


summer → winter



winter → summer

Progressive Growing of GANs



Progressive GAN Results



Celebrities

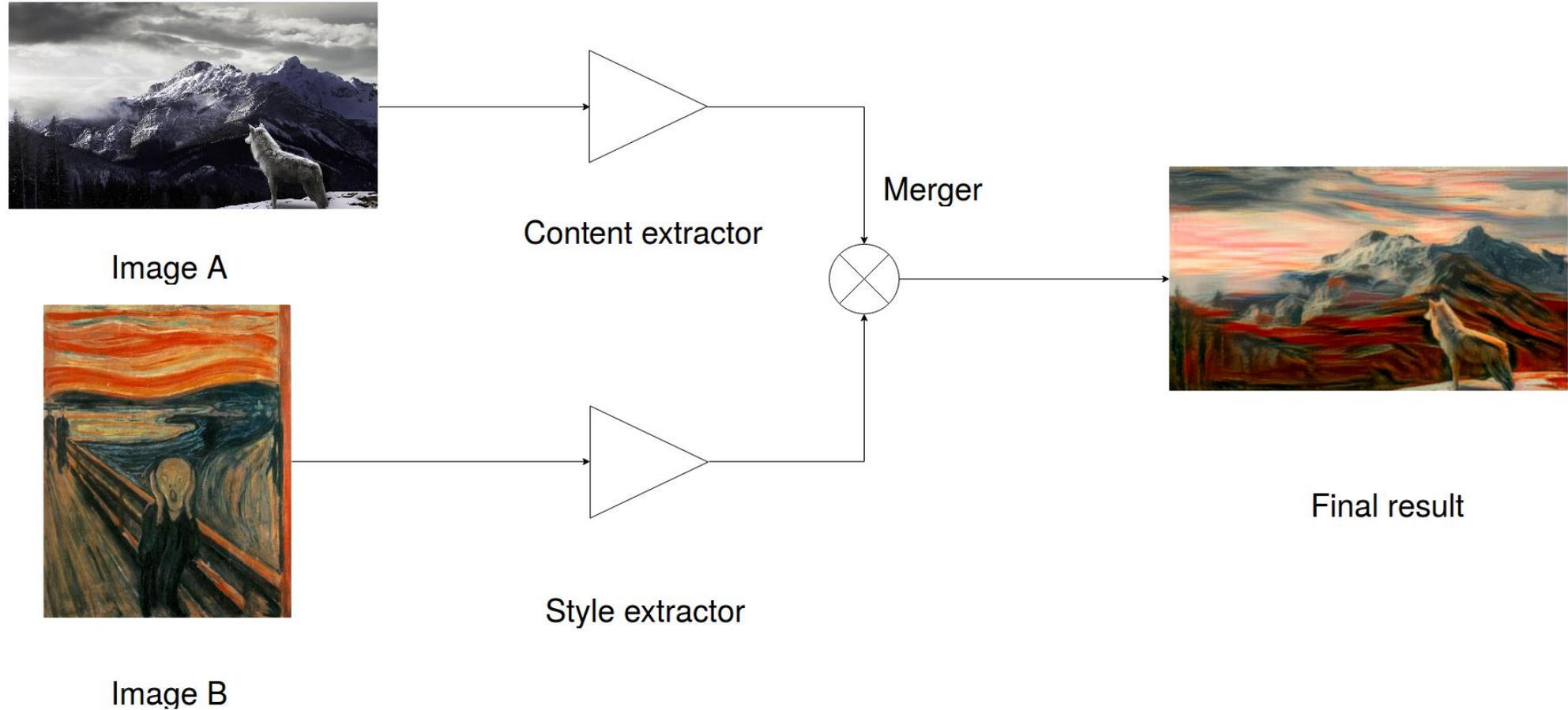


Bedrooms



Objects

Application: Neural Style transfer



Application: 3D GAN

