GANSpace: Discovering Interpretable GAN Controls

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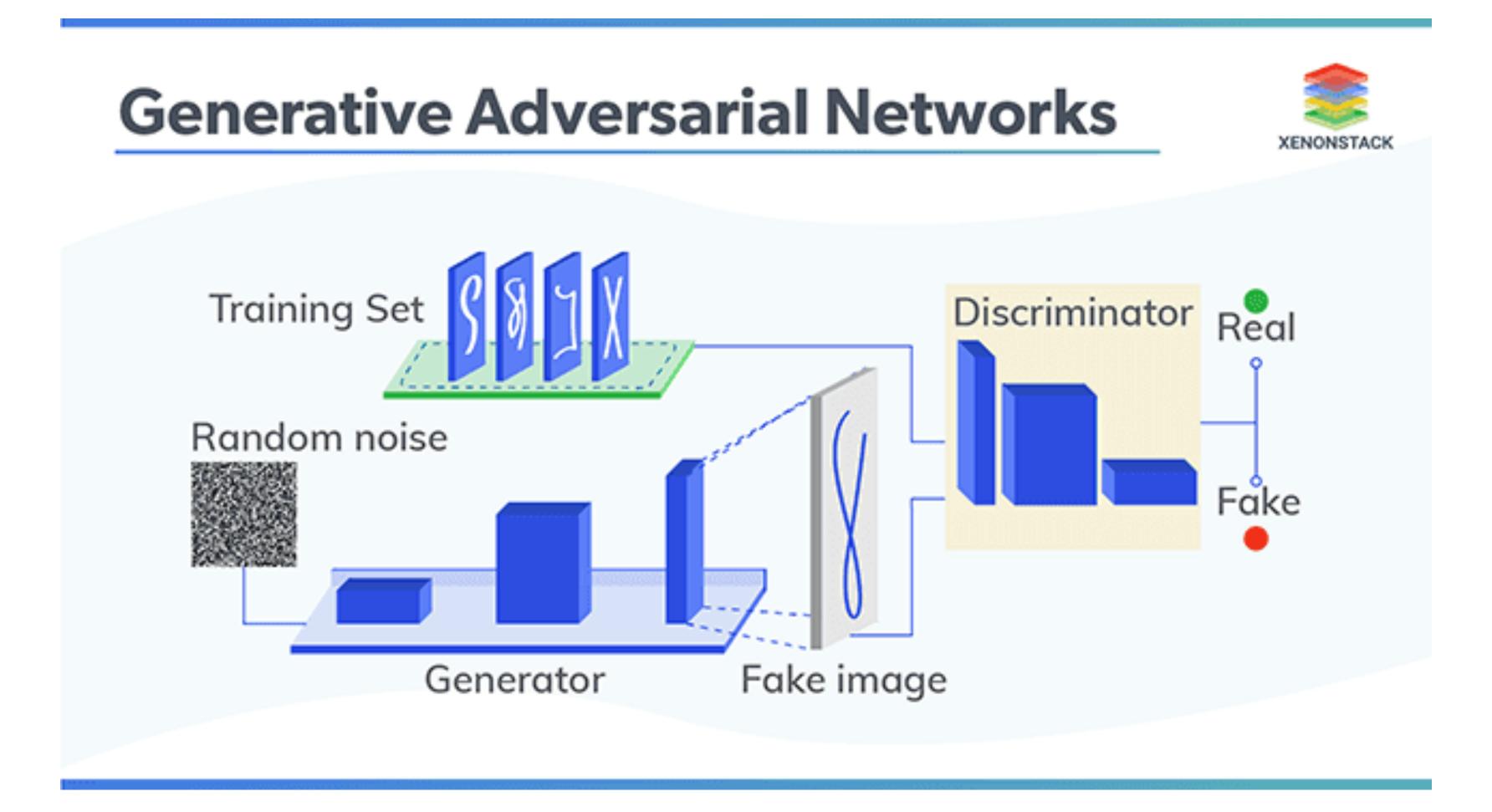
¹Aalto University ²Adobe Research

³NVIDIA

Slides by Nolan Dey

https://arxiv.org/pdf/2004.02546.pdf

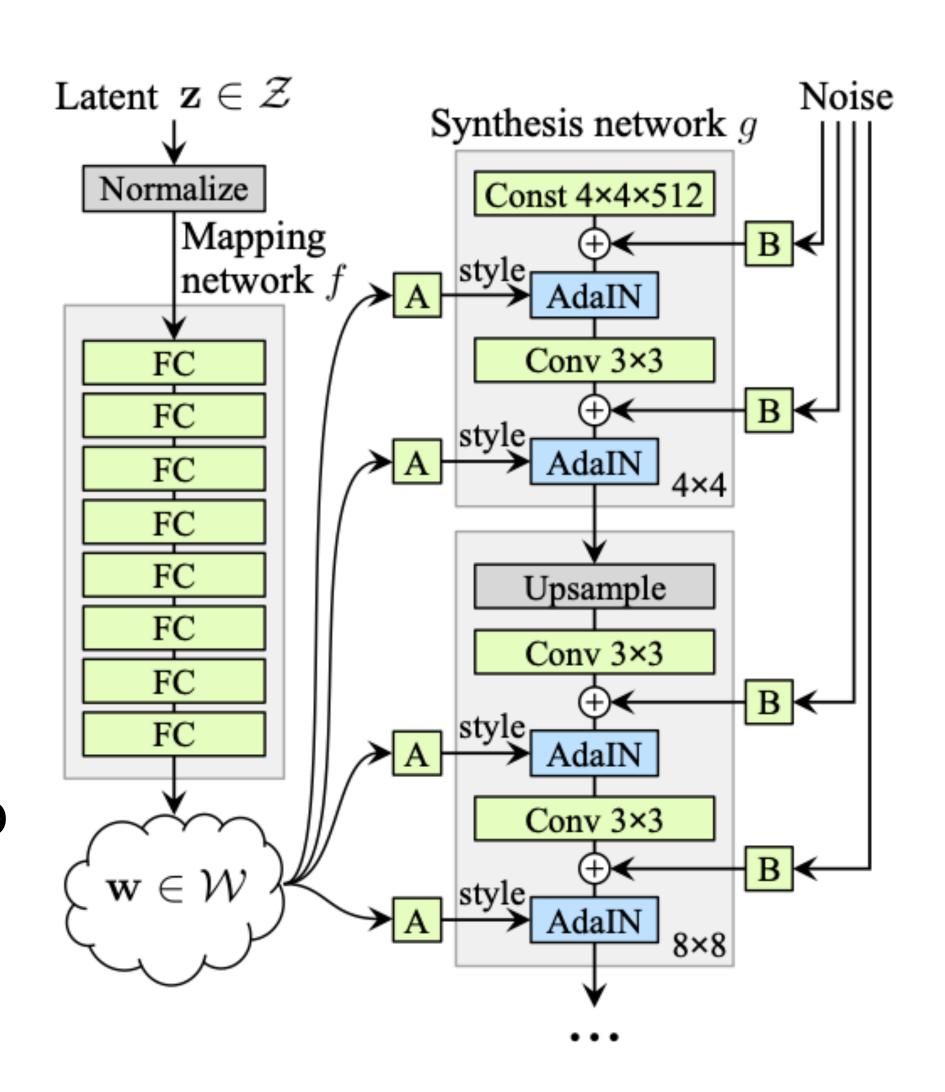
What is a GAN?



https://www.xenonstack.com/insights/generative-adversarial-networks/

StyleGAN

- Sample random points in Z
- Forward pass to get points in W
- Compute PCA in W
- Edit PCA component values are forward pass to control generated output



BigGAN

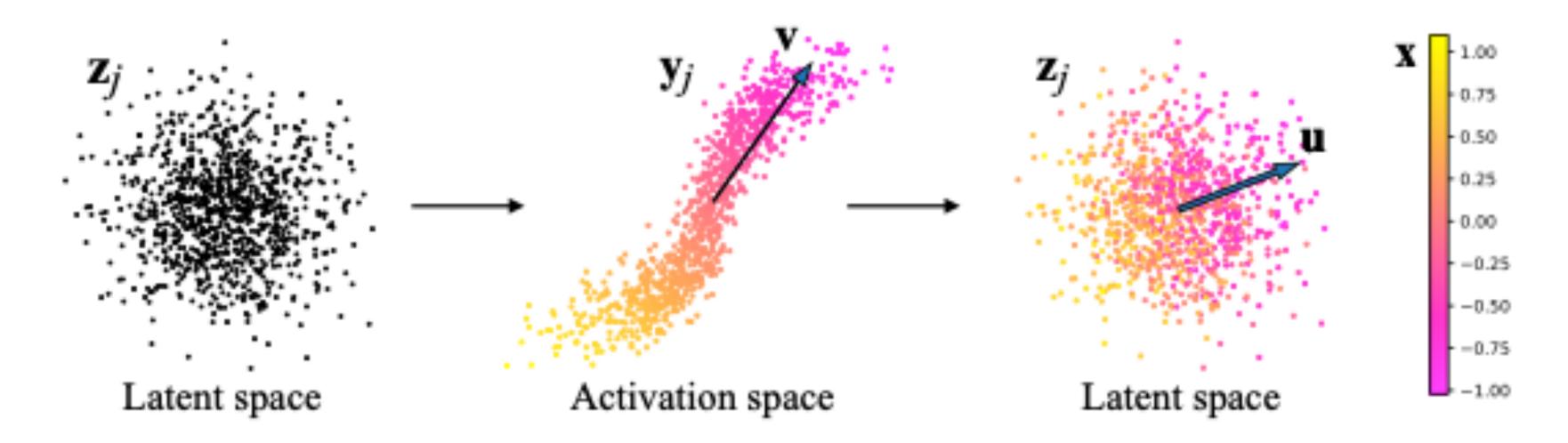


Figure 2: 2D Illustration of identifying a principal activation direction for BigGAN. Random latent vectors \mathbf{z}_j are sampled, and converted to activations \mathbf{y}_j . The PCA direction \mathbf{v} is computed from the samples, and PCA coordinates x_j computed, shown here by color-coding. Finally, back in the latent space, the direction \mathbf{u} is computed by regression from \mathbf{z}_i to x_j .

Discovering Interpretable GAN Controls

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Findings and results

- Earlier layers gave more useful controls than later layers
- disallowed combinations
 - wrinkles cannot be added to child's face
 - makeup and lipstick have little to no effect on male faces
- some entanglements were still observed
 - making a car more sporty causes a more open road background
 - more family car appears in woods or city streets
 - rotating dogs causes their mouths to open
- PCA components matched the edit directions from the GAN steerability paper

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Discussion Topics

- Do generative models learning similar image representations as discriminative networks?
- GANSpace for data augmentation
- Could we use GANSpace to develop natural adversarial edits?