

# **IMAGE-TO-IMAGE TRANSLATION** with **Deep Generative Models**

# INSTRUCTIONS

## Members

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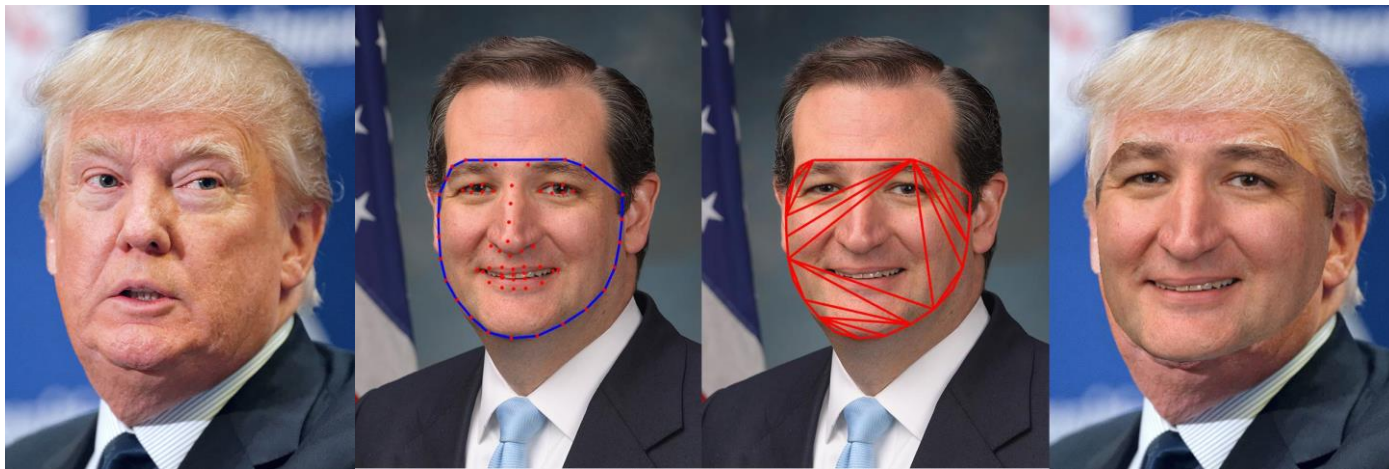
## Mission

Explore the possibilities of  
cutting edge technology in  
Image-to-Image translation

# **People Transformation**

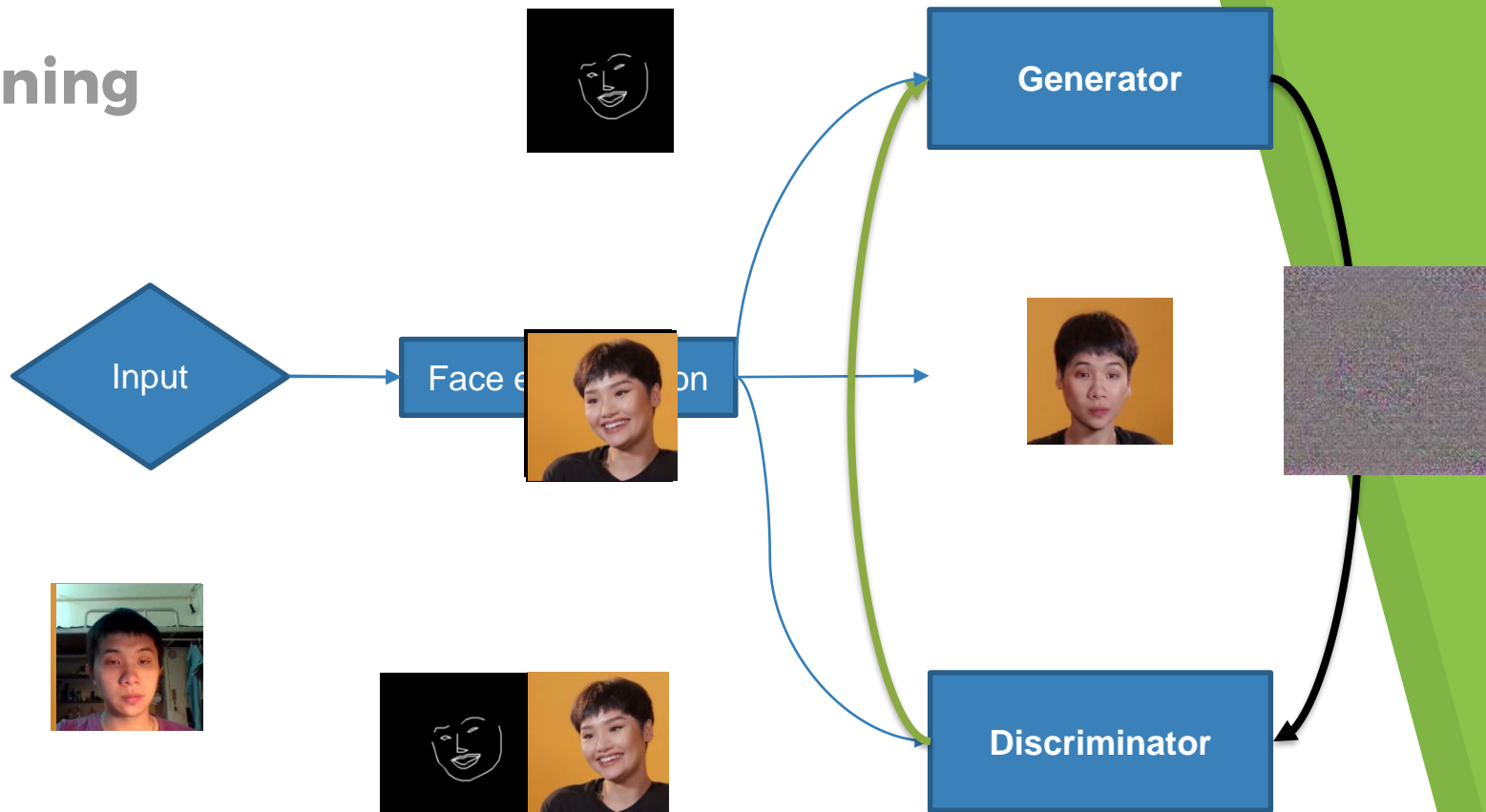
# **Hair replacement**

# Face swap

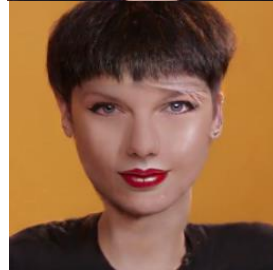


# Conditional GANs

## Training



# Hair replacement application



# **Video to video Translation**



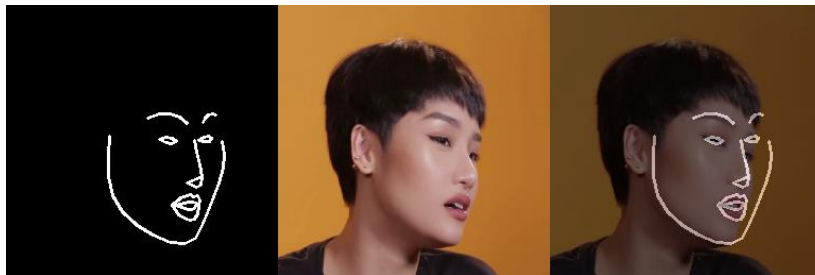
# Problem



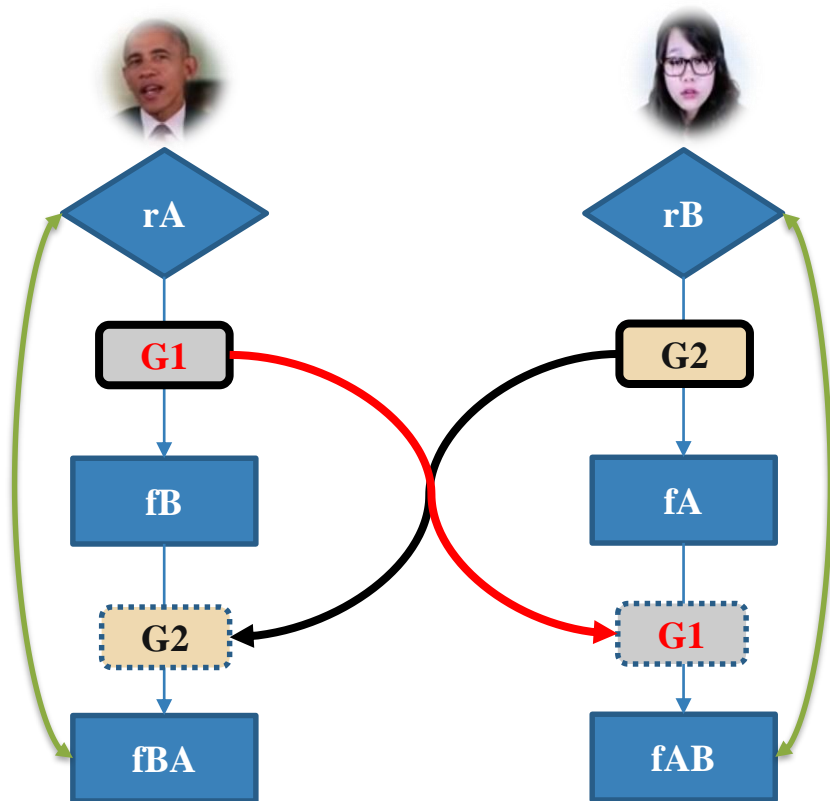
Shaking artifact

Unnatural face line

Incorrect inputs



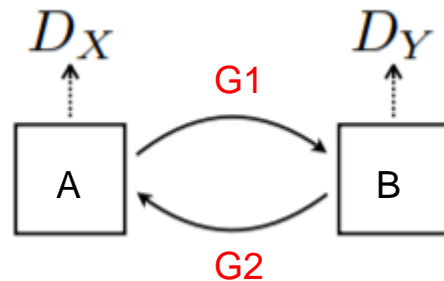
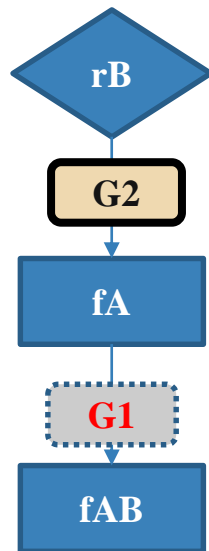
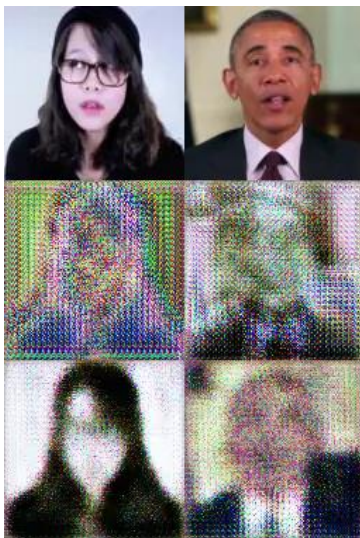
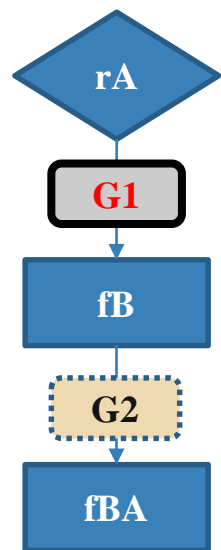
# Cycle GANs



GENERATOR 1	
Translate	A to B
Look like	B
Act like	A

GENERATOR 2	
Translate	B to A
Look like	A
Act like	B

# Cycle GANs



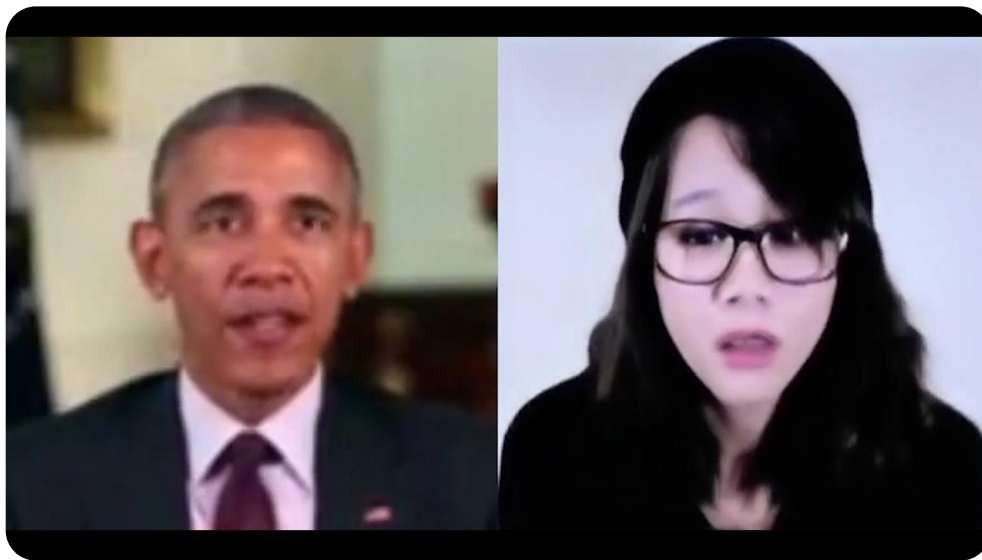
$$\mathcal{L}_{\text{cyc}}(G, F) = \mathbb{E}_{x \sim p_{\text{data}}(x)} [\|F(G(x)) - x\|_1] + \mathbb{E}_{y \sim p_{\text{data}}(y)} [\|G(F(y)) - y\|_1].$$

**Cycle Loss**

$$\begin{aligned} \mathcal{L}(G, F, D_X, D_Y) = & \mathcal{L}_{\text{GAN}}(G, D_Y, X, Y) \\ & + \mathcal{L}_{\text{GAN}}(F, D_X, Y, X) \\ & + \lambda \mathcal{L}_{\text{cyc}}(G, F), \end{aligned}$$

**Total Loss**

# Cycle GANs



**INPUT**

**TARGET**



# APPLICATION

SAMPLE 01



OVERCAST BEACH  
(Original)

...SHIFTED TOWARD SUNNY

## HORSE TO ZEBRA

# REFERENCE

[1] Image-to-Image Translation with Conditional Adversarial Networks

*<https://arxiv.org/pdf/1611.07004.pdf>*

[2] Deep Residual Learning for Image Recognition

*<https://arxiv.org/abs/1512.03385>*

[3] *Unpaired Image-to-Image Translation using Cycle-Consistent Adversarial Networks*

*<https://arxiv.org/abs/1703.10593>*

[4] U-Net: Convolutional Networks for Biomedical Image Segmentation

*<https://arxiv.org/pdf/1505.04597.pdf>*

Thank you