Generative Models

"What I cannot create, I do not understand."

- Richard Feynman

Most Common Example: Generating Images



Three popular approaches

Generative Adversarial Networks (GANs)

A gamified approach that pits two networks against each other

Variational Autoencoders (VAEs)

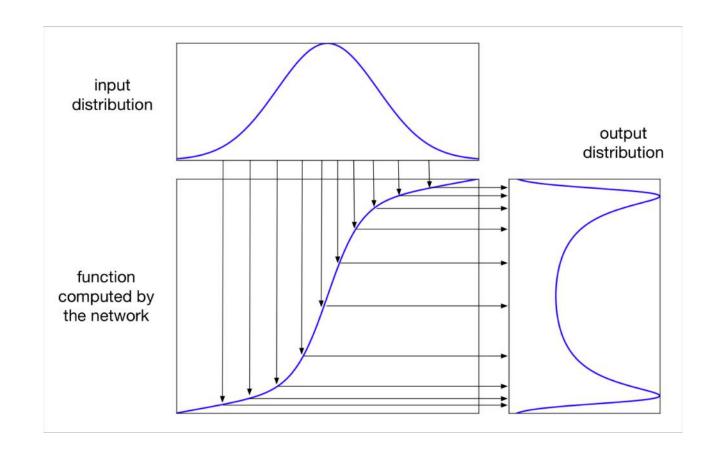
Based on probabilistic graphical models

Autoregressive models

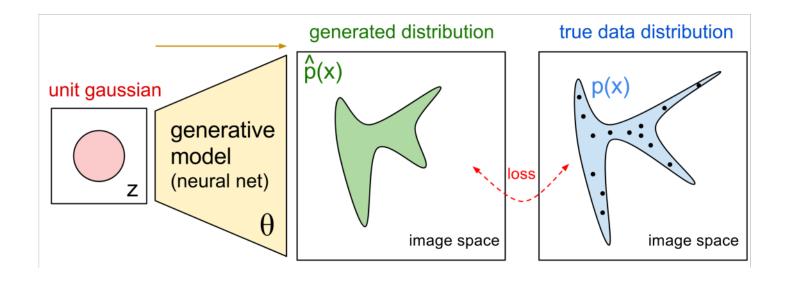
Model the conditional distribution of every individual pixel given previous pixels

Implicit Generative Models

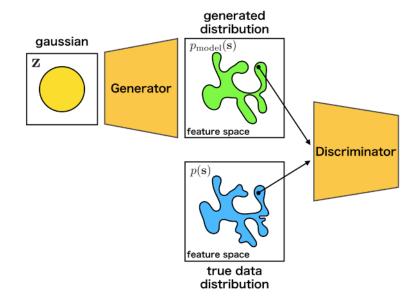
- These models try to implicitly define a probability distribution.
- One starts by sampling a random code vector from some simple fixed distribution (e.g. a Gaussian); this is often called the latent space.
- Some generator then maps this input vector into a vector that is part of the desired target distribution.



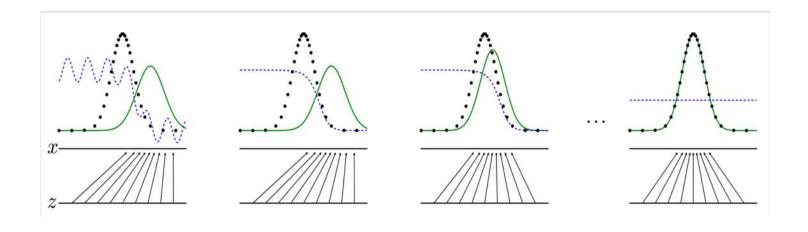
https://www.cs.toronto.edu/~rgrosse/courses/csc321_2018/slides/lec19.pdf



Generative Adversarial Networks (GAN)

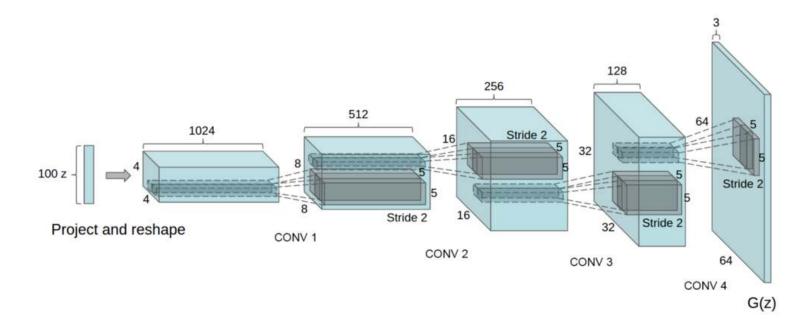


Loss Function



That particular network architectures results in the KL-divergence as the loss function. This is a measure of how well one probability distribution is different from a second one.

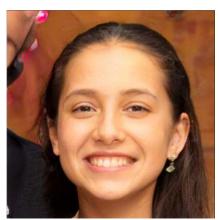
Generative Adversarial Networks (GAN)













https://thispersondoesnotexist.com/

StyleGAN



https://github.com/NVlabs/stylegan

True Images



Find in latent space

True Images



Less smile More smile

GAN Zoo

- 3D-ED-GAN Shape Inpainting using 3D Generative Adversarial Network and Recurrent Convolutional Networks
- 3D-GAN Learning a Probabilistic Latent Space of Object Shapes via 3D Generative-Adversarial Modeling (github)
- 3D-IWGAN Improved Adversarial Systems for 3D Object Generation and Reconstruction (github)
- 3D-PhysNet 3D-PhysNet: Learning the Intuitive Physics of Non-Rigid Object Deformations
- 3D-RecGAN 3D Object Reconstruction from a Single Depth View with Adversarial Learning (github)
- ABC-GAN ABC-GAN: Adaptive Blur and Control for improved training stability of Generative Adversarial Networks (github)
- · ABC-GAN GANs for LIFE: Generative Adversarial Networks for Likelihood Free Inference
- AC-GAN Conditional Image Synthesis With Auxiliary Classifier GANs