

Distilling Diffusion Models into Conditional GANs

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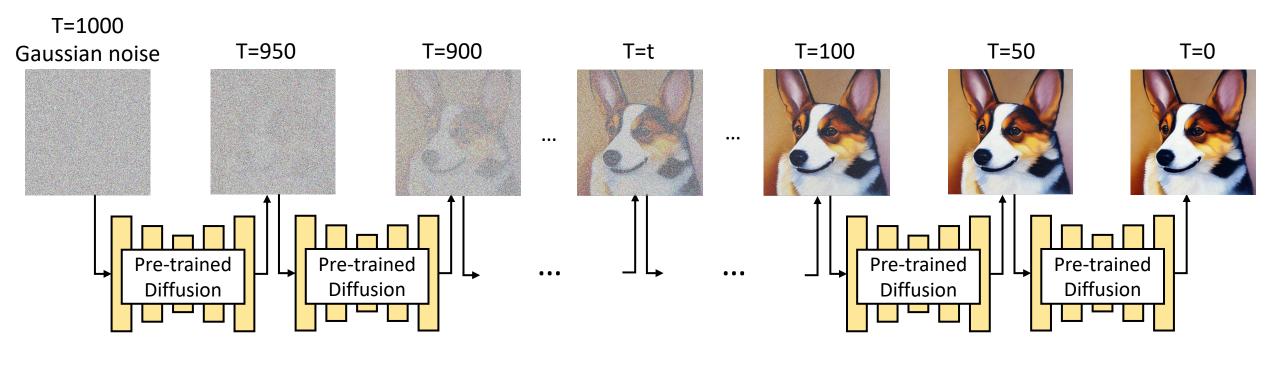




Carnegie Mellon University



What is diffusion model distillation

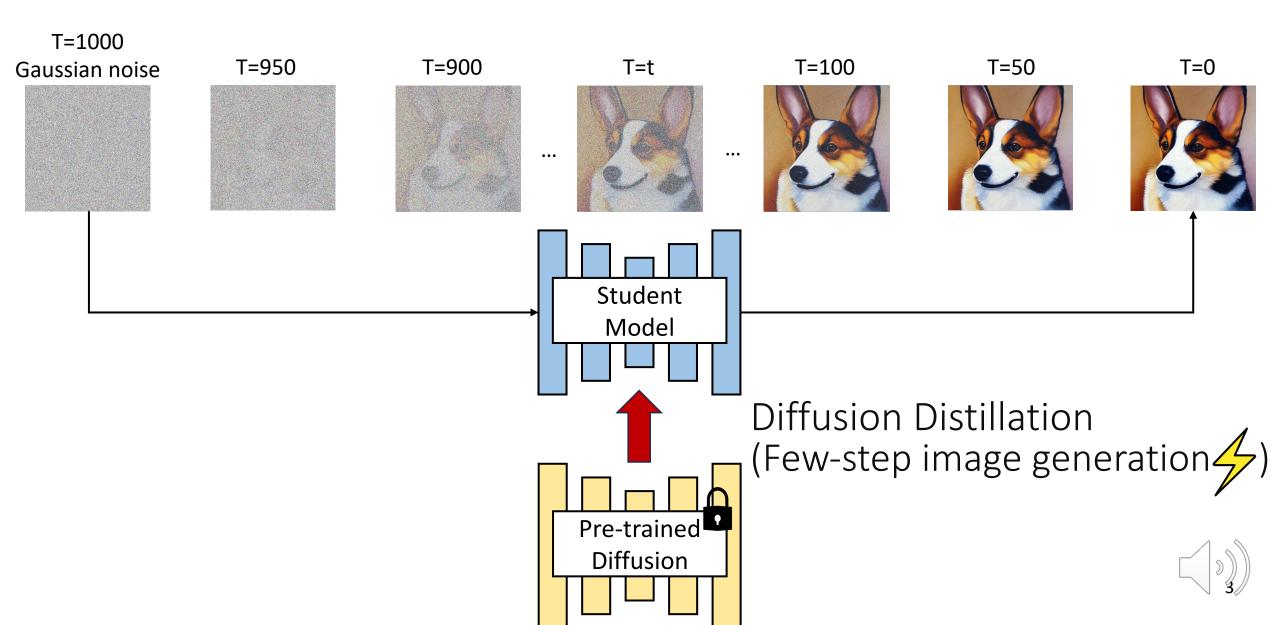


Requires 20~50 steps of denoising to generate a single image.



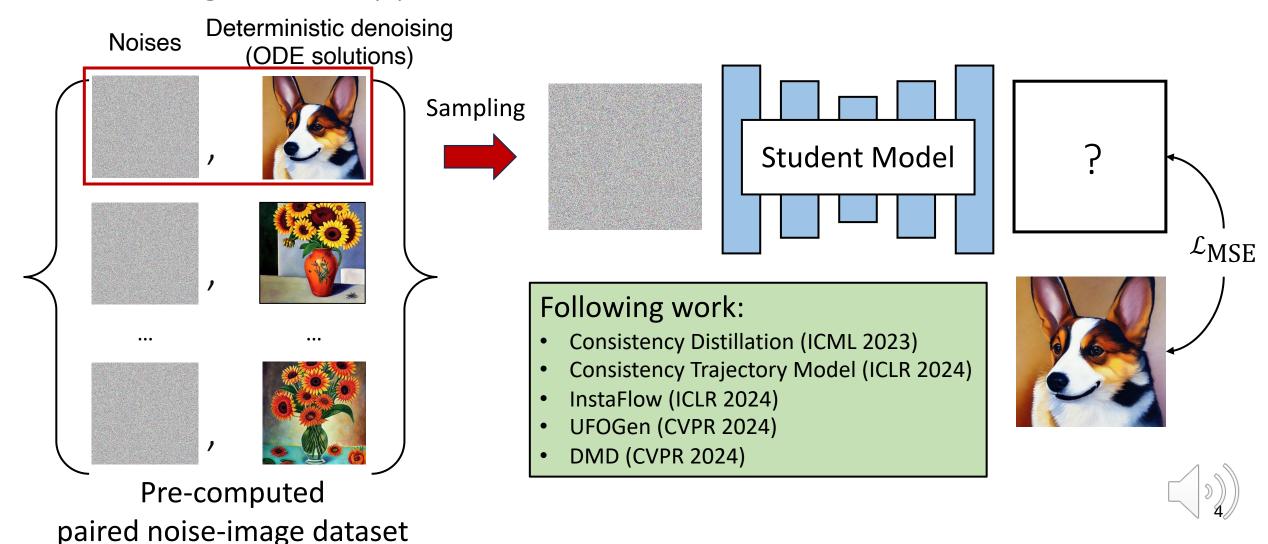


What is diffusion model distillation



How can we distill a diffusion model?

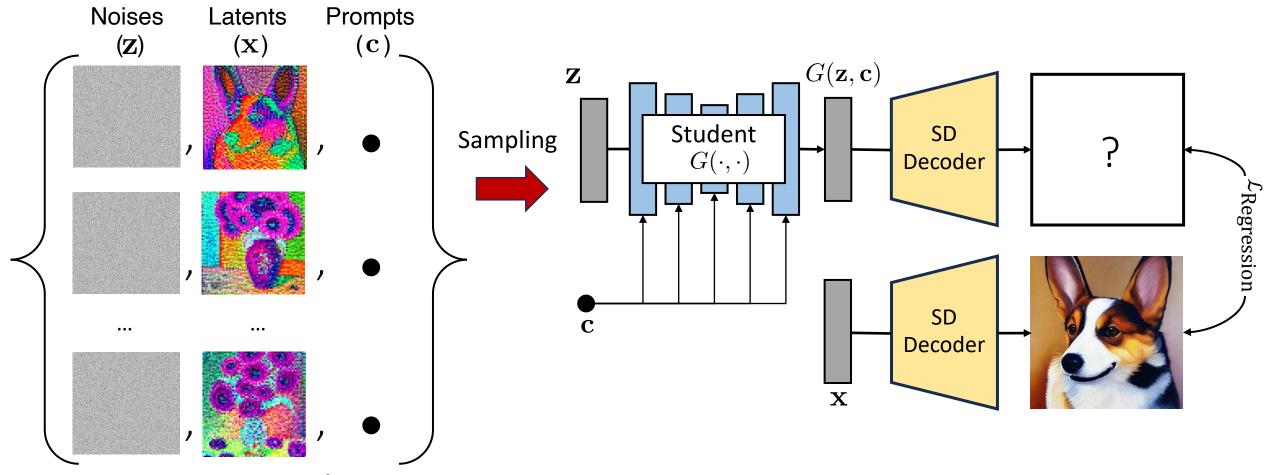
Direct regression approach: Luhman et al., 2021.



Is direct regression no longer not necessary?



Re-discovery of direct regression training



Pre-computed paired noise-latent-prompt dataset



Perceptual loss is what we need

Target

LPIPS Outputs









Loss function	img/sec	FID	CLIP-score
MSE	138.4	110.55	0.222
LPIPS	40.0	25.94	0.288



Direct regression using LPIPS = Good



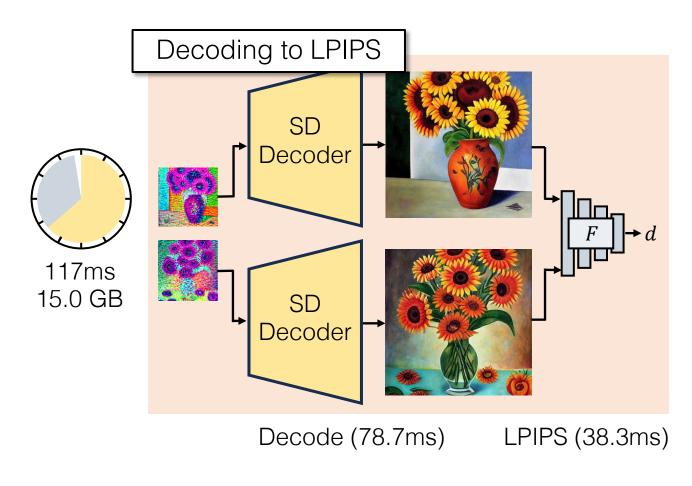
Pixel-space LPIPS is expansive.

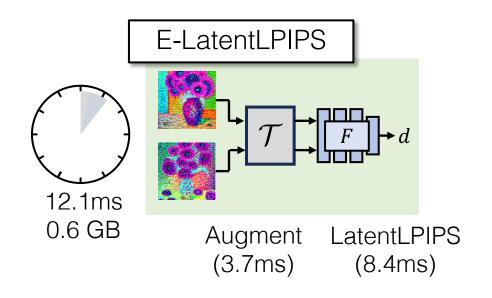


Decoding can introduce errors in LPIPS.



E-LatentLPIPS for efficient LPIPS

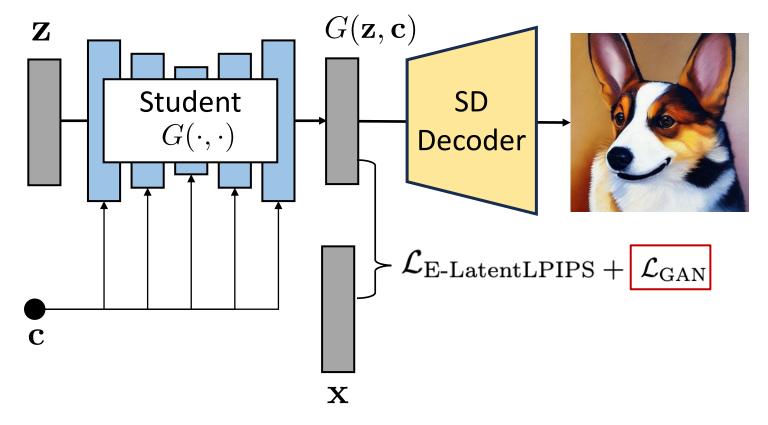




9.7× speedup achieved with E-LatentLPIPS! 4



View the distillation as image-to-image translation

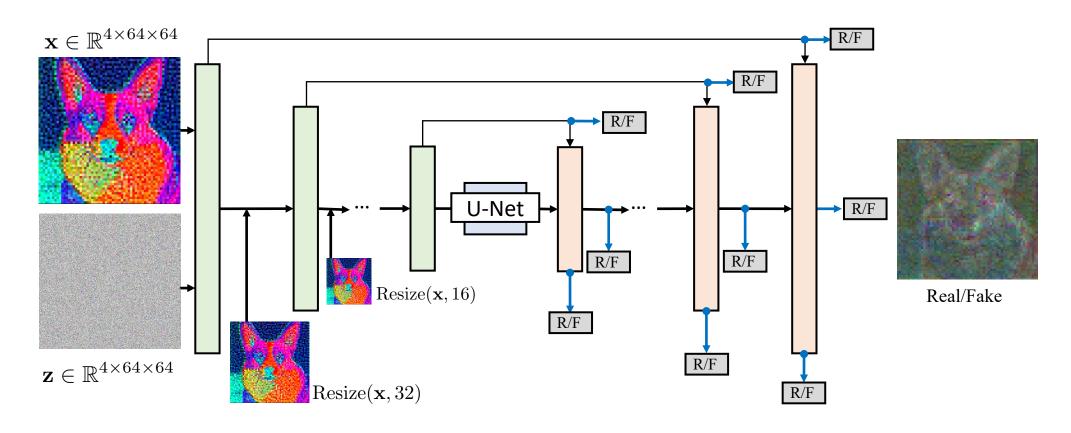


In practice, paired image translation yields better results when combined with conditional GAN losses.

(sources = noise & prompt, target = ODE solution)



Pre-trained diffusion as a strong discriminator



Multi-scale Input/output discriminator following GigaGAN.



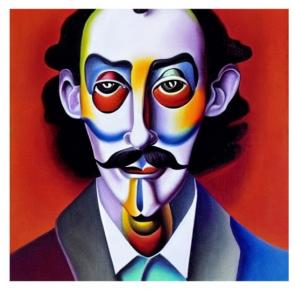
Visual comparison with previous models

Stable Diffusion 1.5



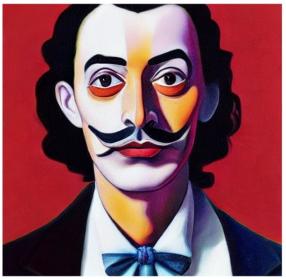
InstaFlow-0.9B

Diffusion2GAN















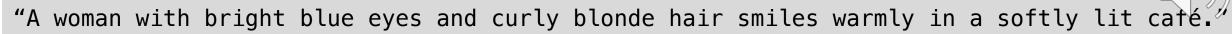




SDXL-Turbo (arXiv Nov., 2023)



Diffusion2GAN

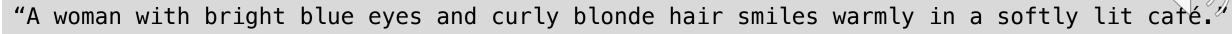




SDXL-Lightening (arXiv Feb., 2024)



Diffusion2GAN





SDXL-Turbo (arXiv Nov., 2023)



Diffusion2GAN



"A bald eagle made of chocolate powder, mango, and whipped cream"



SDXL-Lightening (arXiv Feb., 2024)



Diffusion2GAN



"A bald eagle made of chocolate powder, mango, and whipped cream"

Thank you! Please visit our webpage for more details.



