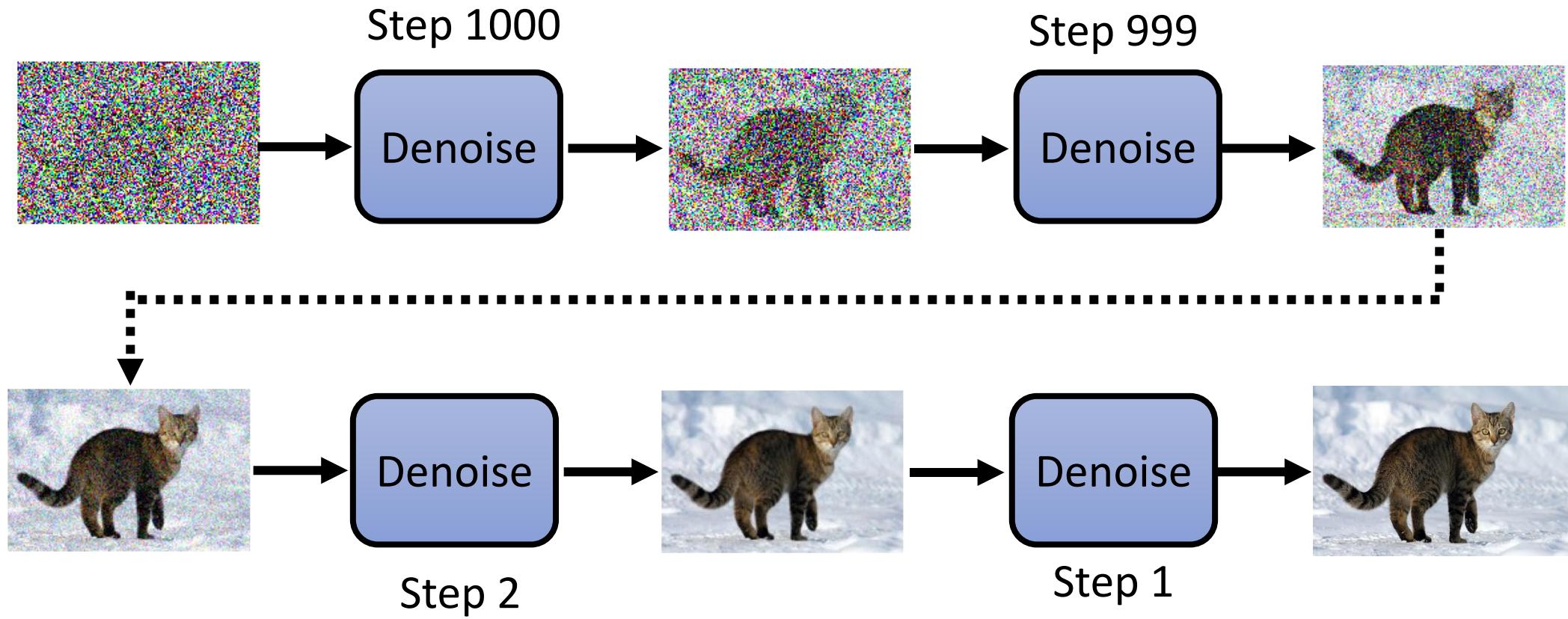


# Diffusion Model

Denoising Diffusion Probabilistic Models (DDPM)  
<https://arxiv.org/abs/2006.11239>

# Diffusion Model 是如何運作的？

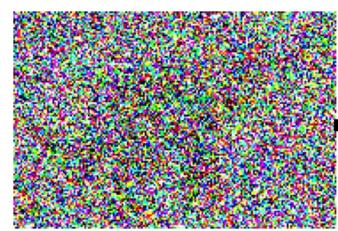


**Reverse Process**



The sculpture is already complete within the marble block, before I start my work. It is already there, I just have to chisel away the superfluous material. - **Michelangelo**





Step 1000

Denoise



Step 999

Denoise



Denoise



Denoise



Step 2

Step 1



1000

Denoise

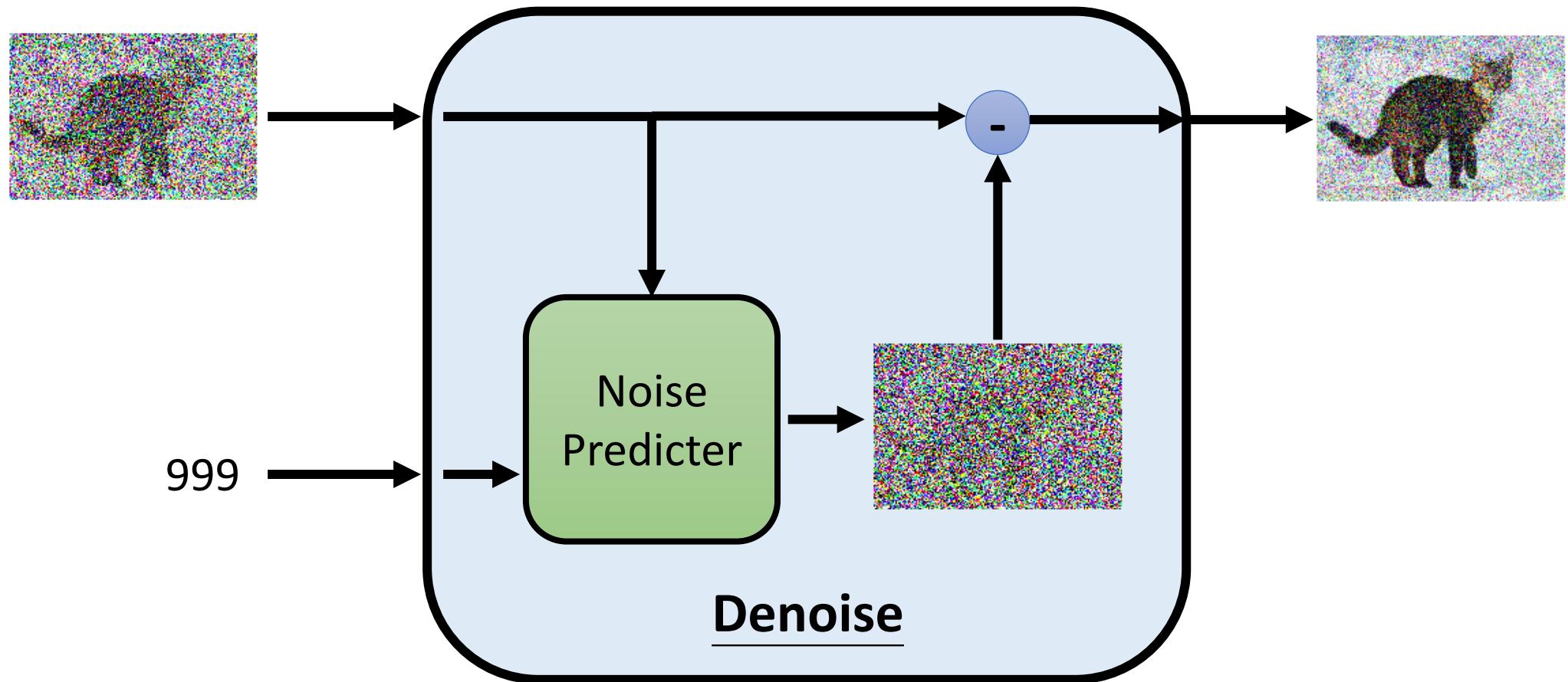


1

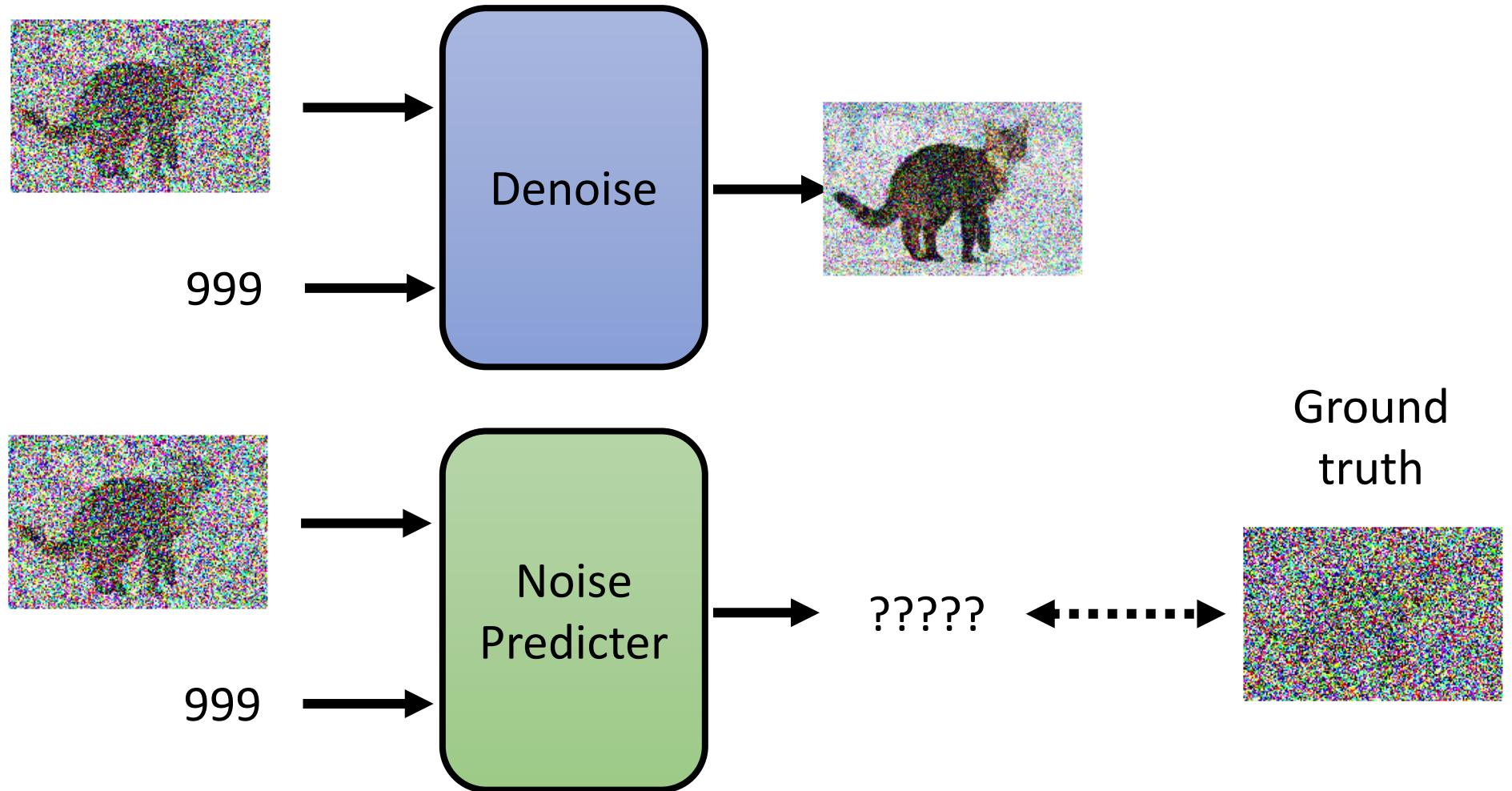
Denoise

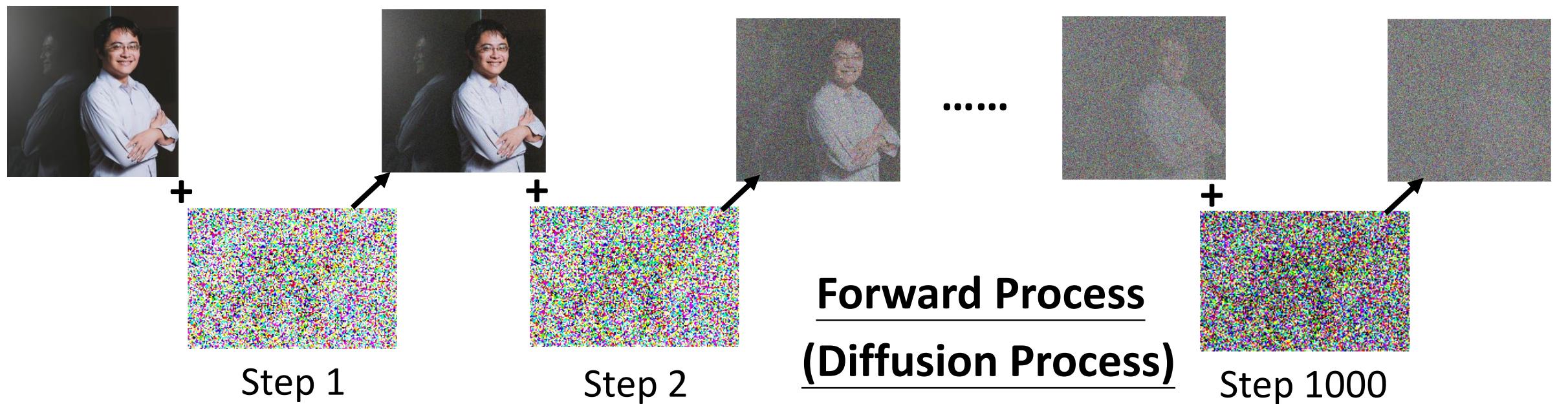
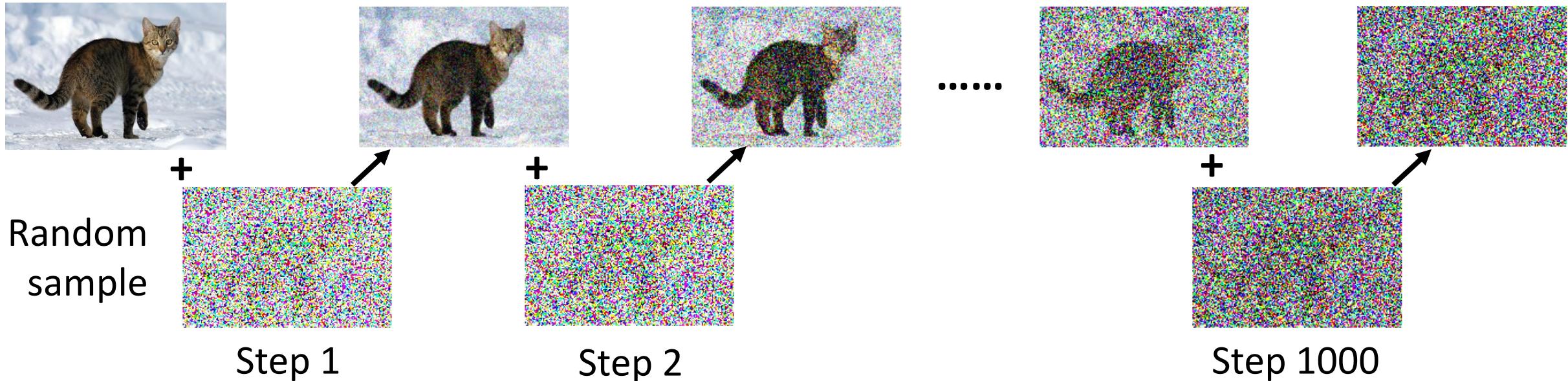


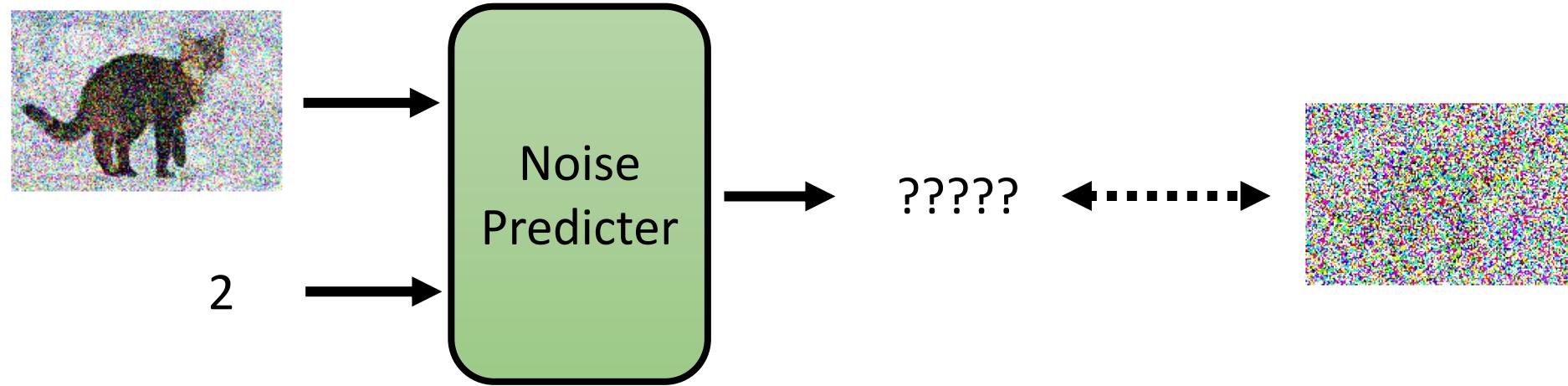
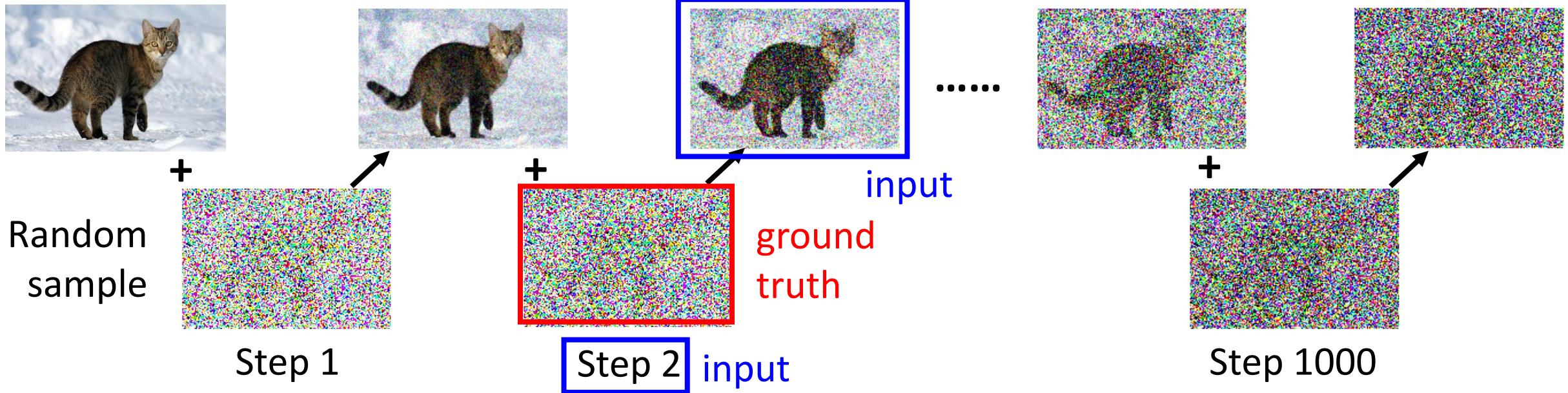
# Denoise 模組內部實際做的事情



# 如何訓練 Noise Predictor







# Text-to-Image

<https://laion.ai/blog/laion-5b/>

HW6

70k



ImageNet

1M



LAION

5.85B

A cat in  
the snow

Text-to-image  
Generator



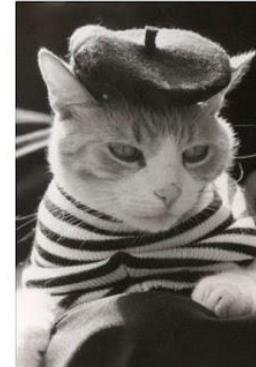
Backend url: <https://knn5.laion>

Index: laion\_5B

french cat

Clip retrieval works by converting the text query to a CLIP embedding , then using that embedding to query a knn index of clip image embedddings

Display captions  Display full captions  Display similarities  Safe mode  Hide duplicate urls  Hide (near) duplicate images  Search over image  Search with multilingual clip

 french cat

 french cat

 How to tell if your feline is french. He wears a b...

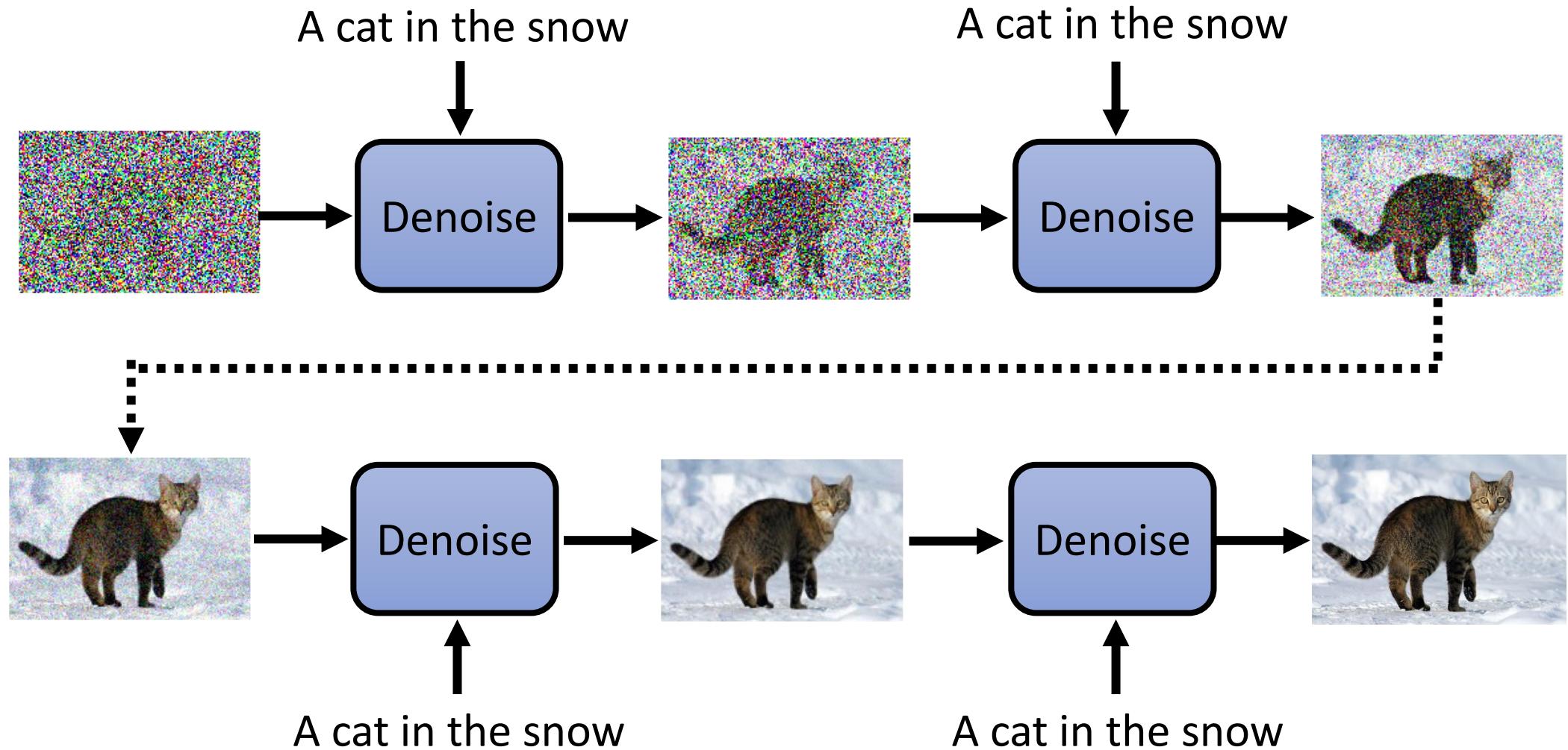
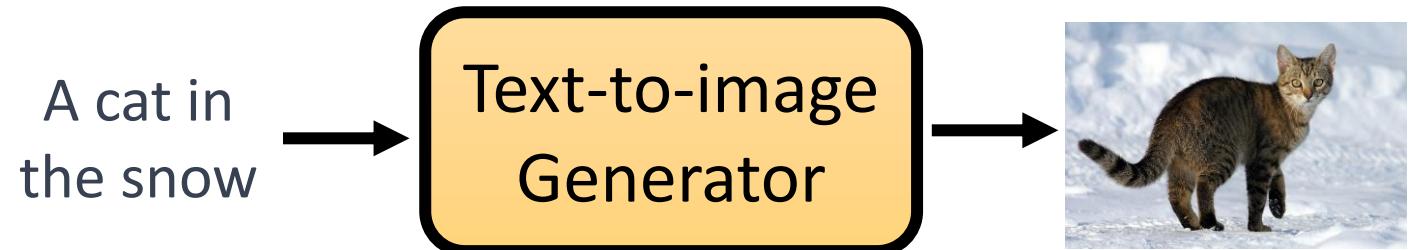
 Hinston cat

 網友挑戰「加幾筆畫出最創意貓咪圖片」，笑到岔氣後我出手

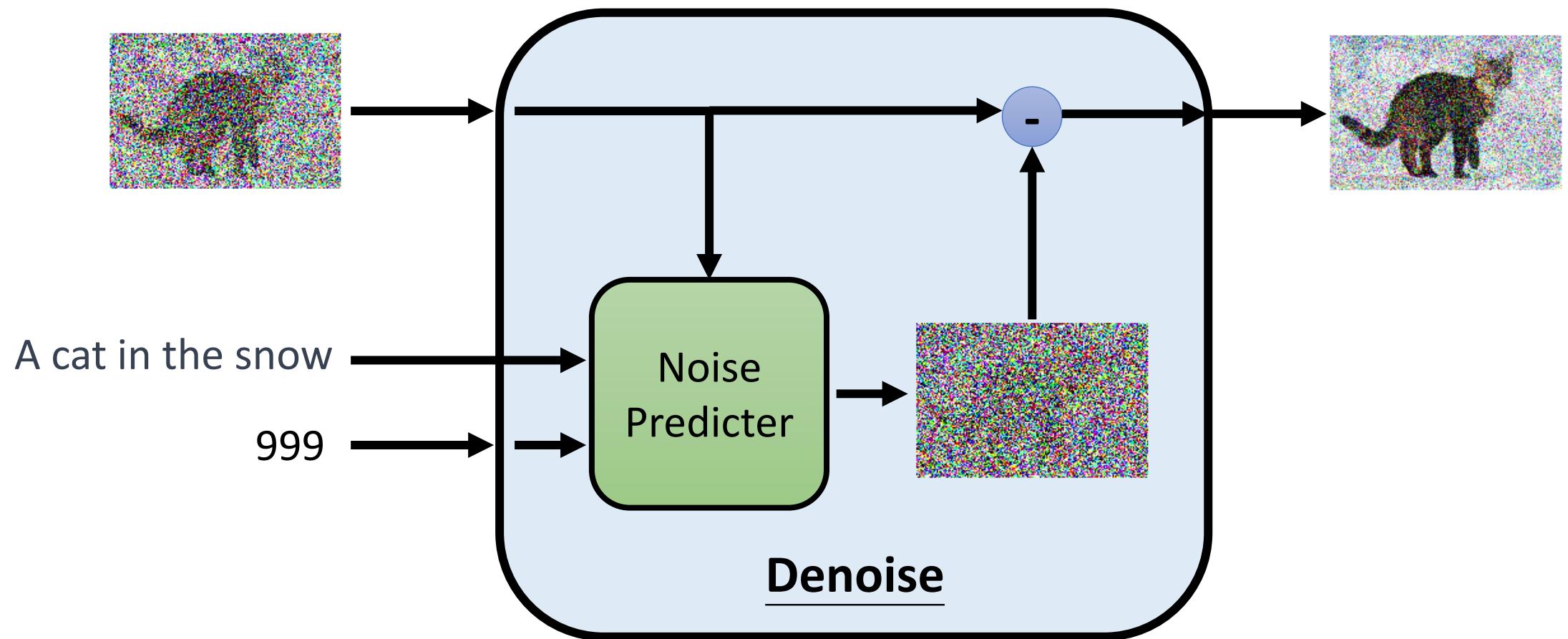
 cat in a suit Georgian sells tomatoes

イケ  
「トキ  
ト」  
NAVE

# Text-to-Image

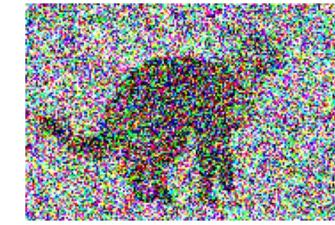


# Text-to-Image

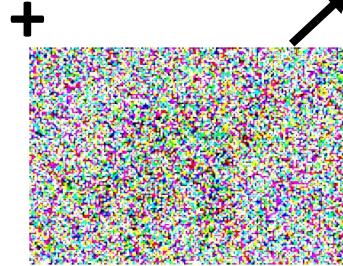


A cat in the snow

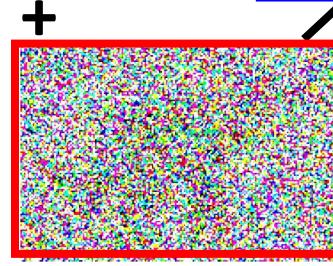
input



Random sample

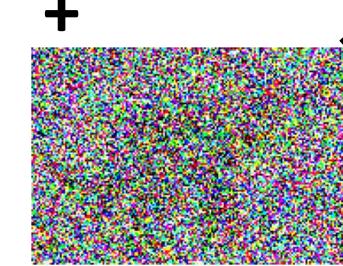


Step 1



Step 2 input

input  
ground  
truth

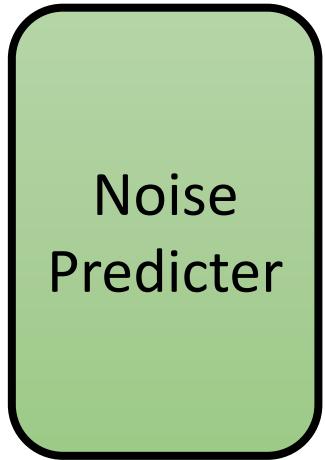


Step 1000

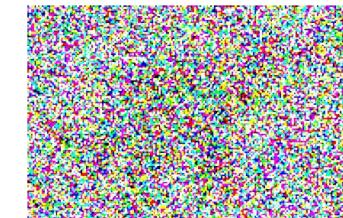


A cat in the snow

2



?????



# Denoising Diffusion Probabilistic Models

---

## Algorithm 1 Training

---

```
1: repeat
2:    $\mathbf{x}_0 \sim q(\mathbf{x}_0)$ 
3:    $t \sim \text{Uniform}(\{1, \dots, T\})$ 
4:    $\epsilon \sim \mathcal{N}(\mathbf{0}, \mathbf{I})$ 
5:   Take gradient descent step on
        $\nabla_{\theta} \|\epsilon - \epsilon_{\theta}(\sqrt{\bar{\alpha}_t} \mathbf{x}_0 + \sqrt{1 - \bar{\alpha}_t} \epsilon, t)\|^2$ 
6: until converged
```

---

---

## Algorithm 2 Sampling

---

```
1:  $\mathbf{x}_T \sim \mathcal{N}(\mathbf{0}, \mathbf{I})$ 
2: for  $t = T, \dots, 1$  do
3:    $\mathbf{z} \sim \mathcal{N}(\mathbf{0}, \mathbf{I})$  if  $t > 1$ , else  $\mathbf{z} = \mathbf{0}$ 
4:    $\mathbf{x}_{t-1} = \frac{1}{\sqrt{\alpha_t}} \left( \mathbf{x}_t - \frac{1 - \alpha_t}{\sqrt{1 - \bar{\alpha}_t}} \epsilon_{\theta}(\mathbf{x}_t, t) \right) + \sigma_t \mathbf{z}$ 
5: end for
6: return  $\mathbf{x}_0$ 
```

---

# Diffusion Model

Denoising Diffusion Probabilistic Models (DDPM)  
<https://arxiv.org/abs/2006.11239>