

CS5242 Tutorial

Week11

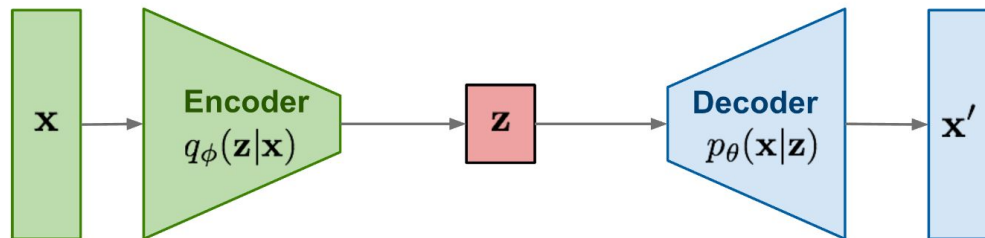
Homework 5

VAE

- VAE(Variational Autoencoder) compress and de-compress video for Sora.



VAE: maximize
variational lower bound

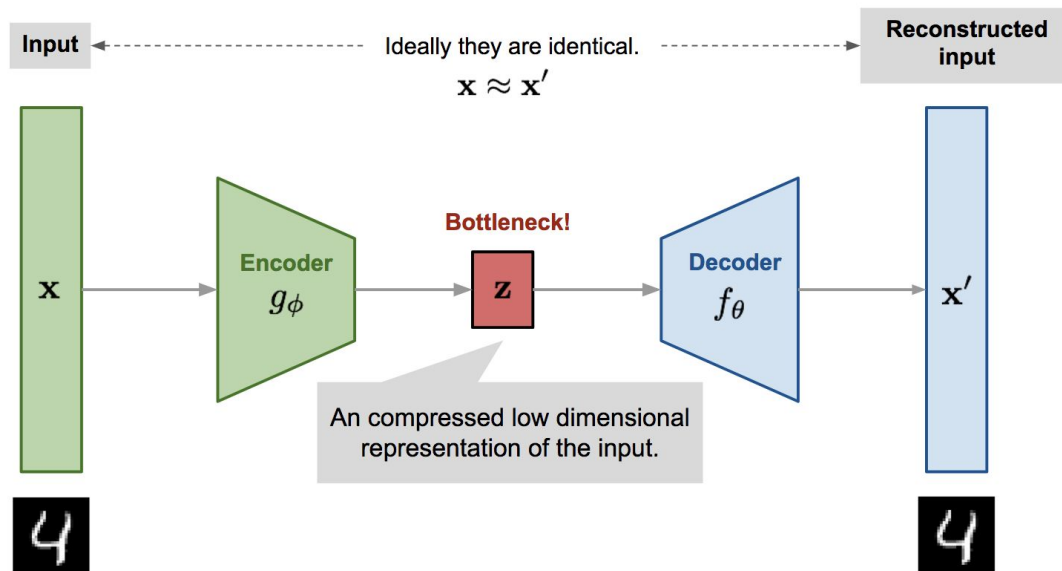


Assignment 4

- Task: Implement AE(Autoencoder) and VAE (Variational Autoencoder) on images.
- DDL: 23:59 11 Apr (in 10 days)
- Tutorial: Introduce AE and VAE

AE

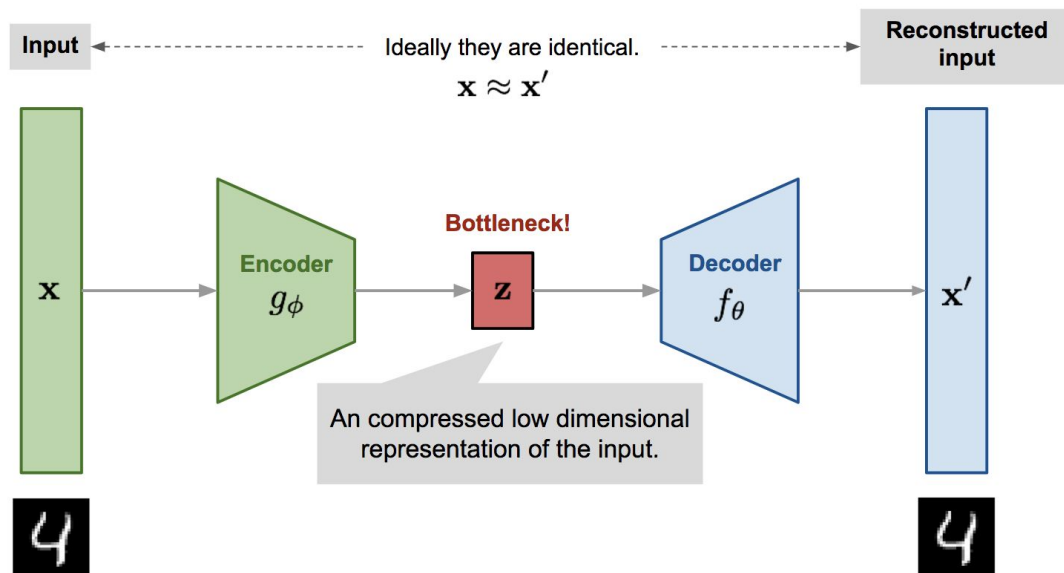
- Autoencoder: An unsupervised method to compress data.
- Encoder: Maps the original high-dimensional data to a lower-dimensional feature space.
- Decoder: Reconstructs the original data based on the compressed low-dimensional features.



AE

- Purpose of decoder: make sure encoder learns important information losslessly
- How to train? -> target: $x' - x = 0$
- Loss function: MSE

$$L_{AE}(\theta, \phi) = \frac{1}{n} \sum_{i=1}^n (\mathbf{x}^{(i)} - f_{\theta}(g_{\phi}(\mathbf{x}^{(i)})))^2$$

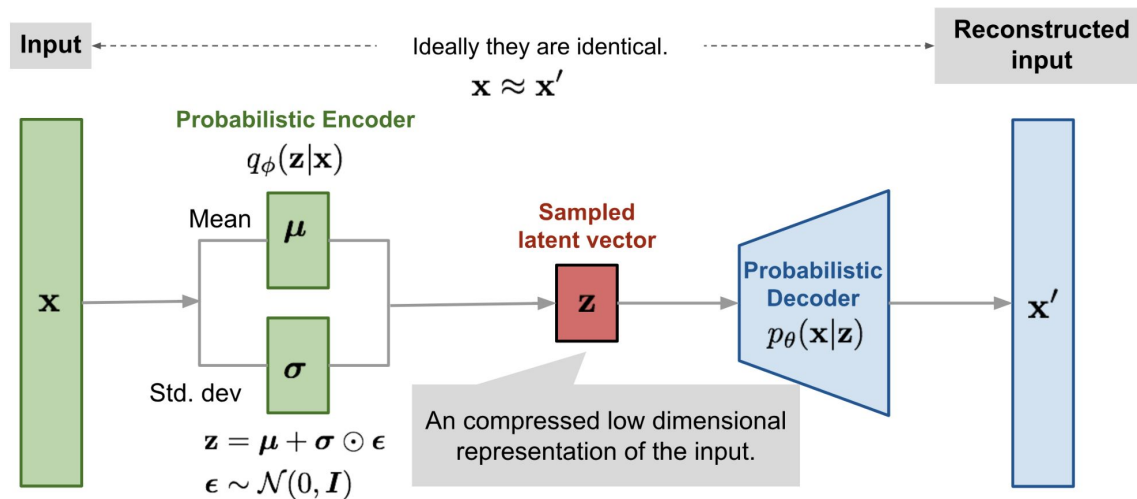


VAE

- AE: compress data
- Problem:
 - Only see images in the training dataset. Poor generalization.
 - Cannot generate new content.
- VAE

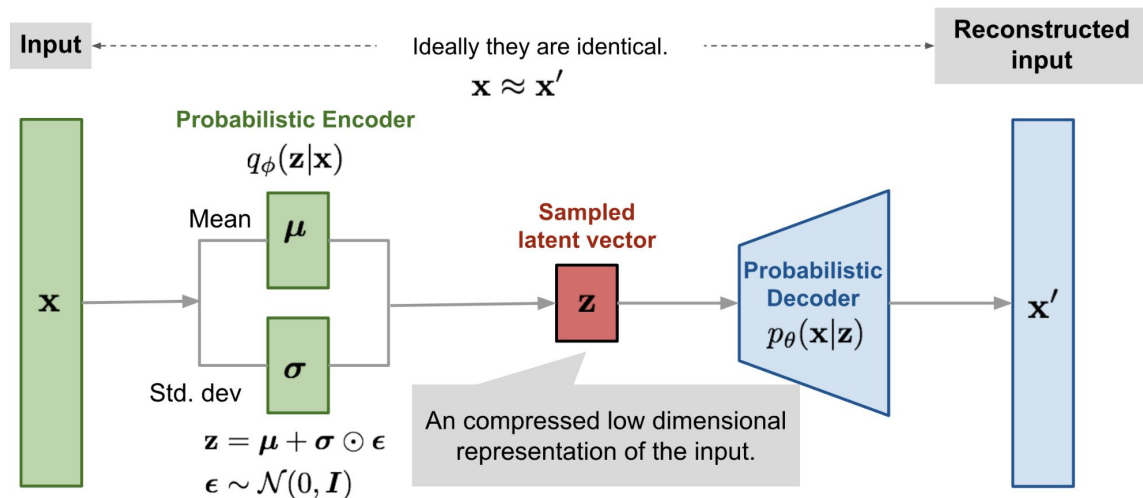
VAE

- VAE: A probabilistic model based on variational inference.
- Intuitive guide in tutorial, more detailed mathmaticic thoery materials are given at page 11.



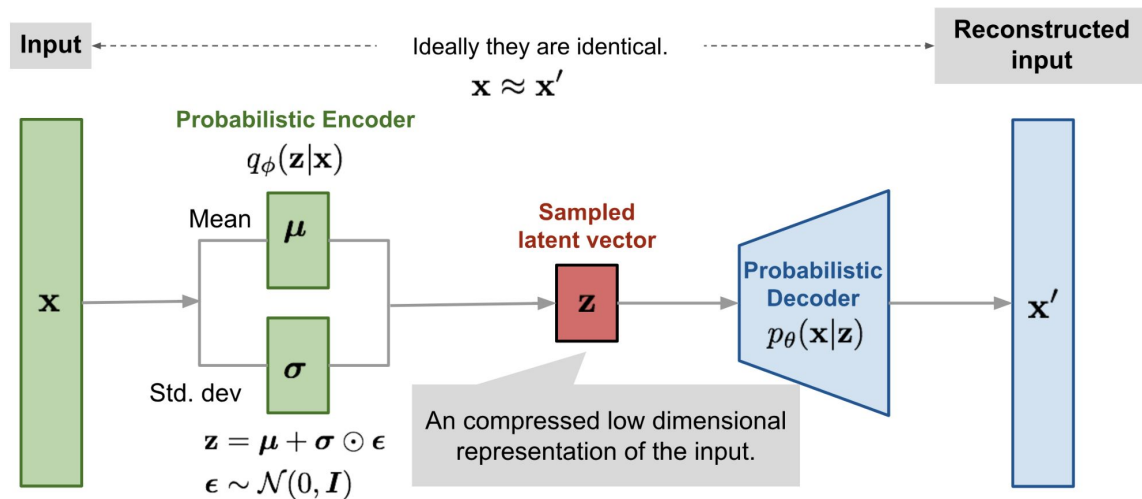
VAE

- Encoder: Sample a Normal distribution from input.
- Decoder: Reconstructs the original data based on latent vector.



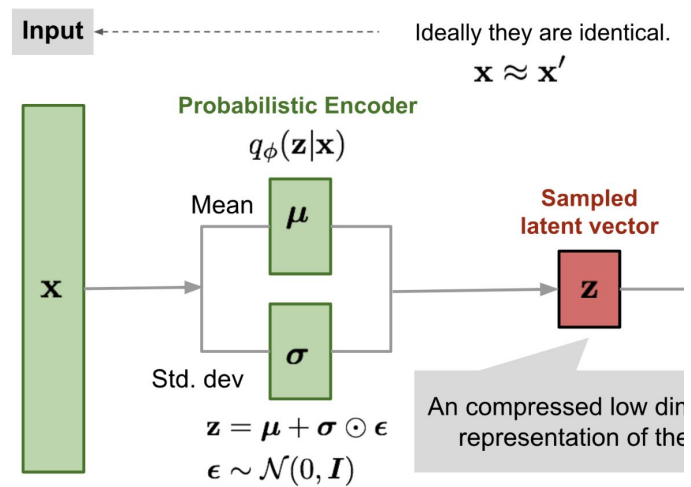
VAE - Encoder

- Generate vector of mean and std based on inputs, apply std on a randomly normal distribution initialized vector, and sum them.



VAE - Encoder

- $z = \text{mean} + \text{std} * N(0,1)$
- mean is the original latent vector in AE
- $\text{std} * N(0,1)$ is the noise
- Benefits:
- force the mean close to $N(0,1)$, so that we can generate images from $N(0,1)$
- learn to reconstruct the image from noise to be more general



VAE

Reading materials:

<https://towardsdatascience.com/understanding-variational-autoencoders-vaes-f70510919f73>

<https://lilianweng.github.io/posts/2018-08-12-vae/>