



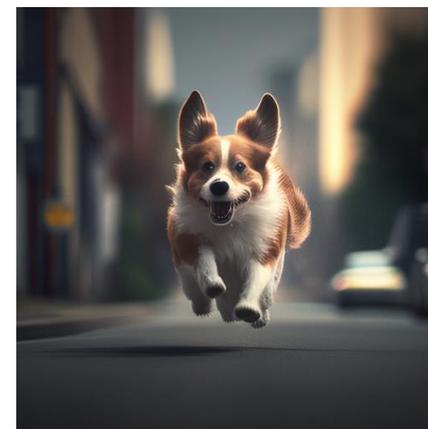
# 速覽圖像生成模型

# 圖像生成

一張圖勝過千言萬語

一隻在奔跑的狗  
千言萬語的一部分

圖像  
生成

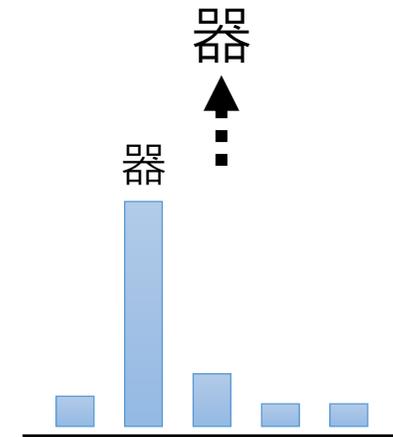
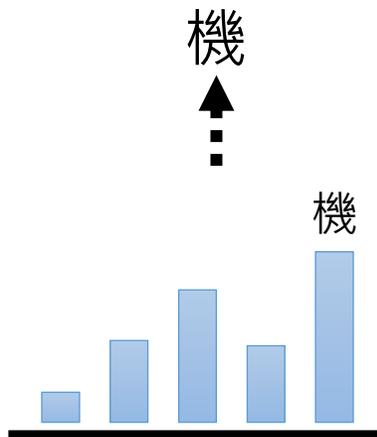


... 一隻在街道上奔跑的柯基狗 ...

**機器需要大量腦補**

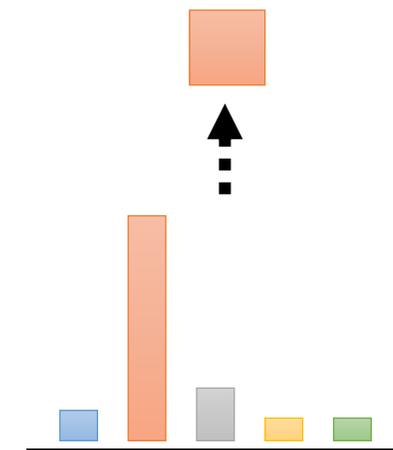
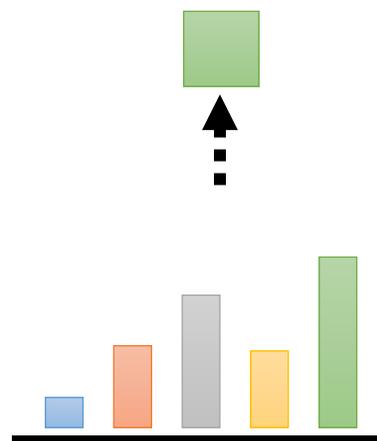
# 文字生成多採取 Autoregressive (各個擊破)

機器學習是甚麼？



影像生成好像也可以用同樣的道理

一隻在奔跑的狗



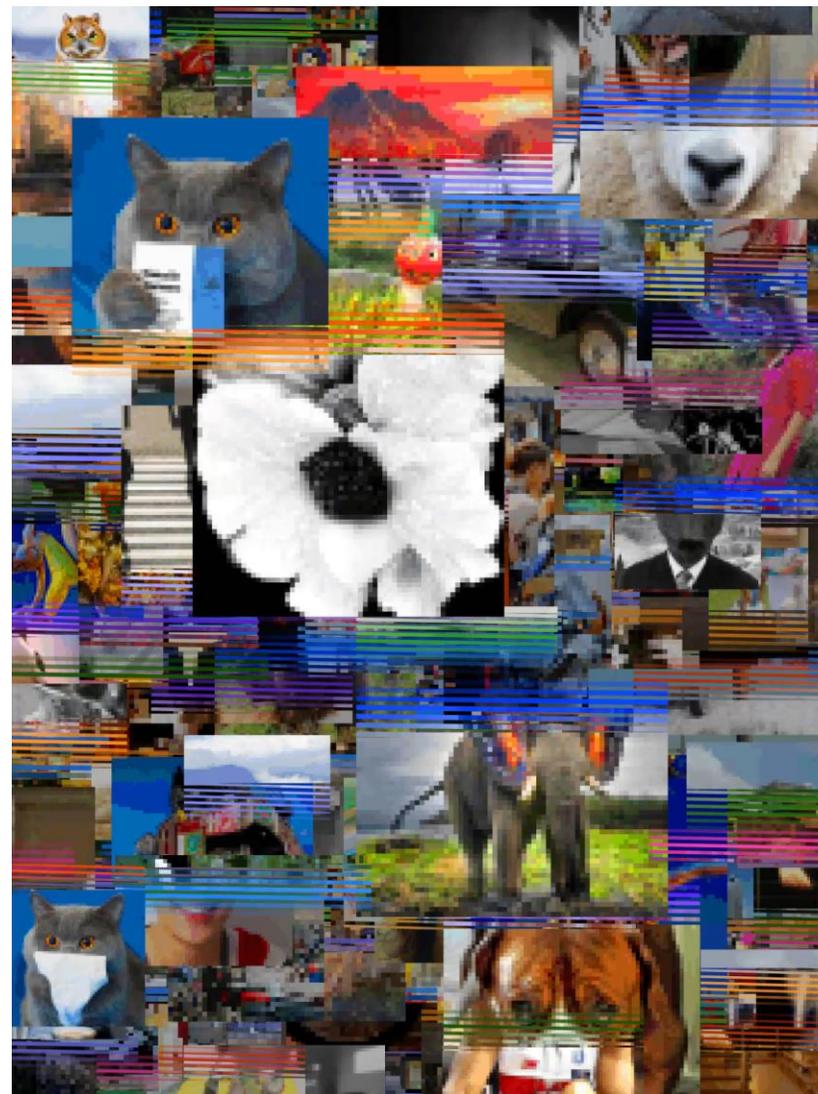
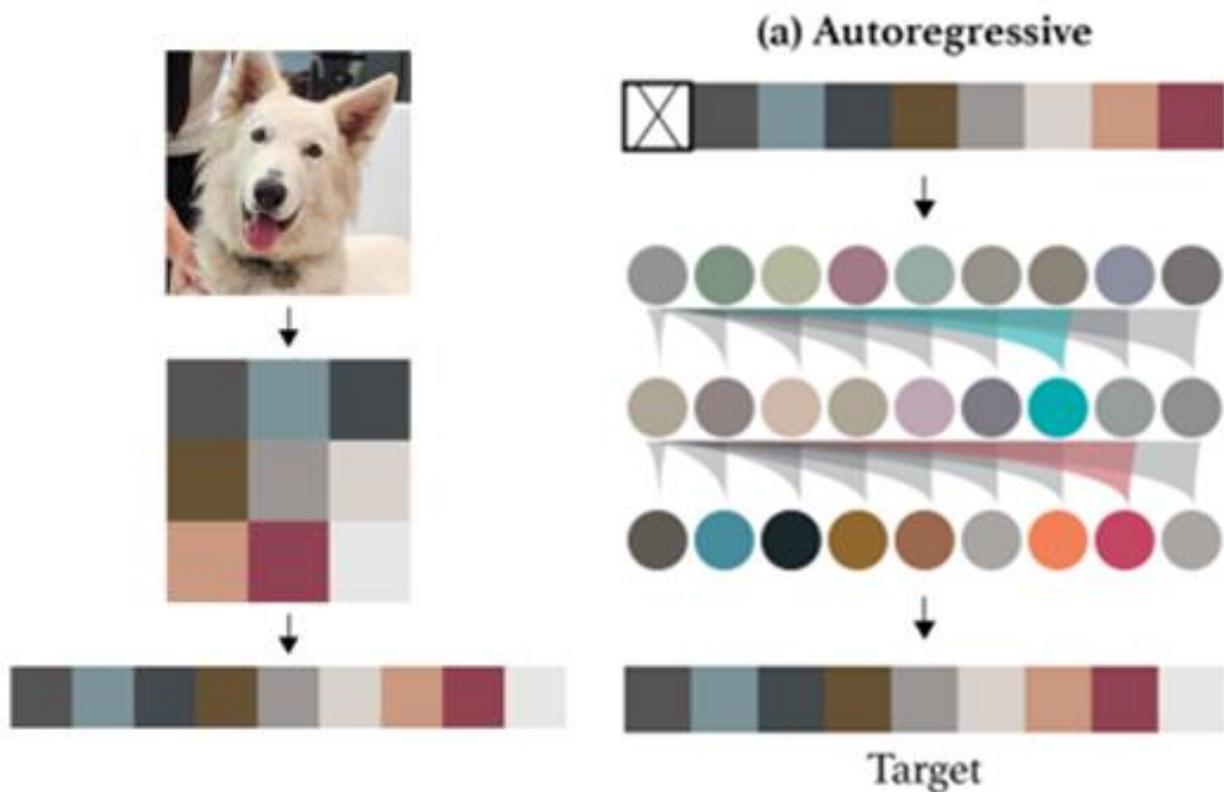
256 x 256 images → 65536 pixels

# 影像也可以採取 Autoregressive (各個擊破)

<https://openai.com/blog/image-gpt/>

raster order

## 影像版 GPT

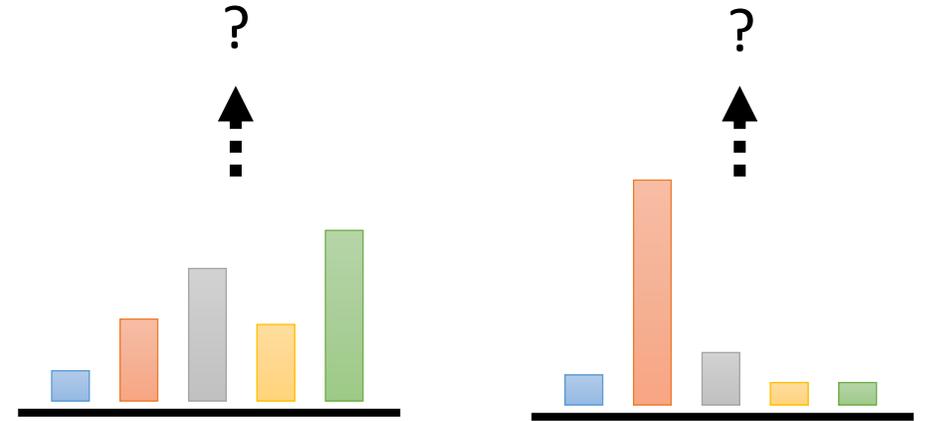


# 一次到位有甚麼問題

一隻在奔跑的狗

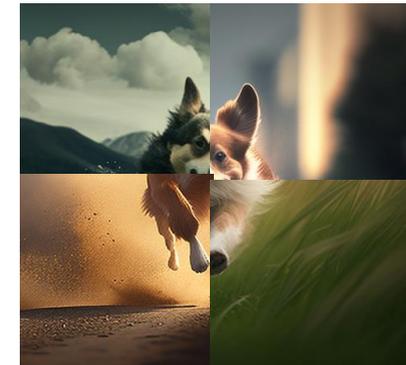
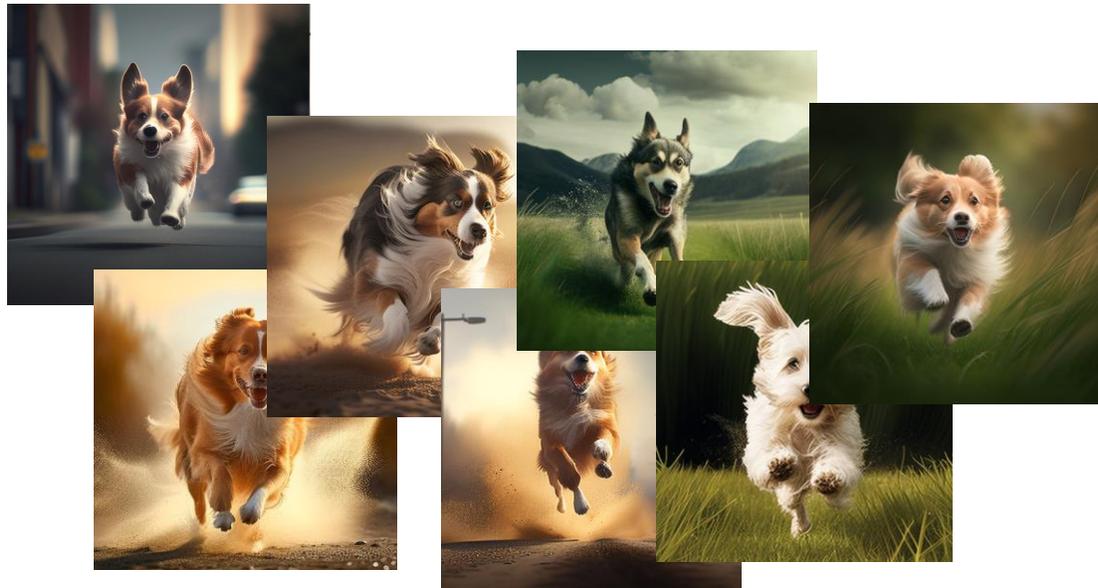


影像生成



256 x 256 images → 65536 pixels

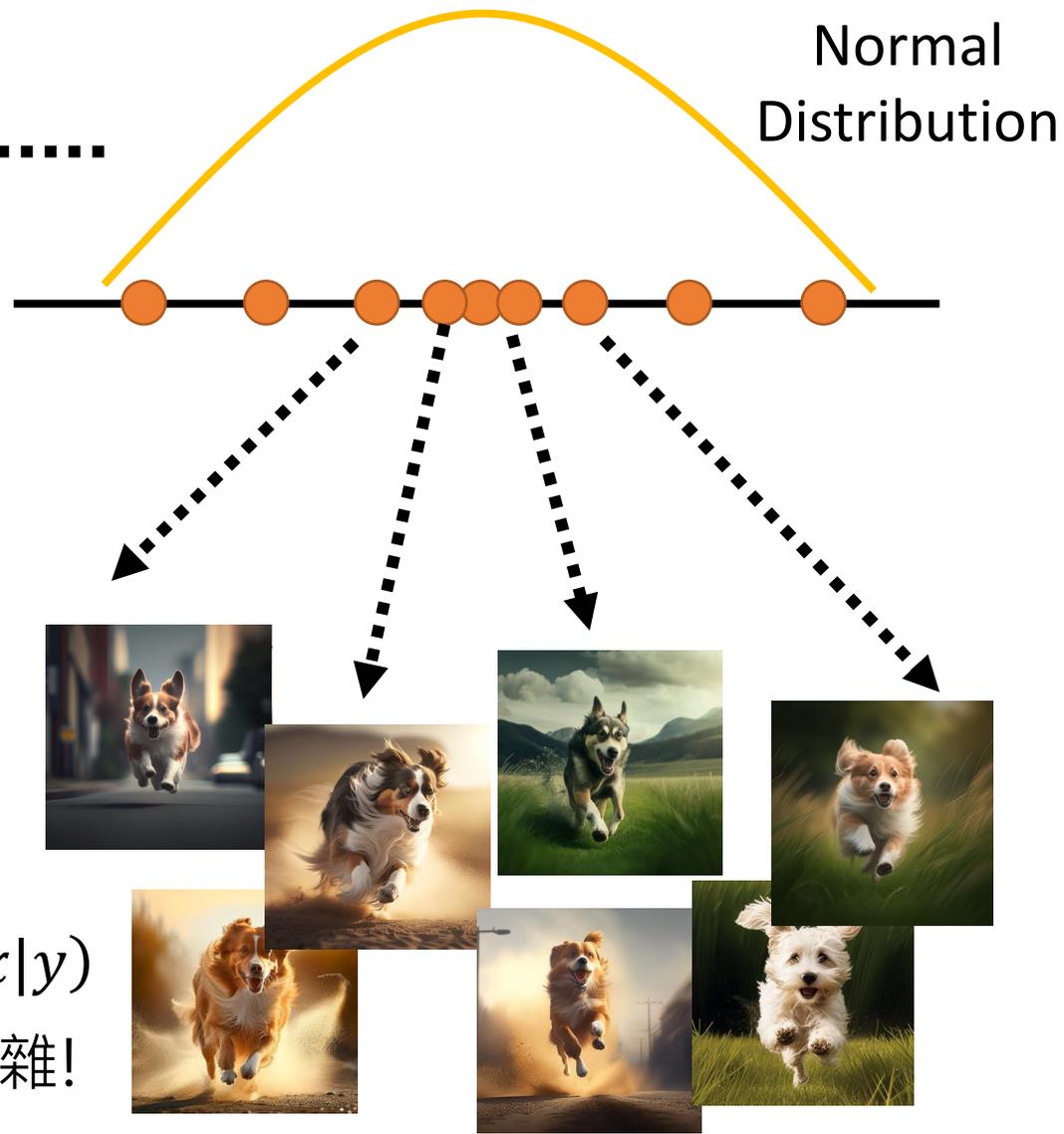
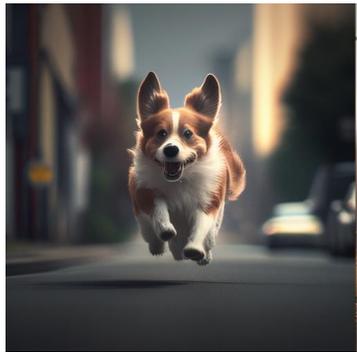
每一個像素獨立繪製



一隻在奔跑的狗

影像生成

$y$ : 文字  
 $x$ : 影像



# 影像常用生成模型速覽

以下說明都非常簡略  
詳細內容請見參考資料

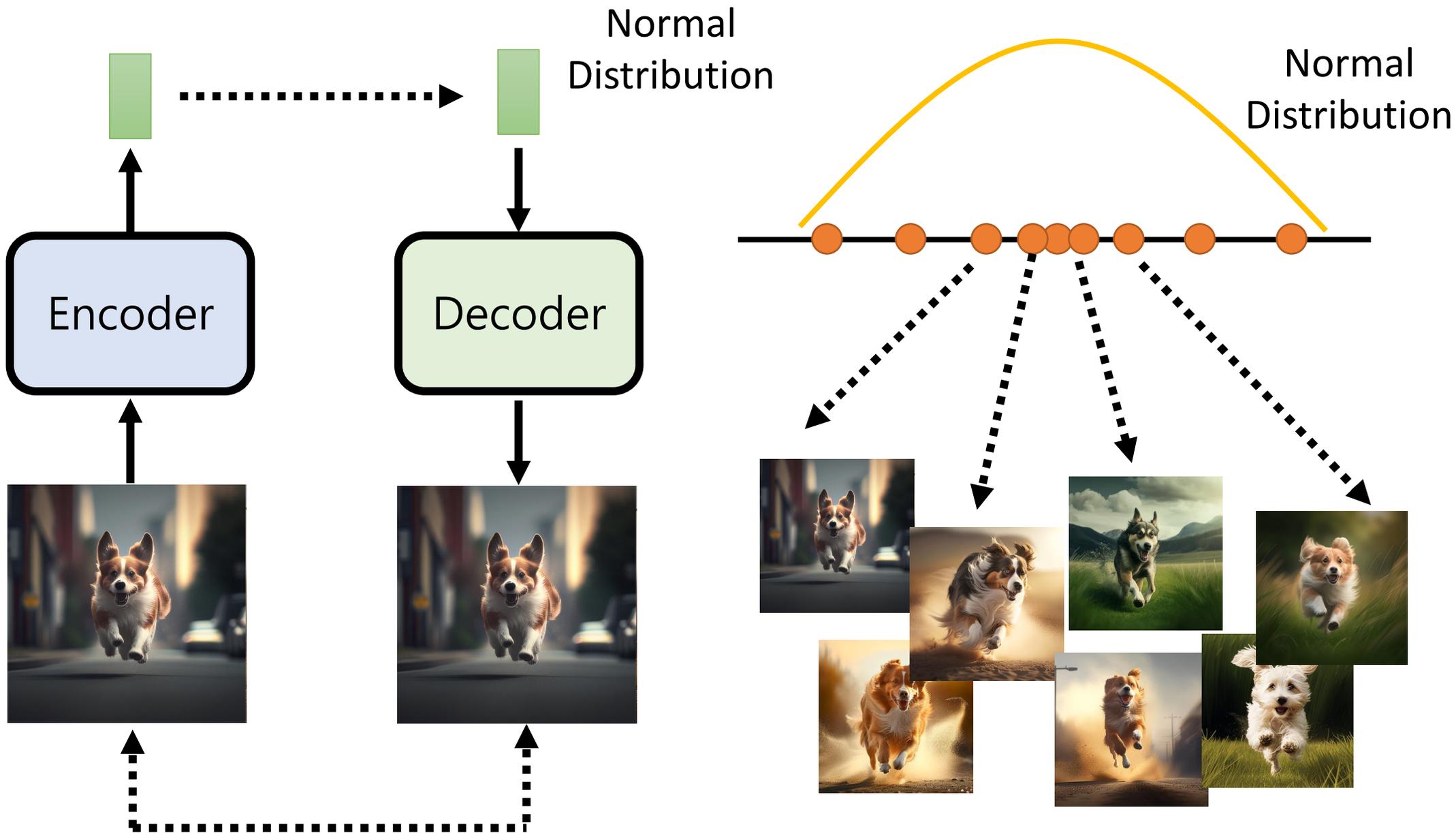
Variational Auto-encoder (VAE)

Flow-based Generative Model

Diffusion Model

Generative Adversarial Network (GAN)

# VAE



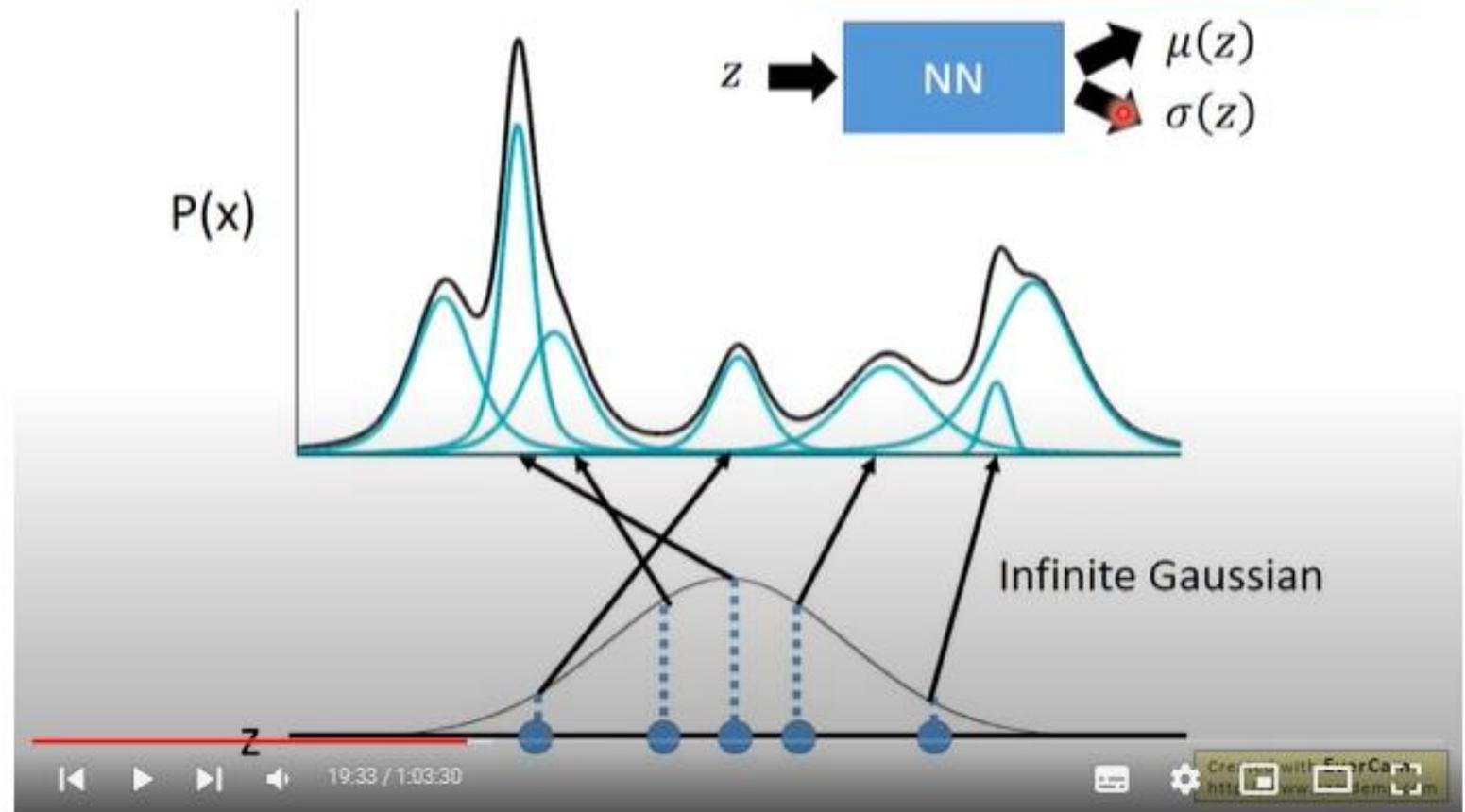
VAE

$$z \sim N(0, I)$$

z is a vector from normal distribution

$$x|z \sim N(\mu(z), \sigma(z))$$

Each dimension of z represents an attribute



ML Lecture 18: Unsupervised Learning - Deep Generative Model (Part II)

<https://youtu.be/8zomhgKrsmQ>

# 影像常用生成模型速覽

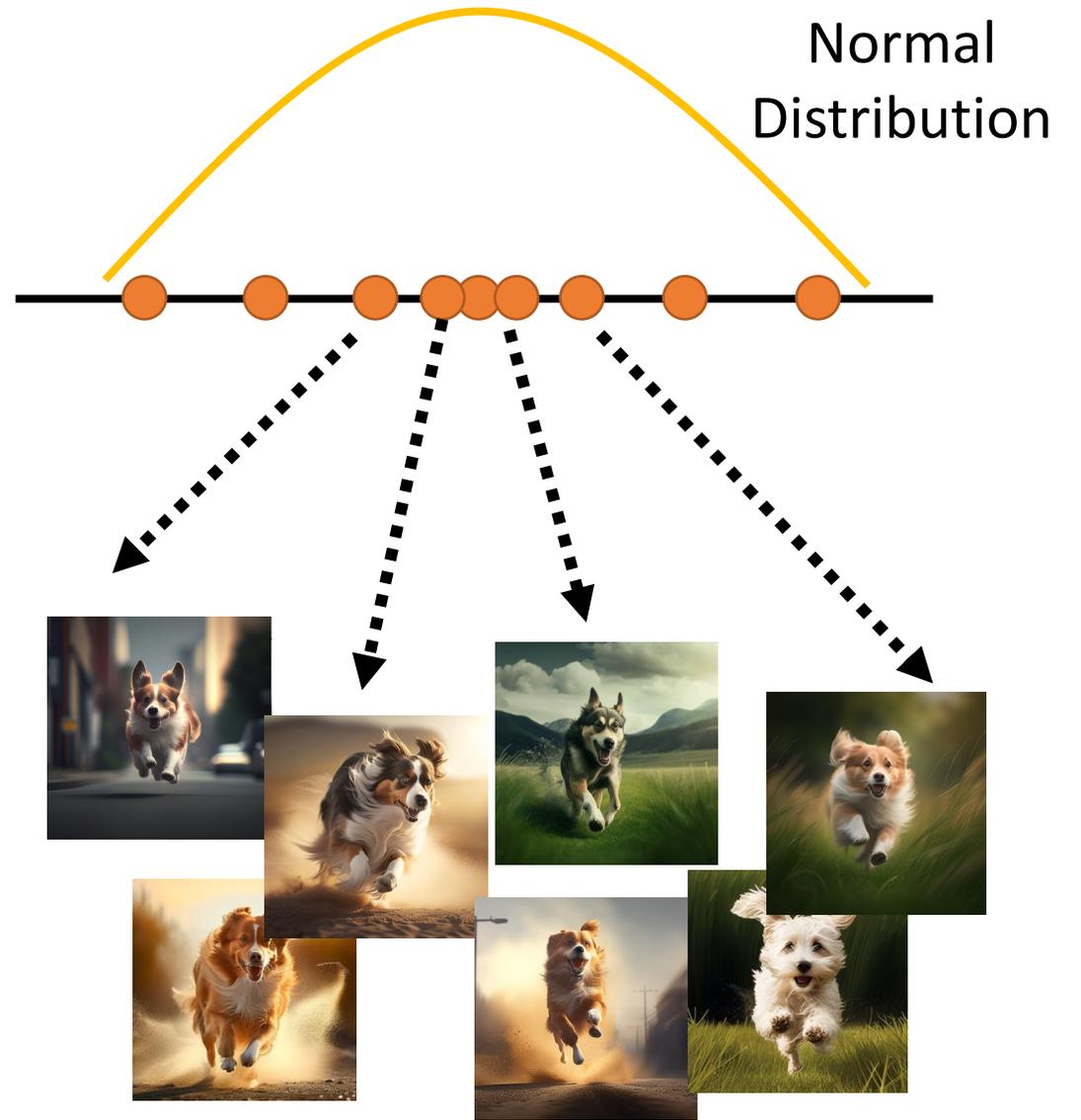
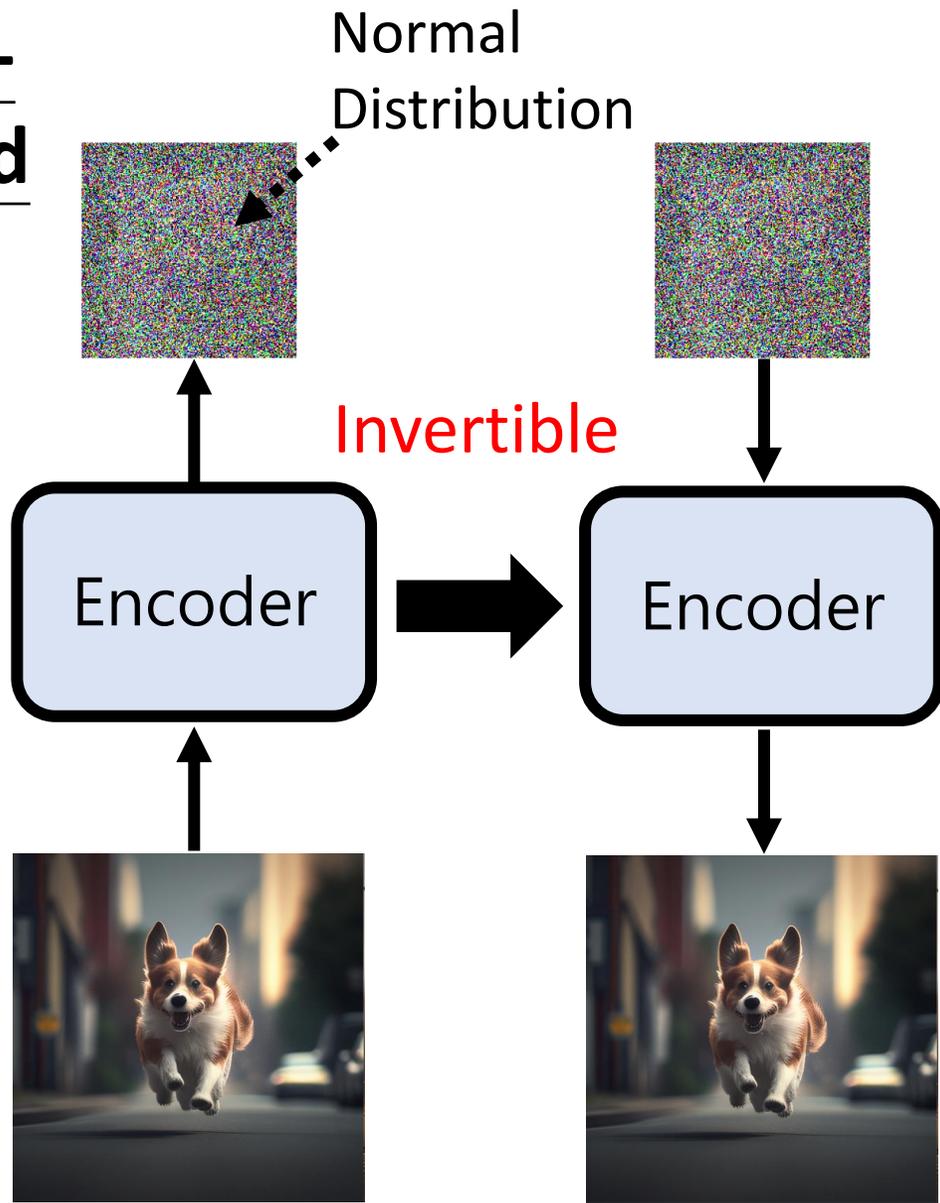
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# Flow-based



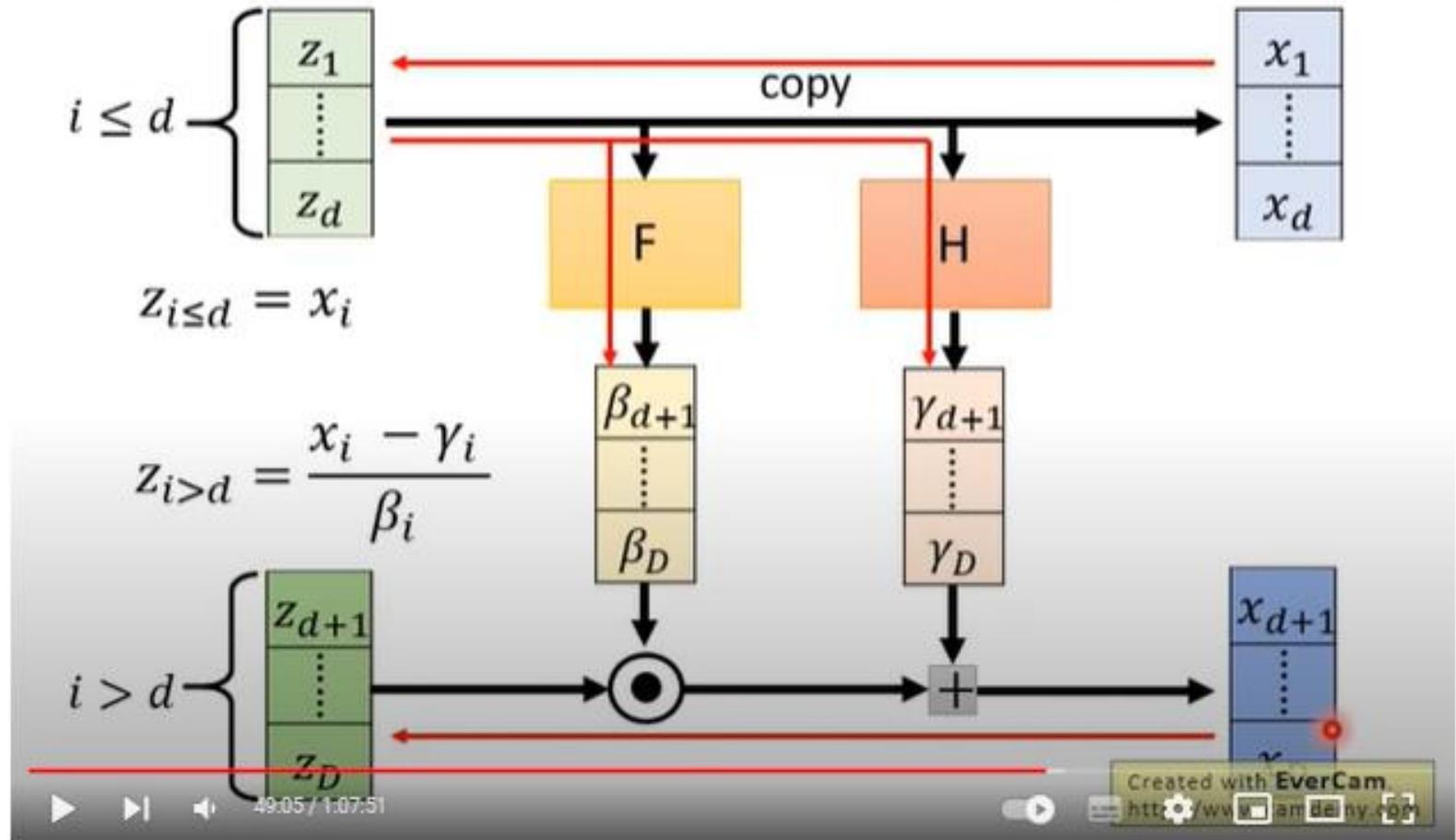
# Coupling Layer

NICE

<https://arxiv.org/abs/1410.8516>

Real NVP

<https://arxiv.org/abs/1605.08803>



Flow-based Generative Model

<https://youtu.be/uXY18nzdSsM>

# 影像常用生成模型速覽

Variational Auto-encoder (VAE)

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# 影像常用生成模型速覽

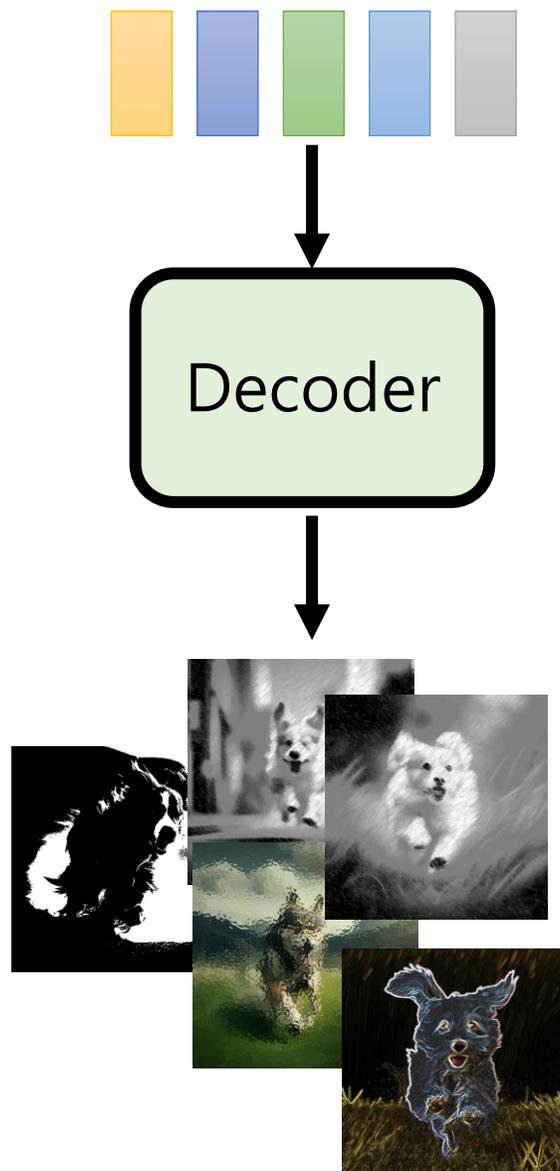
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# GAN



$P(x)$  and  $P'(x)$  are close

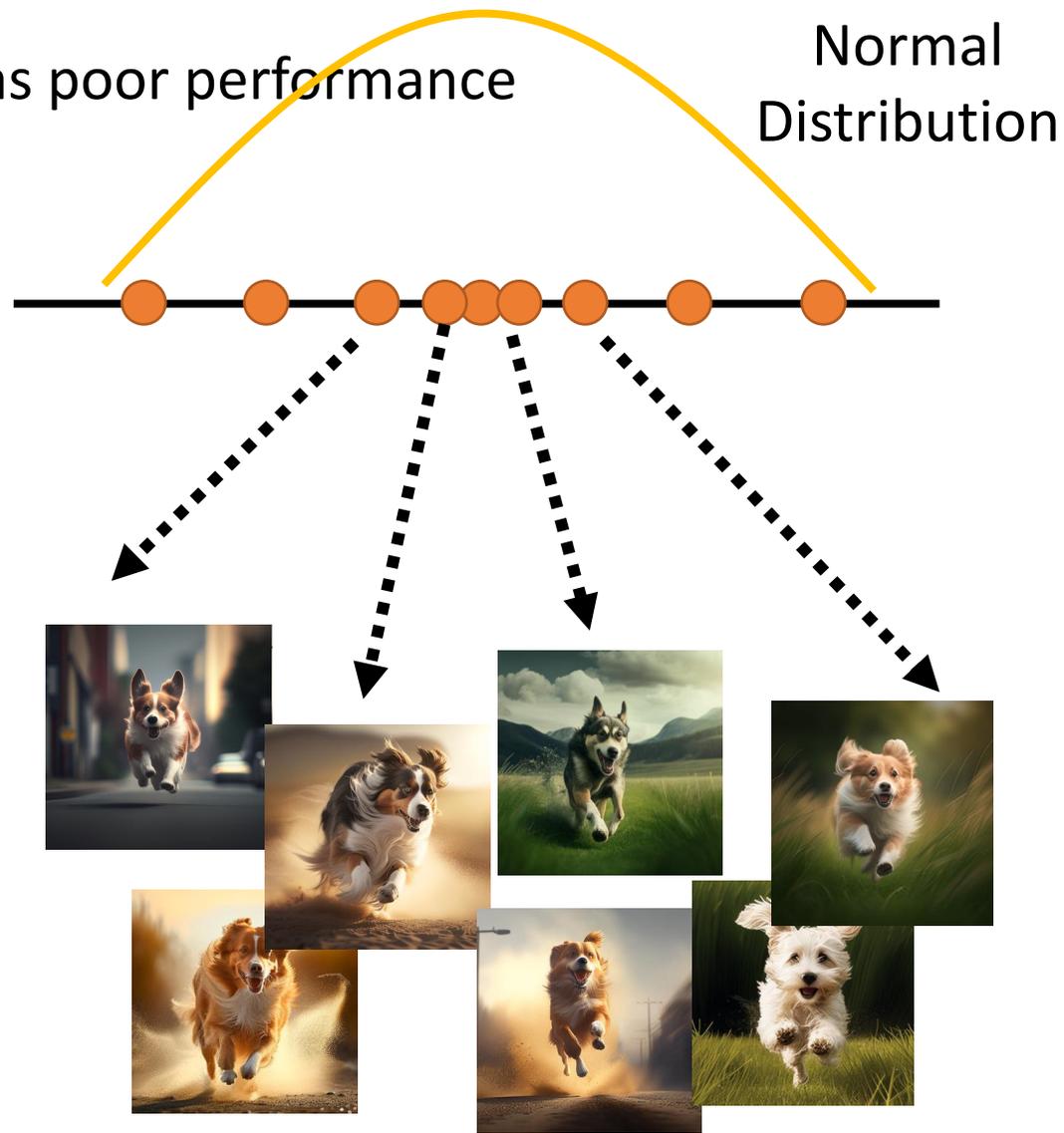
Discriminator has poor performance

Real / Generated



$P'(x)$

$P(x)$



# Introduction of Generative Adversarial Network (GAN)

李宏毅

Hung-yi Lee

播放 (k)

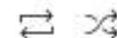
0:02 / 1:33:14

Created with EverCam

http://www.lam.gov.hk

## Generative Adversarial Network (GAN)

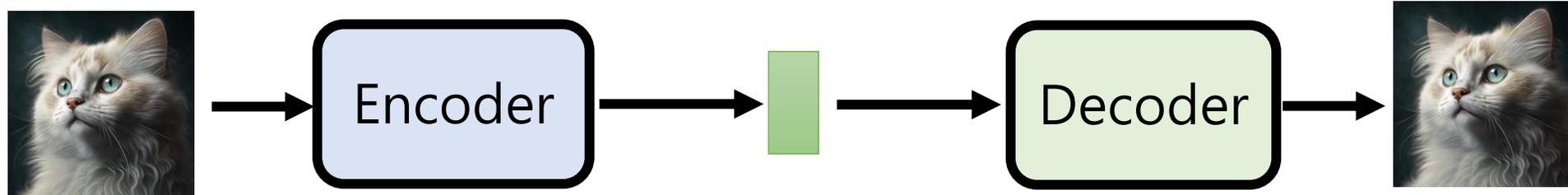
Hung-yi Lee - 1/10



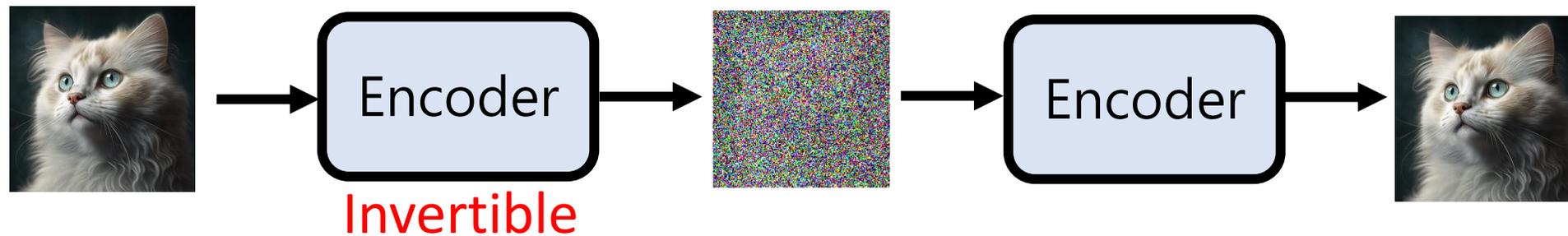
- ▶ GAN Lecture 1 (2018): Introduction  
Hung-yi Lee  
1:32:15
- 2 GAN Lecture 2 (2018): Conditional Generation  
Hung-yi Lee  
26:19
- 3 GAN Lecture 3 (2018): Unsupervised Conditional...  
Hung-yi Lee  
38:59
- 4 GAN Lecture 4 (2018): Basic Theory  
Hung-yi Lee  
1:20:19
- 5 GAN Lecture 5 (2018): General Framework  
Hung-yi Lee  
25:05
- 6 GAN Lecture 6 (2018): WGAN, EBGAN  
Hung-yi Lee  
50:07
- 7 GAN Lecture 7 (2018): Info GAN, VAE-GAN, BiGAN  
Hung-yi Lee  
46:03
- 8 GAN Lecture 8 (2018): Photo Editing  
Hung-yi Lee  
22:47
- 9 GAN Lecture 9 (2018): Sequence Generation

[https://www.youtube.com/watch?v=DQNNMiAP5lw&list=PLJV\\_el3uVTsMq6JEFPW35BCiOQTsoqwNw](https://www.youtube.com/watch?v=DQNNMiAP5lw&list=PLJV_el3uVTsMq6JEFPW35BCiOQTsoqwNw)

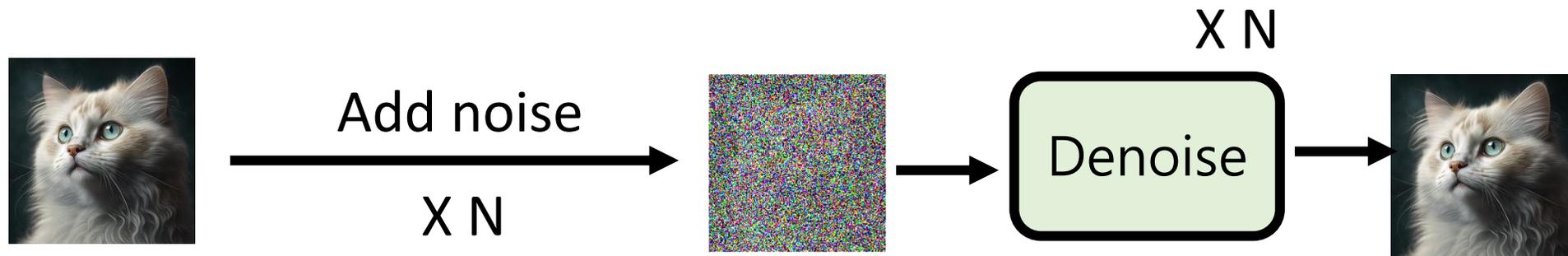
VAE



Flow-based

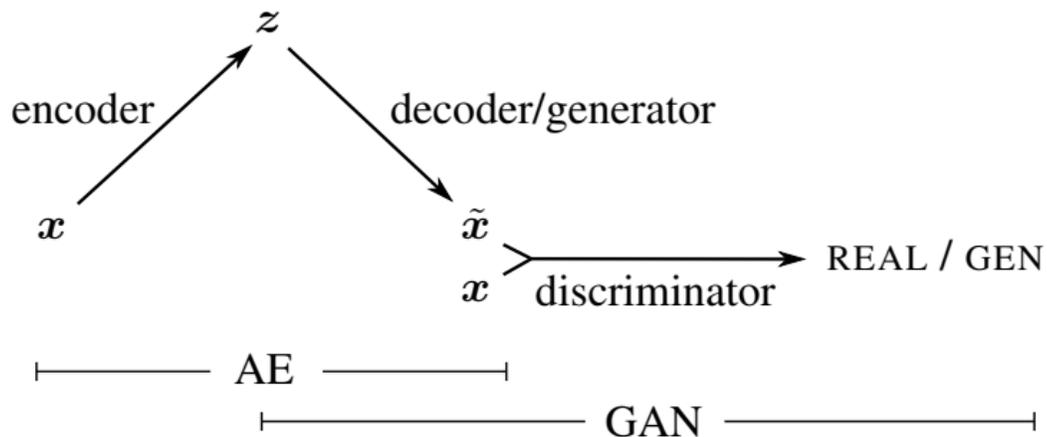


Diffusion



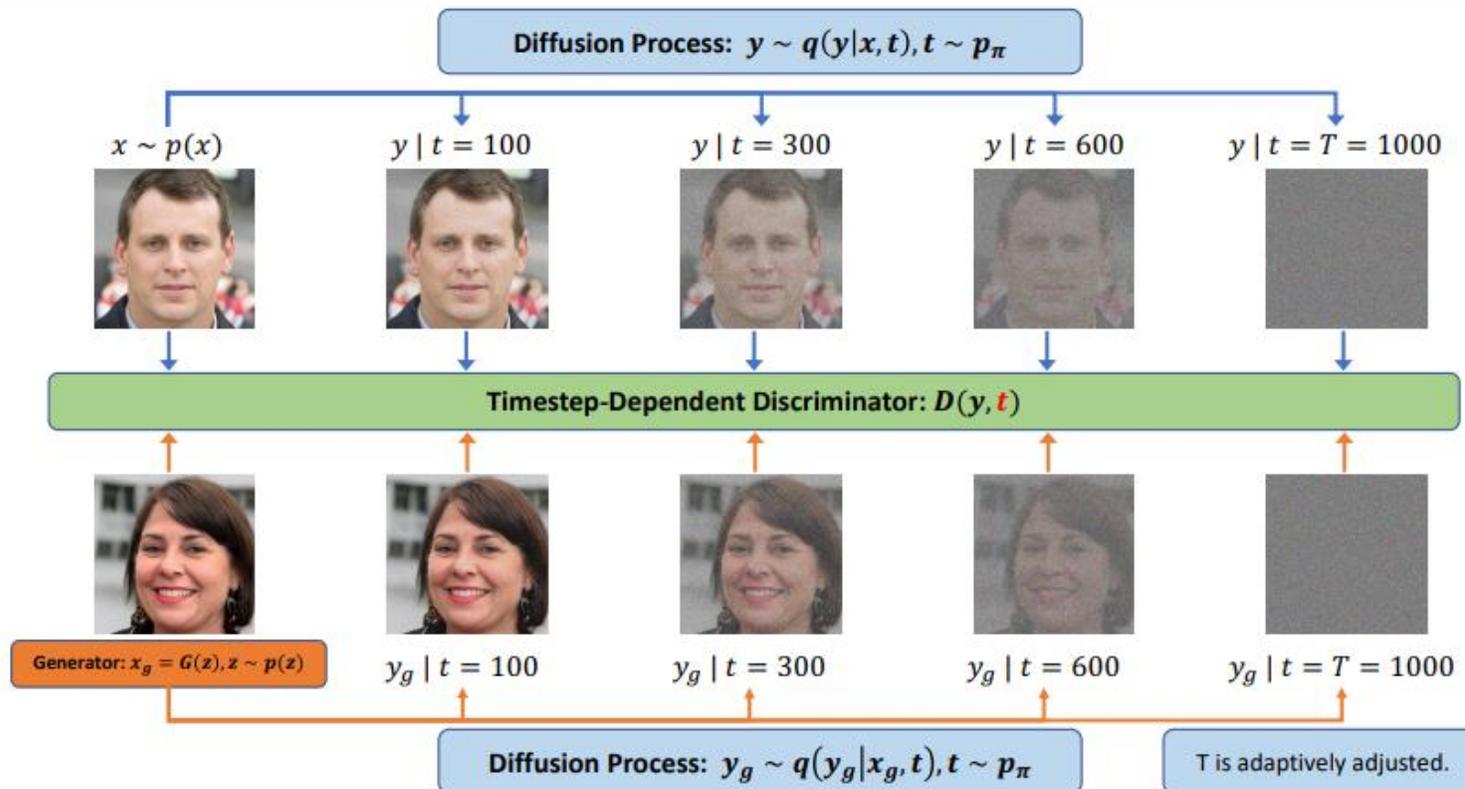
## VAE + GAN

<https://arxiv.org/abs/1512.09300>



## Flow + GAN

<https://arxiv.org/abs/1705.08868>



## Diffusion + GAN

<https://arxiv.org/abs/2206.02262>

# 影像常用生成模型速覽

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