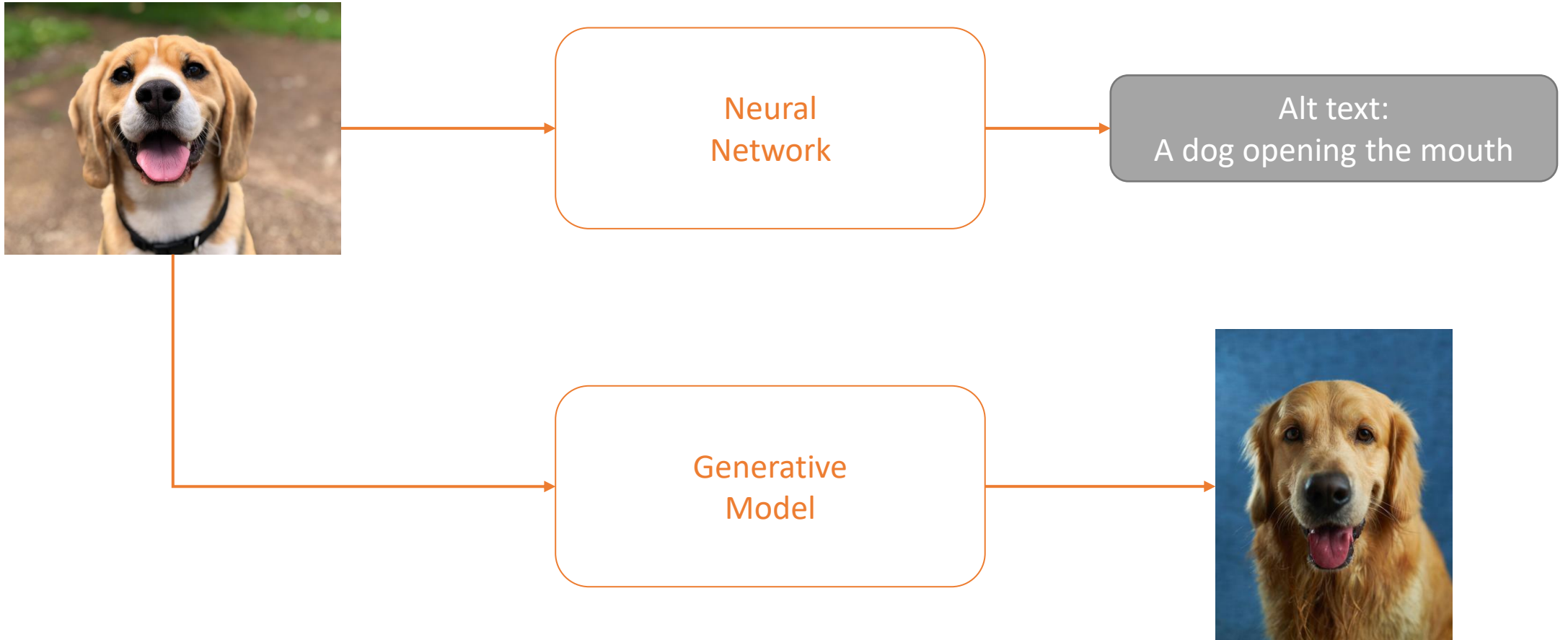
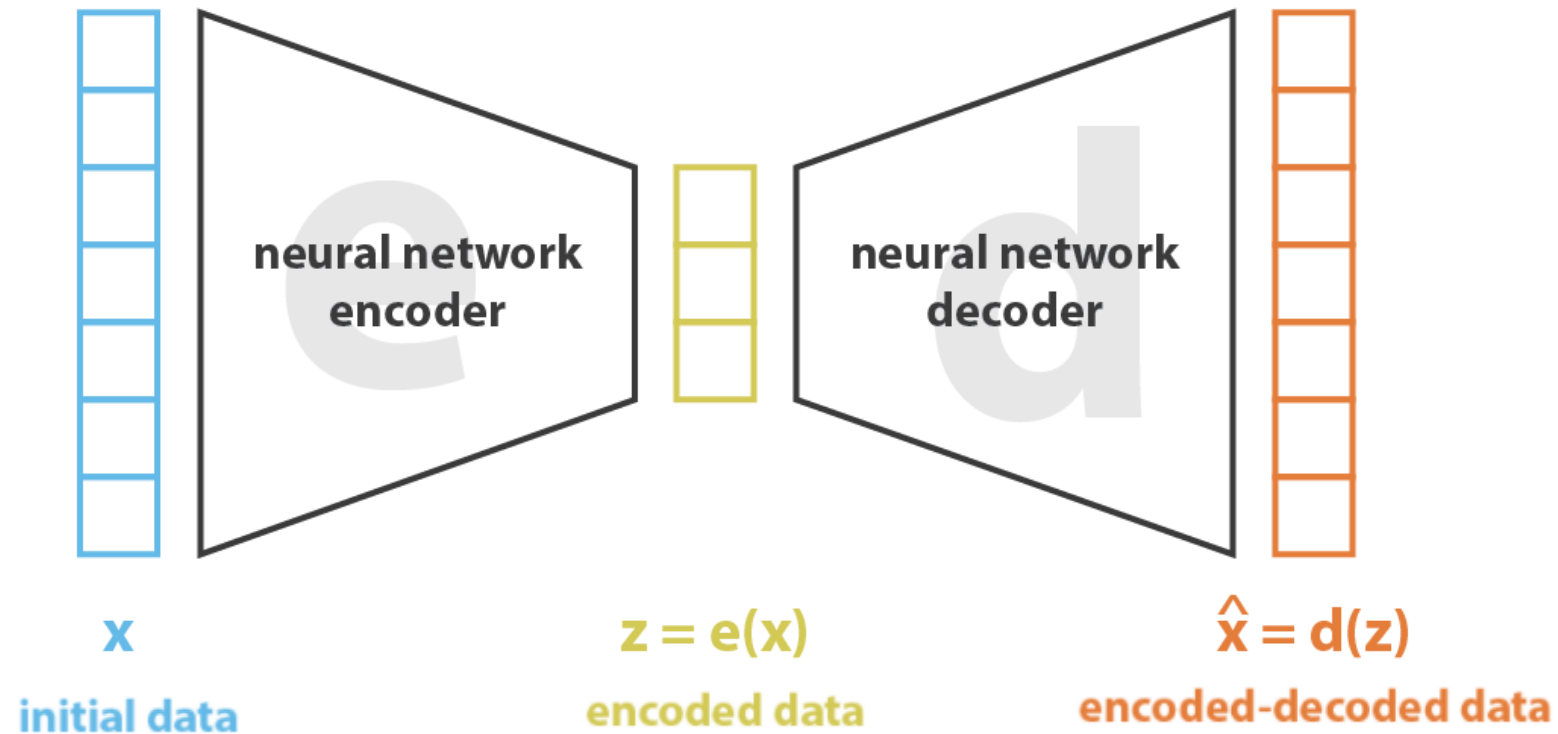


# Variational Autoencoders

# Generative Model



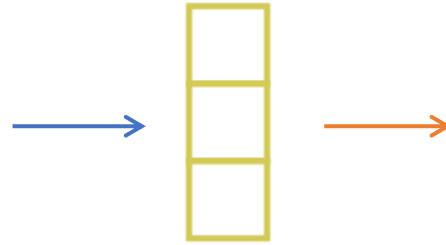
# Autoencoder



# Autoencoder



initial data

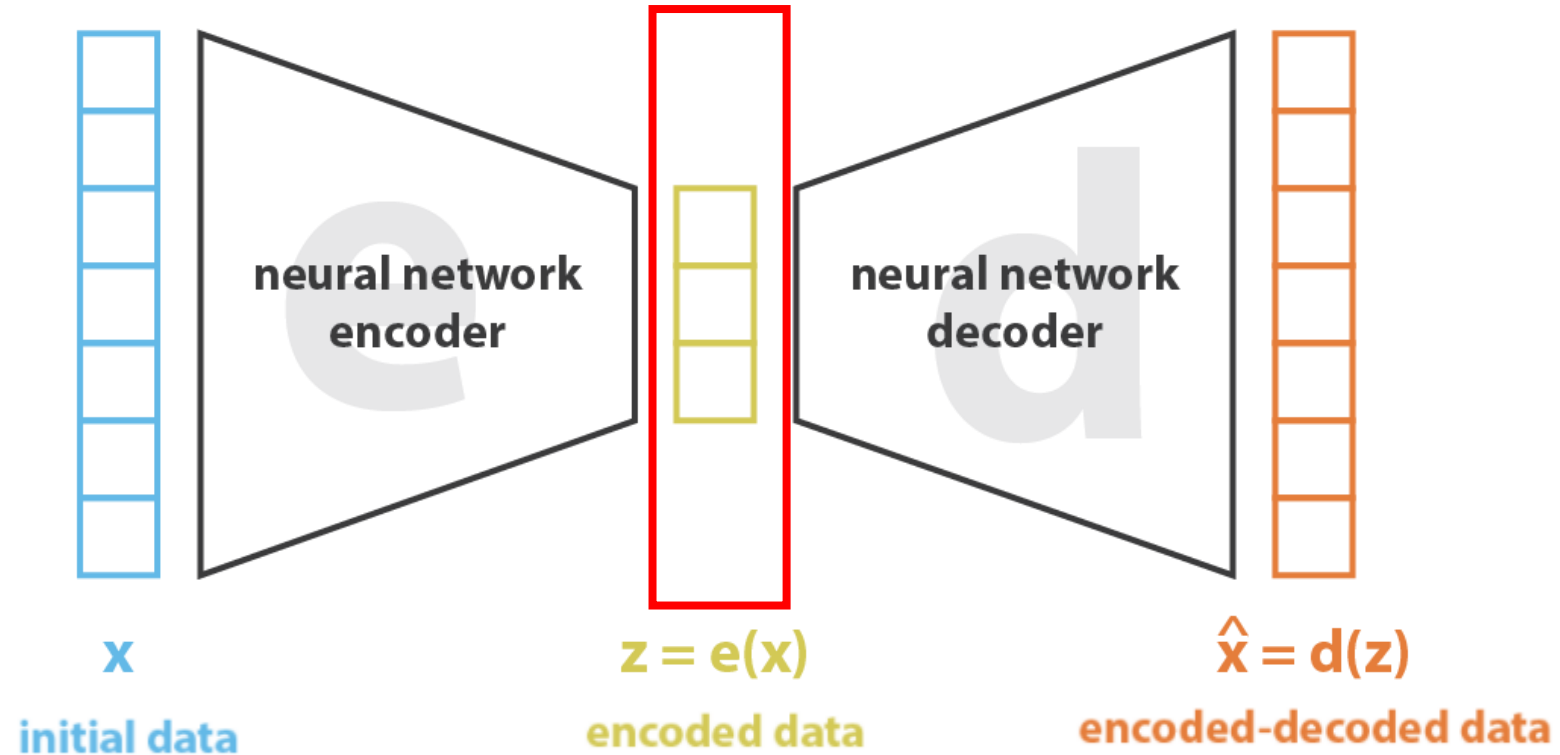


encoded data

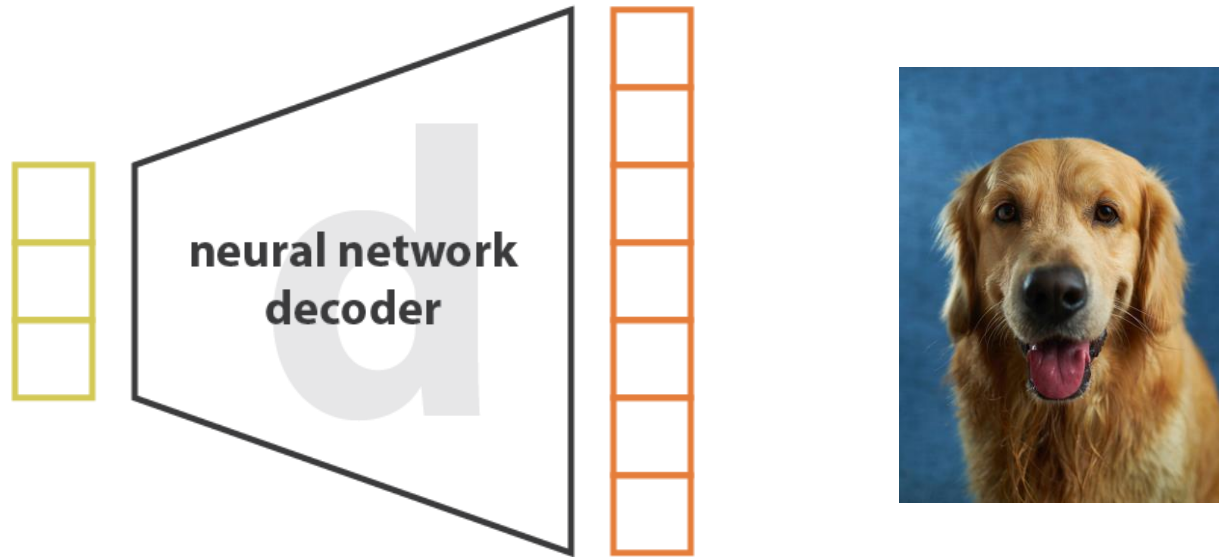


encoded-decoded data

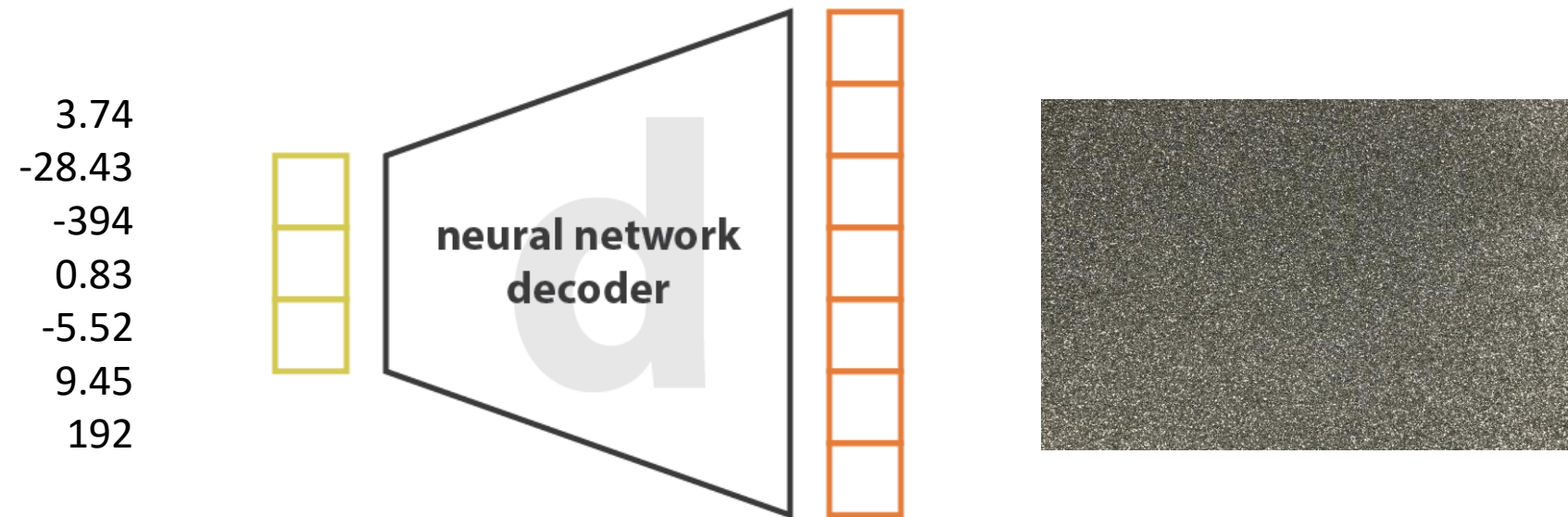
# Autoencoder



# Autoencoder

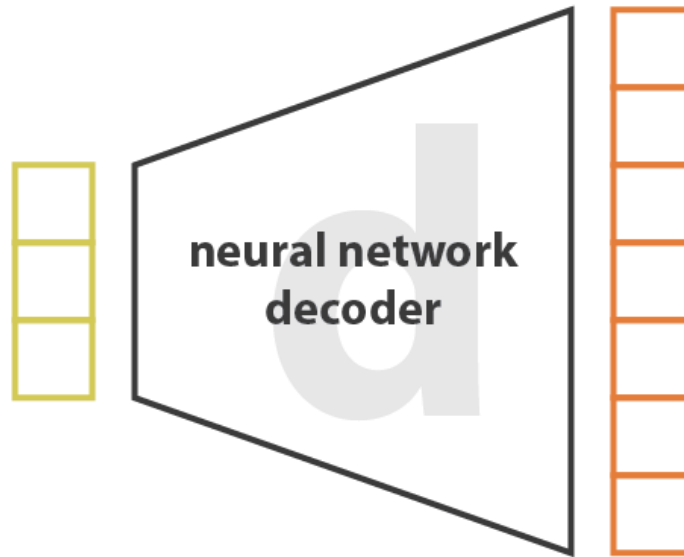


# Autoencoder

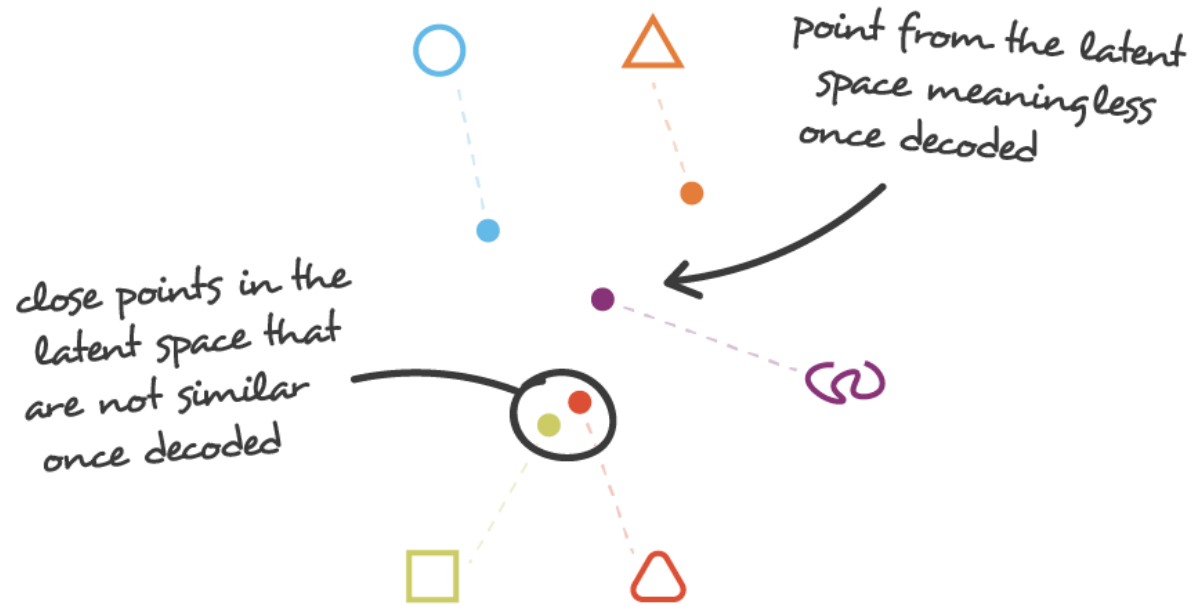


# Autoencoder

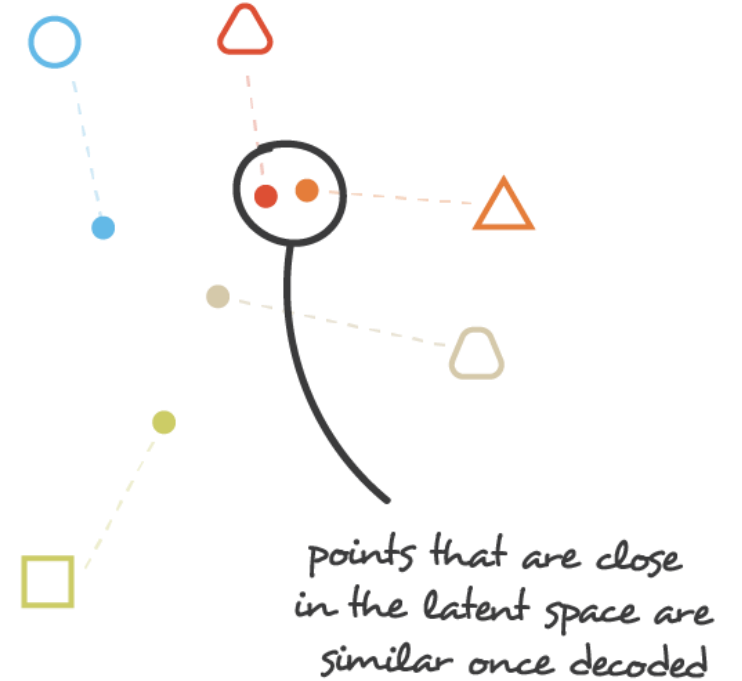
Sampling from  
a distribution





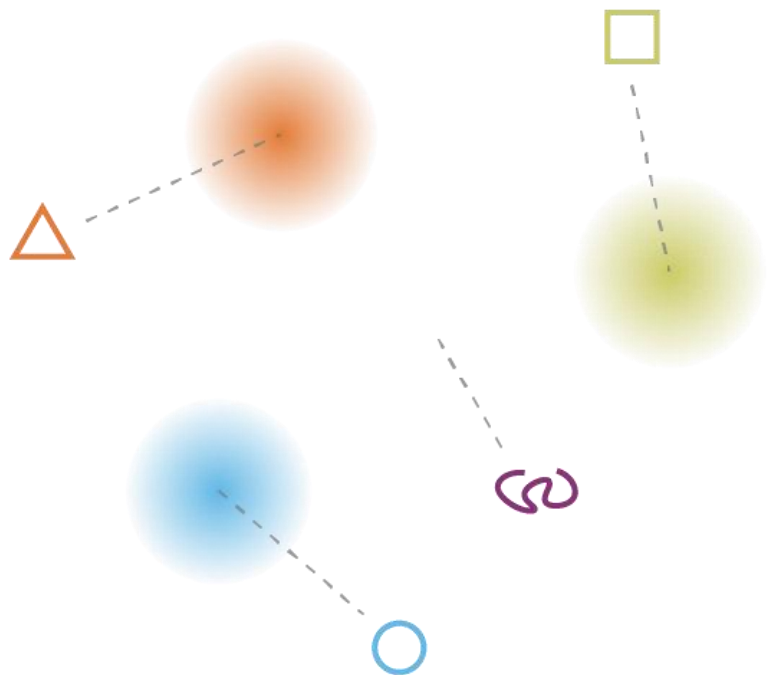


irregular latent space

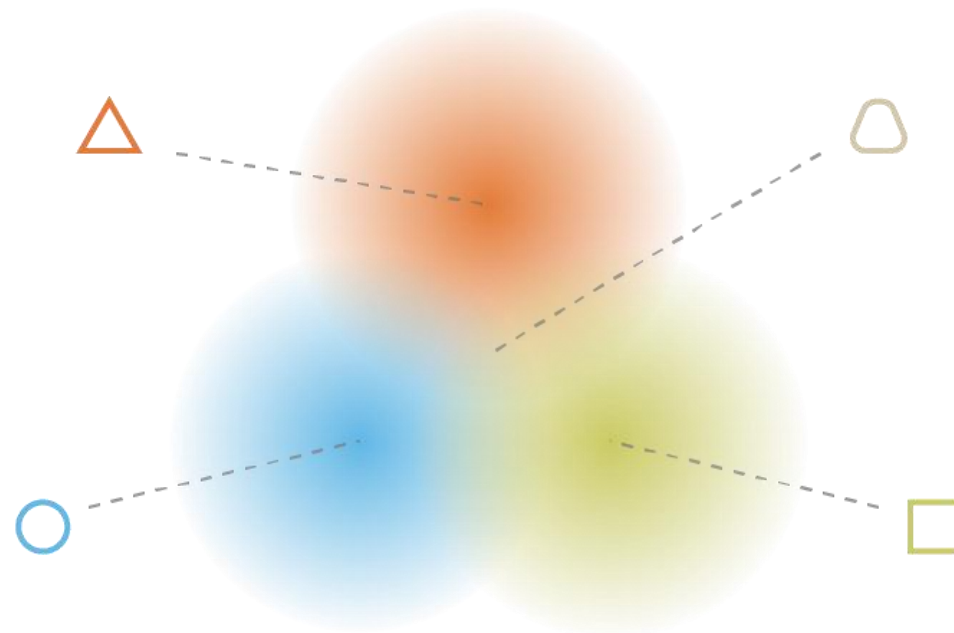


regular latent space

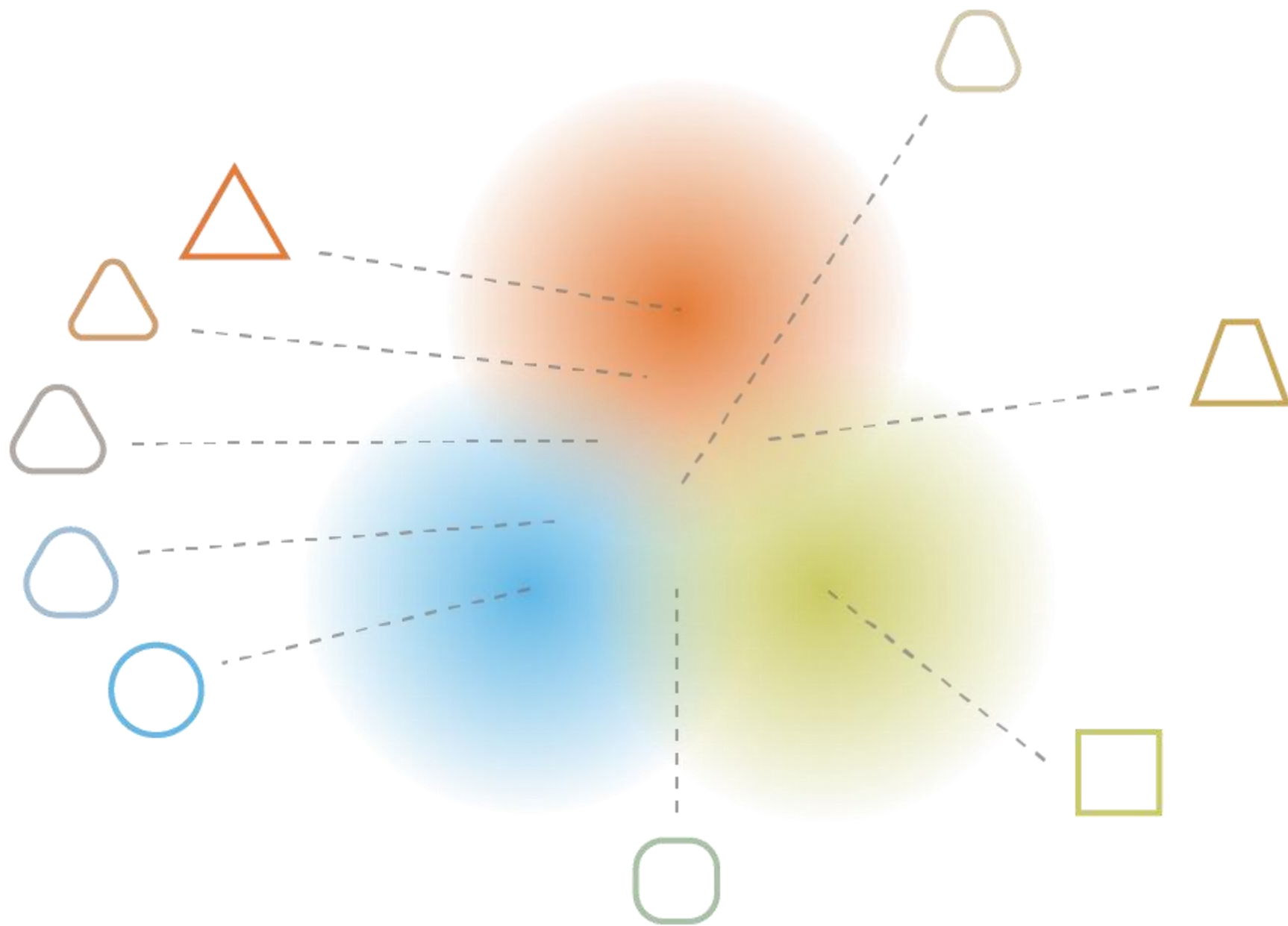




what can happen without regularisation



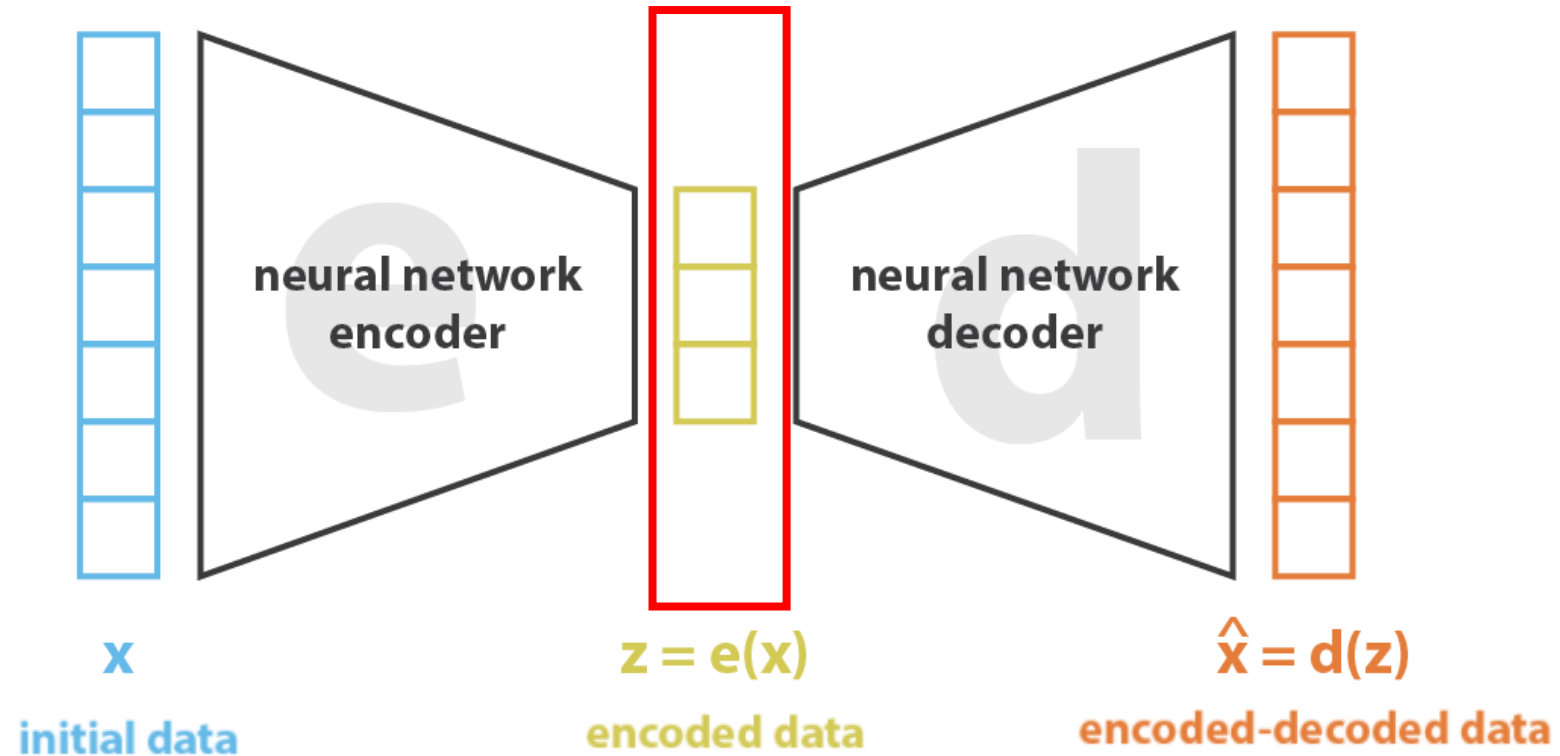
what we want to obtain with regularisation



Source: Understanding Variational Autoencoders (VAEs)

# Variational Autoencoder

# Autoencoder



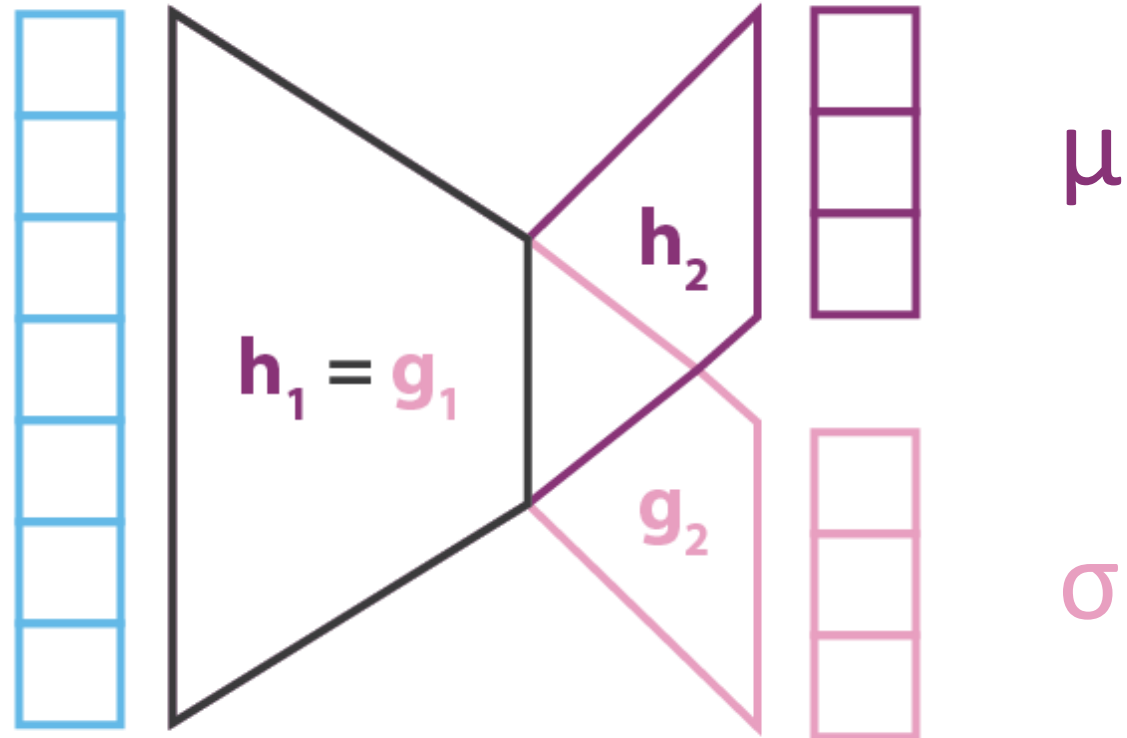
# Variational Autoencoder

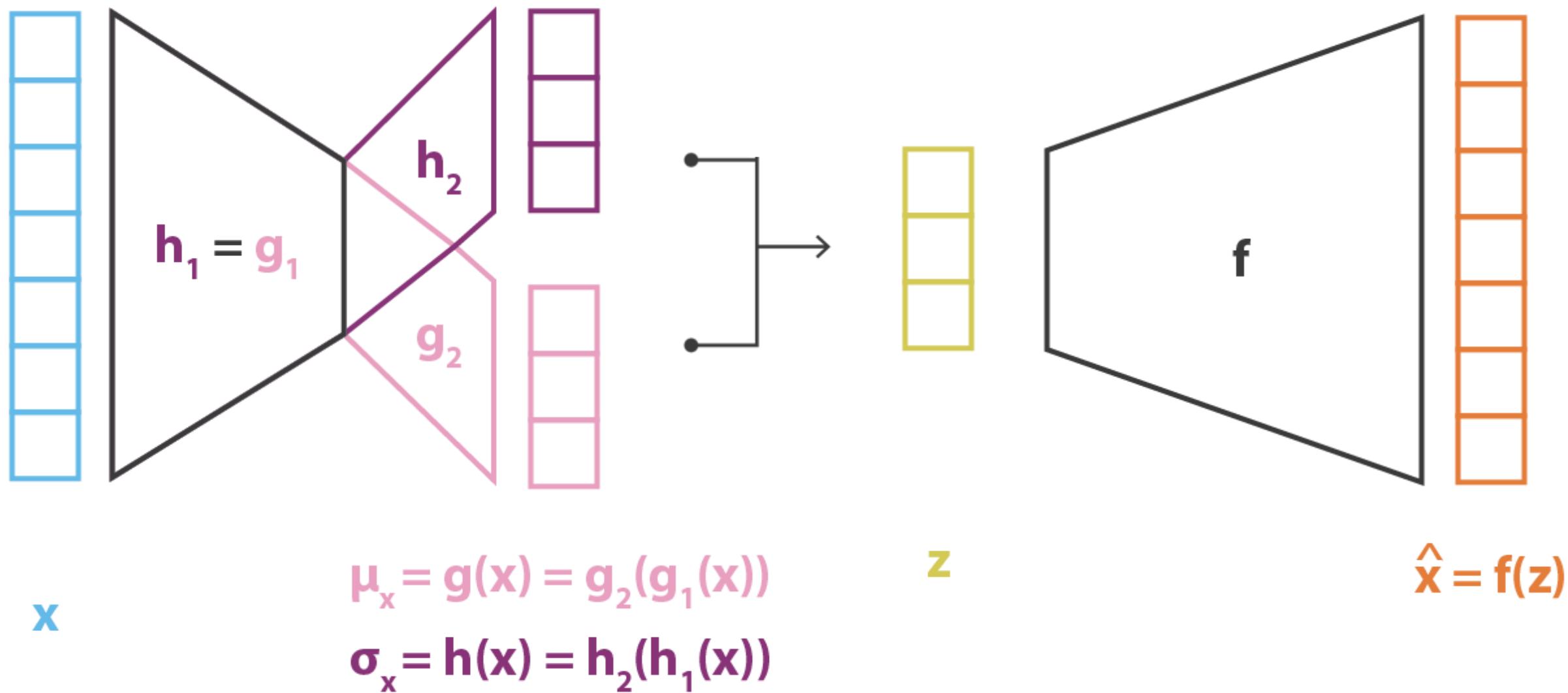
$$Z \sim P(Z|X)$$



$$Z \sim N(\mu, \sigma)$$

# Variational Autoencoder



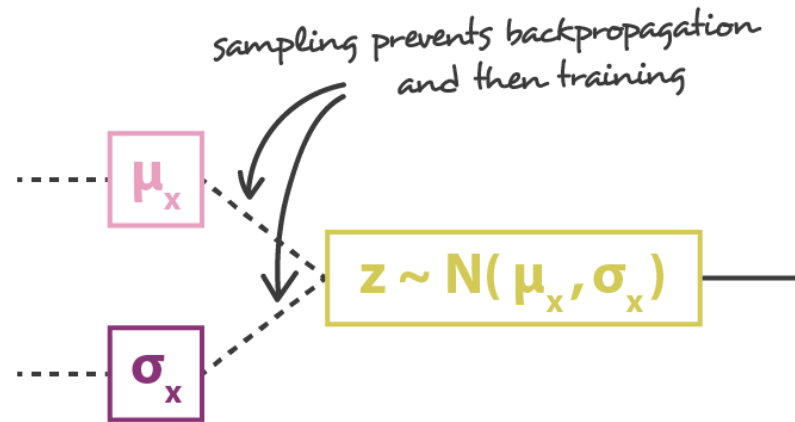




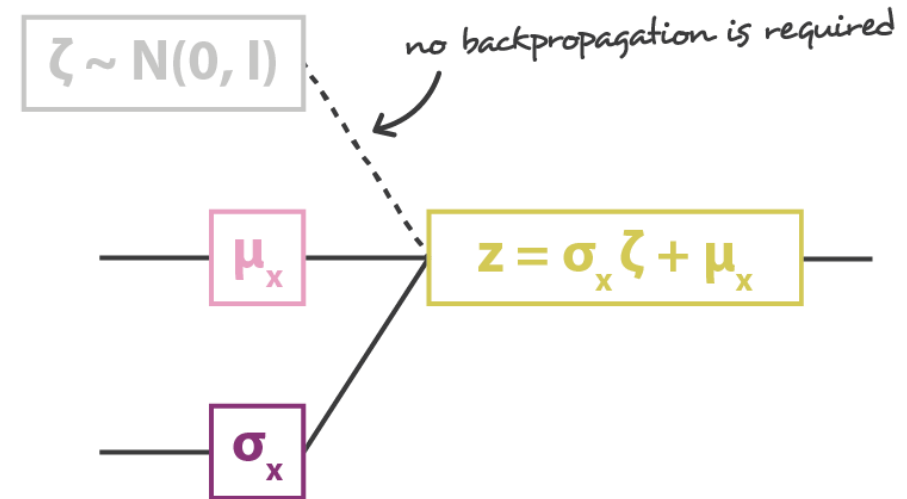
# Variational Autoencoder

—— no problem for backpropagation

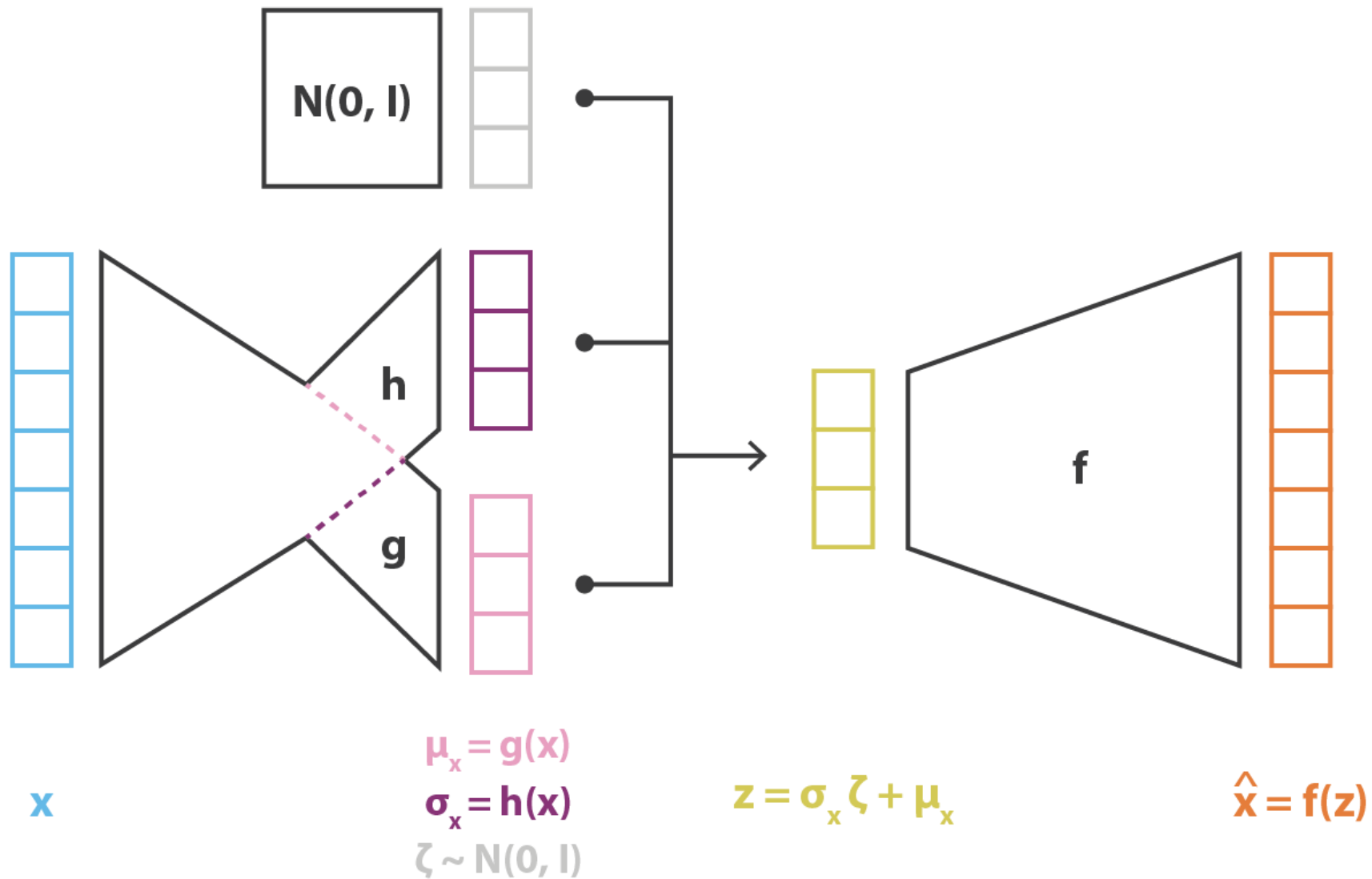
..... backpropagation is not possible due to sampling



sampling without reparametrisation trick

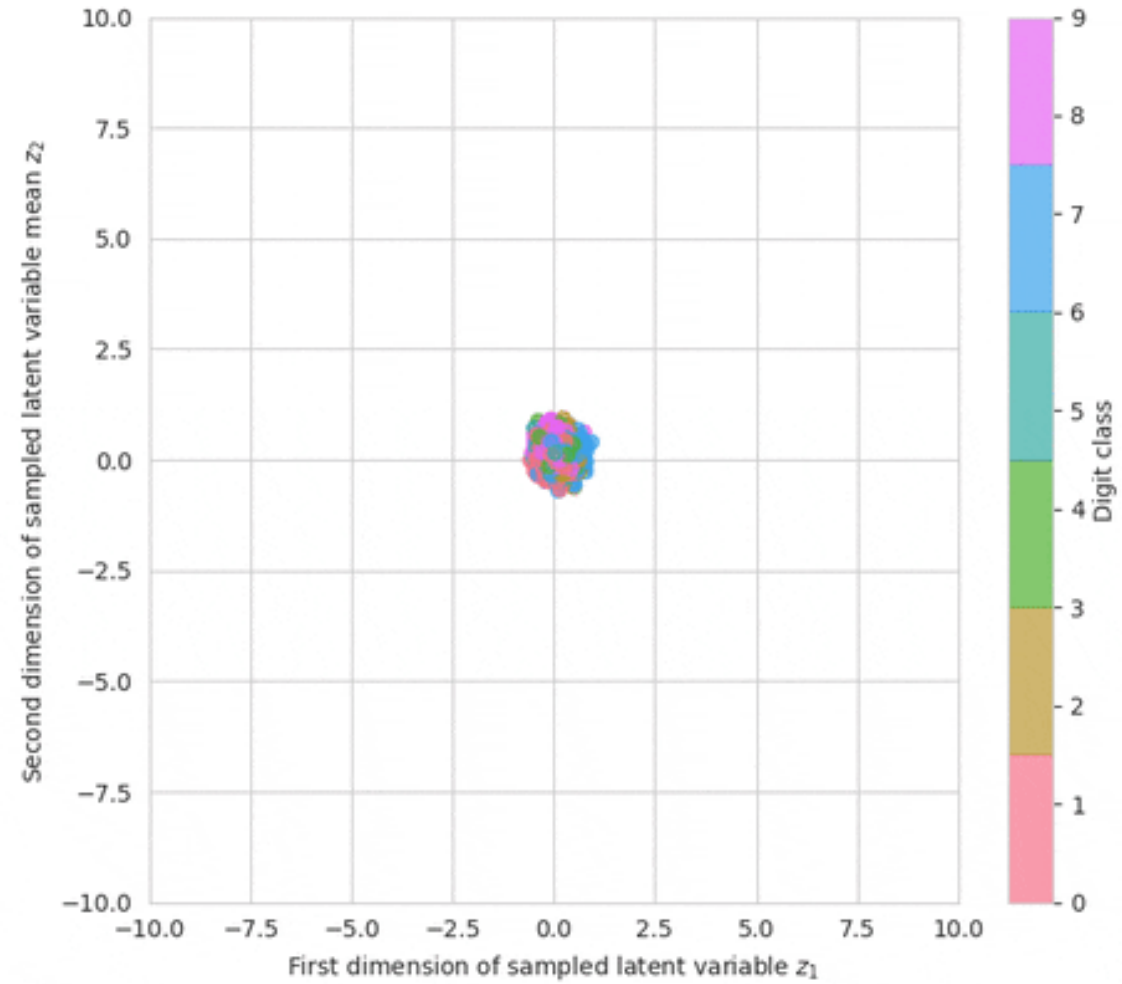


sampling with reparametrisation trick



---


$$\text{loss} = C || x - \hat{x} ||^2 + \text{KL}[ N(\mu_x, \sigma_x), N(0, I) ] = C || x - f(z) ||^2 + \text{KL}[ N(g(x), h(x)), N(0, I) ]$$



Source: <https://giphy.com/gifs/>

# Implementation

- Clustering
- Generating
- Recommendation

# Example

'云日隐层阙，风烟出绮疏'，  
'岩廊罢机务，崇文聊驻辇'，  
'玉匣启龙图，金绳披凤篆'，  
'韦编断仍续，缥帙舒还卷'，  
'对此乃淹留，欹案观坟典'，  
'移步出词林，停舆欣武宴'，  
'雕弓写明月，骏马疑流电'，  
'惊雁落虚弦，啼猿悲急箭'，  
'阅赏诚多美，于兹乃忘倦'，  
'鸣笳临乐馆，眺听欢芳节'，  
'急管韵朱弦，清歌凝白雪'，  
'彩凤肃来仪，玄鹤纷成列'，  
'去兹郑卫声，雅音方可悦'，  
'芳辰追逸趣，禁苑信多奇'，  
'桥形通汉上，峰势接云危'，

Some of the inputs

Epoch 42/100  
2319/2319 [=====] - 62s 27ms/step - loss: 6  
1.6676

幽性清香处，春山独望空

Epoch 43/100  
2319/2319 [=====] - 62s 27ms/step - loss: 6  
1.6427

君生一无事，不以良与主

Epoch 44/100  
2319/2319 [=====] - 62s 27ms/step - loss: 6  
1.6127

何将身不难，不敢问鞭者

Epoch 45/100  
427/2319 [====>.....] - ETA: 50s - loss: 61.3366

Some of the outputs

# Reference

- [Understanding Variational Autoencoders \(VAEs\)](#)
- [Tutorial - What is a variational autoencoder?](#)
- [Variational Autoencoders](#)
- [Autoencoder-wiki](#)
- [giphy.com](#)
- Kingma, D. P., & Welling, M. (2013). Auto-encoding variational bayes. arXiv preprint arXiv:1312.6114.
- Pu, Y., Gan, Z., Henao, R., Yuan, X., Li, C., Stevens, A., & Carin, L. (2016). Variational autoencoder for deep learning of images, labels and captions. arXiv preprint arXiv:1609.08976.