



# Lecture 1: Introduction

Jun-Yan Zhu

16-726, Spring 2023

# Jun-Yan Zhu



Carnegie  
Mellon  
University



- Computer Vision, Computer Graphics, Machine Learning, Computational Photography
- Love pets (cat & dog)
- Gaming (mostly FIFA these days)

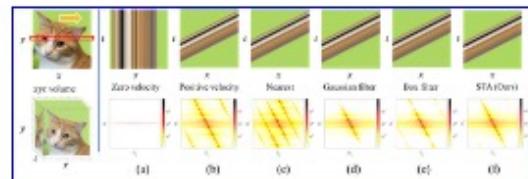


# Cat Paper Collection

As reported by Cisco, 90% of net traffic will be visual, and indeed, most of the visual data are cat photos and videos. Thus, understanding, modeling, and synthesizing our feline friends becomes a more and more critical research problem these days, especially for our cat lovers.

*Cat Paper Collection* is an academic paper collection that includes computer graphics, computer vision, and machine learning papers that produce experimental results related to **cats**. If you would like to add/remove an article, please send an email to **Jun-Yan Zhu** (junyanz at cs dot cmu dot edu). We thank all the authors for their contribution and support.

See also [GitHub](#) | [CSV file](#)

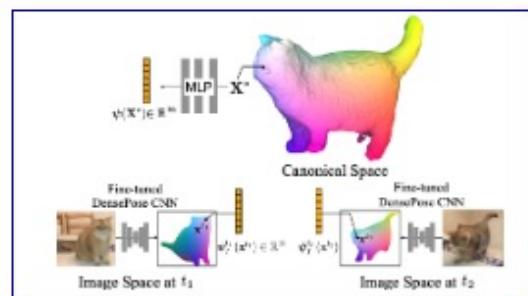


## Learning Spatio-Temporal Downsampling for Effective Video Upscaling

Xiaoyu Xiang, Yapeng Tian, Vijay Rengarajan, Lucas Young, Bo Zhu, Rakesh Ranjan

In ECCV 2022

[\[Paper\]](#)

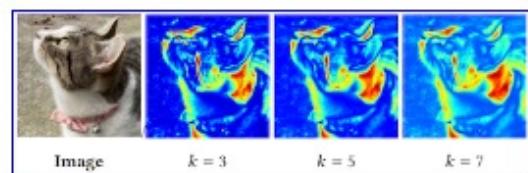


## BANMo: Building Animatable 3D Neural Models from Many Casual Videos

Gengshan Yang, Minh Vo, Natalia Neverova, Deva Ramanan, Andrea Vedaldi, Hanbyul Joo

In CVPR 2022

[\[Paper\]](#) [\[Project\]](#)



## HIME: Efficient Headshot Image Super-Resolution with Multiple Exemplars

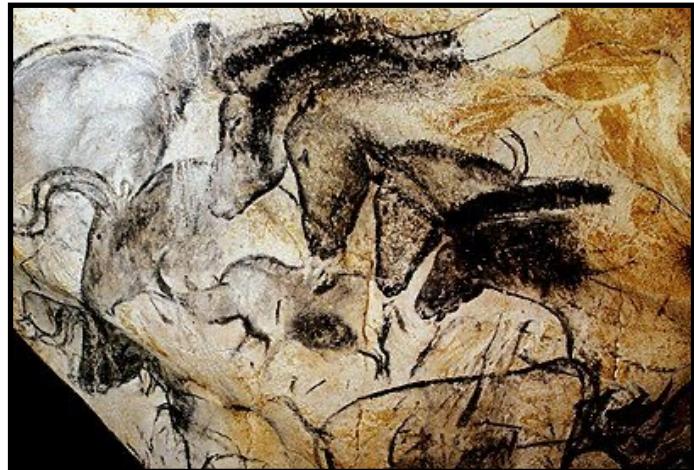
Xiaoyu Xiang, Jon Morton, Fitsum A Reda, Lucas Young, Federico Perazzi, Rakesh Ranjan, Amit Kumar, Andrea Colaco, Jan Allebach

In ArXiv 2022

[\[Paper\]](#)

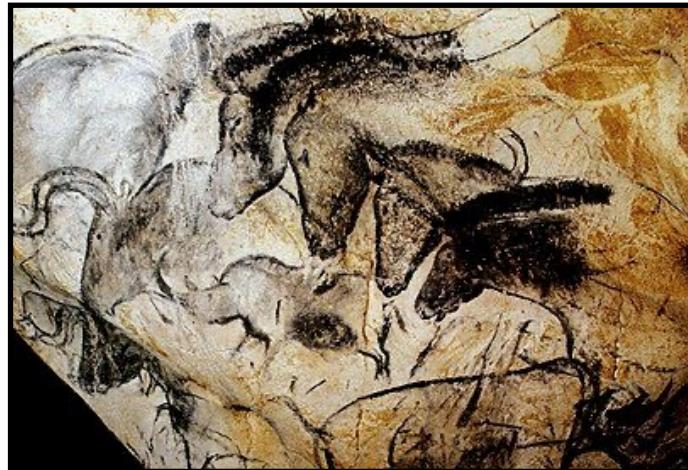
# Visual Content Creation

Cave art

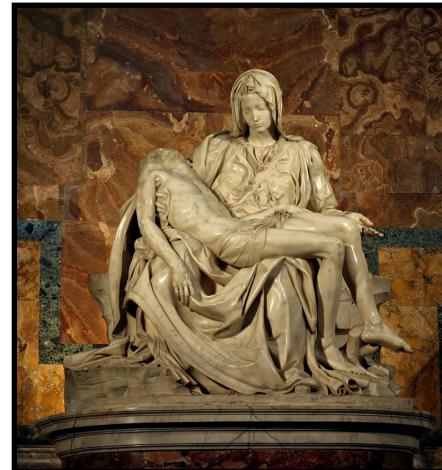


# Visual Content Creation

Cave art



Sculpture



Painting



Time

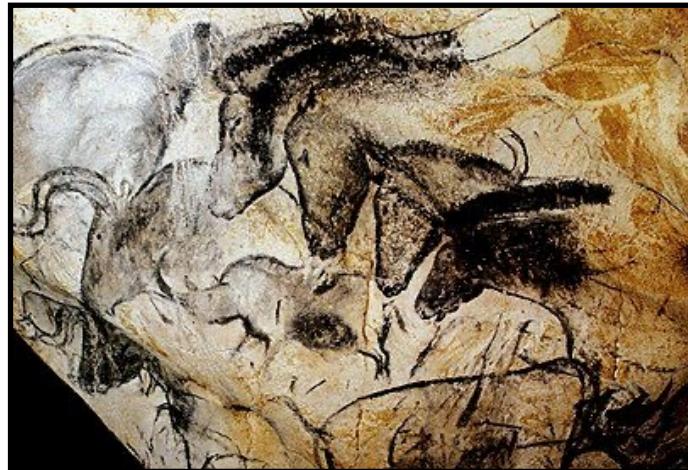
32,000 BC

1498

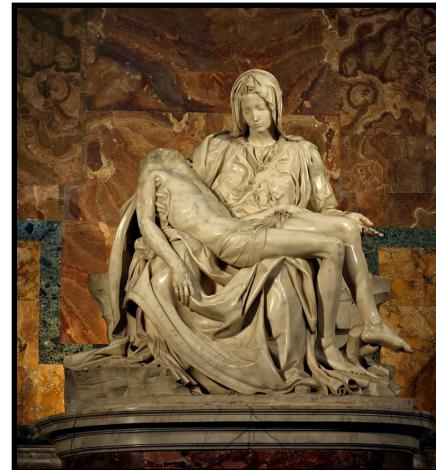
1872

# Visual Content Creation

Cave art



Sculpture



Painting



Computer Graphics



Time

32,000 BC

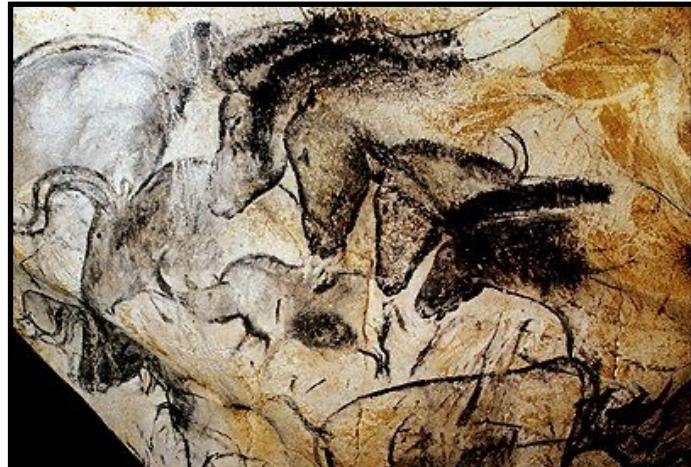
1498

1872

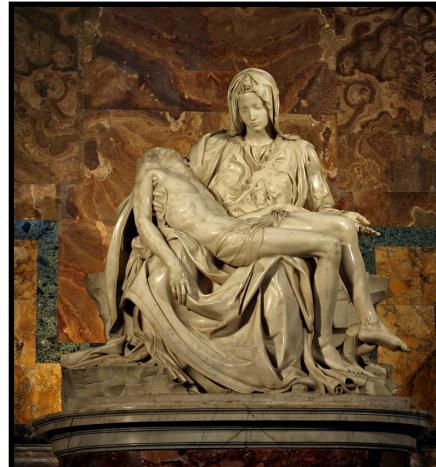
2012

# Who is creating visual content?

Cave art



Sculpture



Painting



Computer Graphics



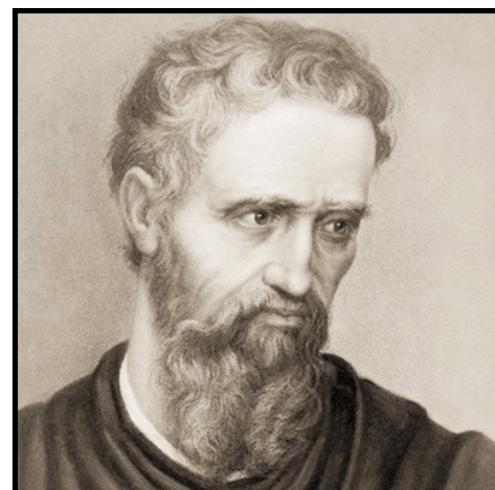
Time

32,000 BC

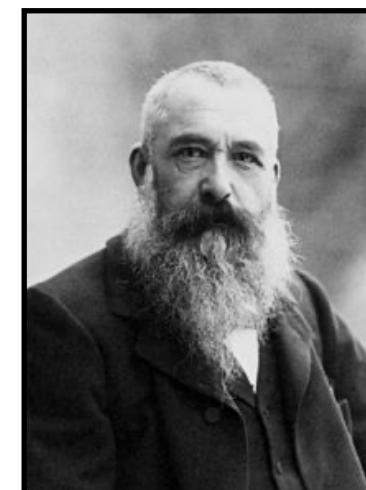
1498

1872

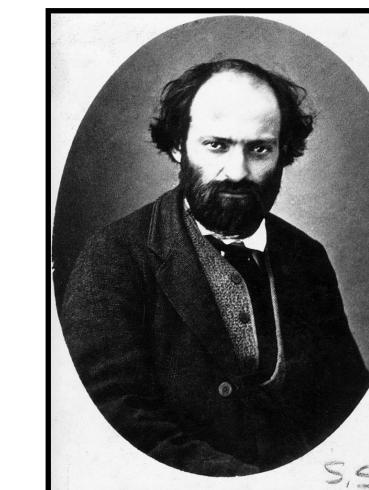
2012



Michelangelo



Claude Monet



Paul Cezanne

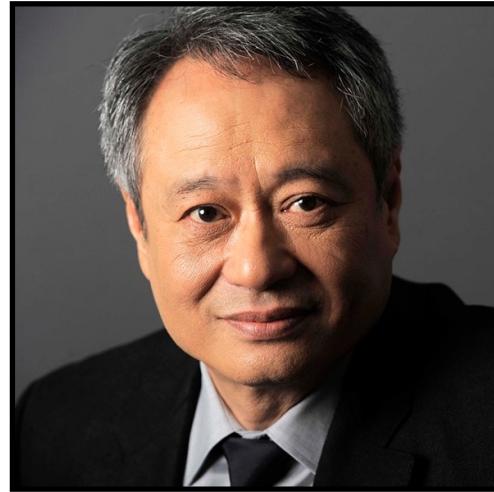


George Lucas

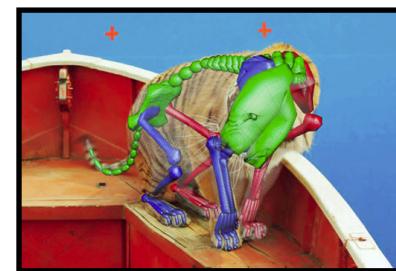


Ang Lee

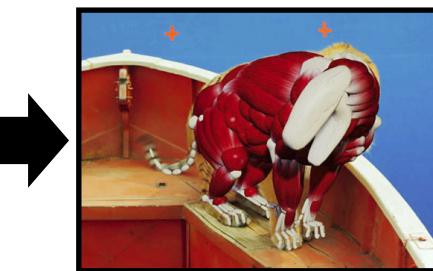
# Who is creating visual content?



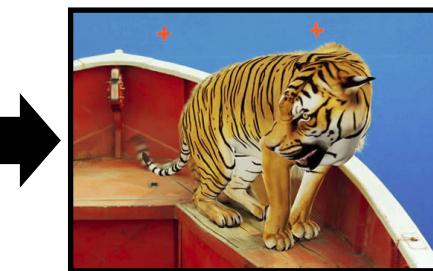
Ang Lee



Skeleton



Geometry



Texture



Details



Image



Idea



100+ visual artists  
12 months  
\$60+ million



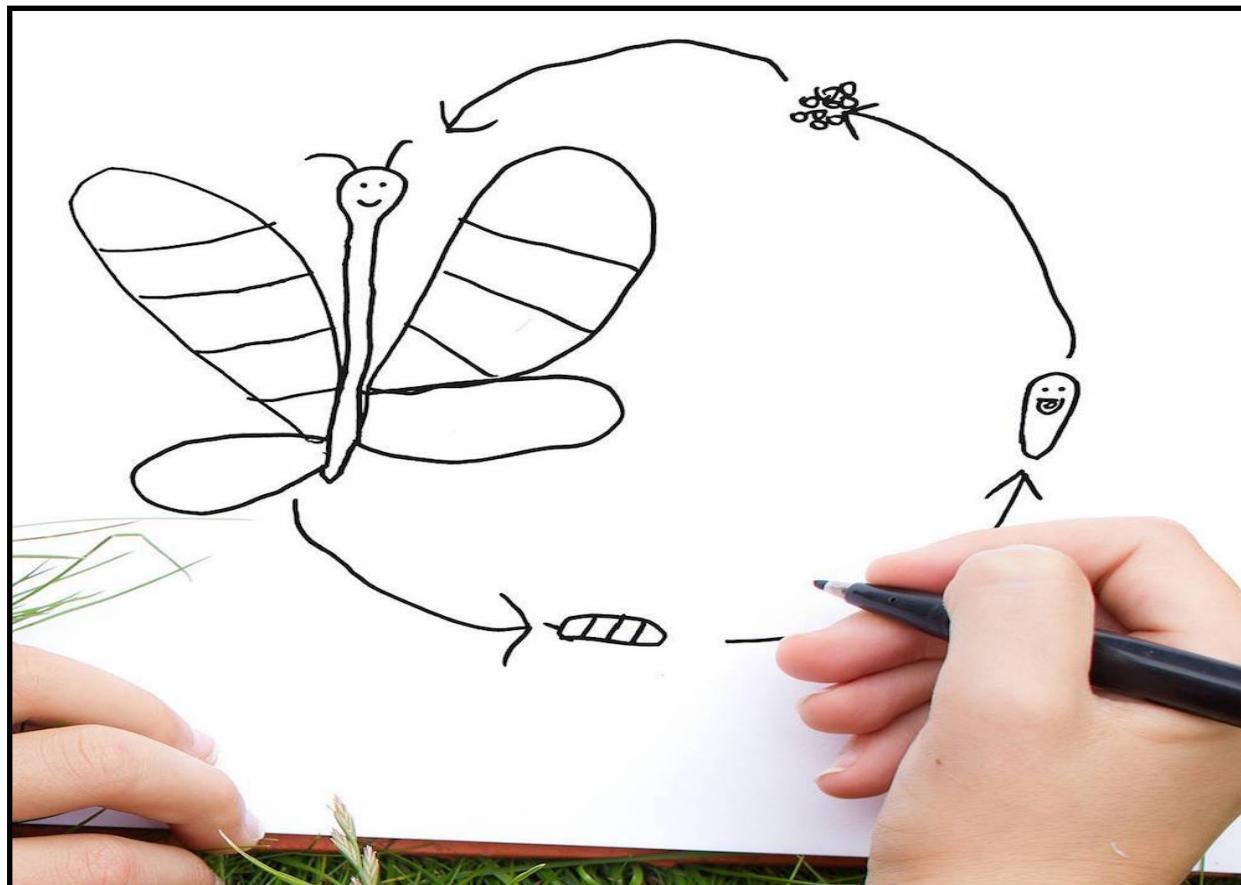
Visual Content

# Who is creating visual content?

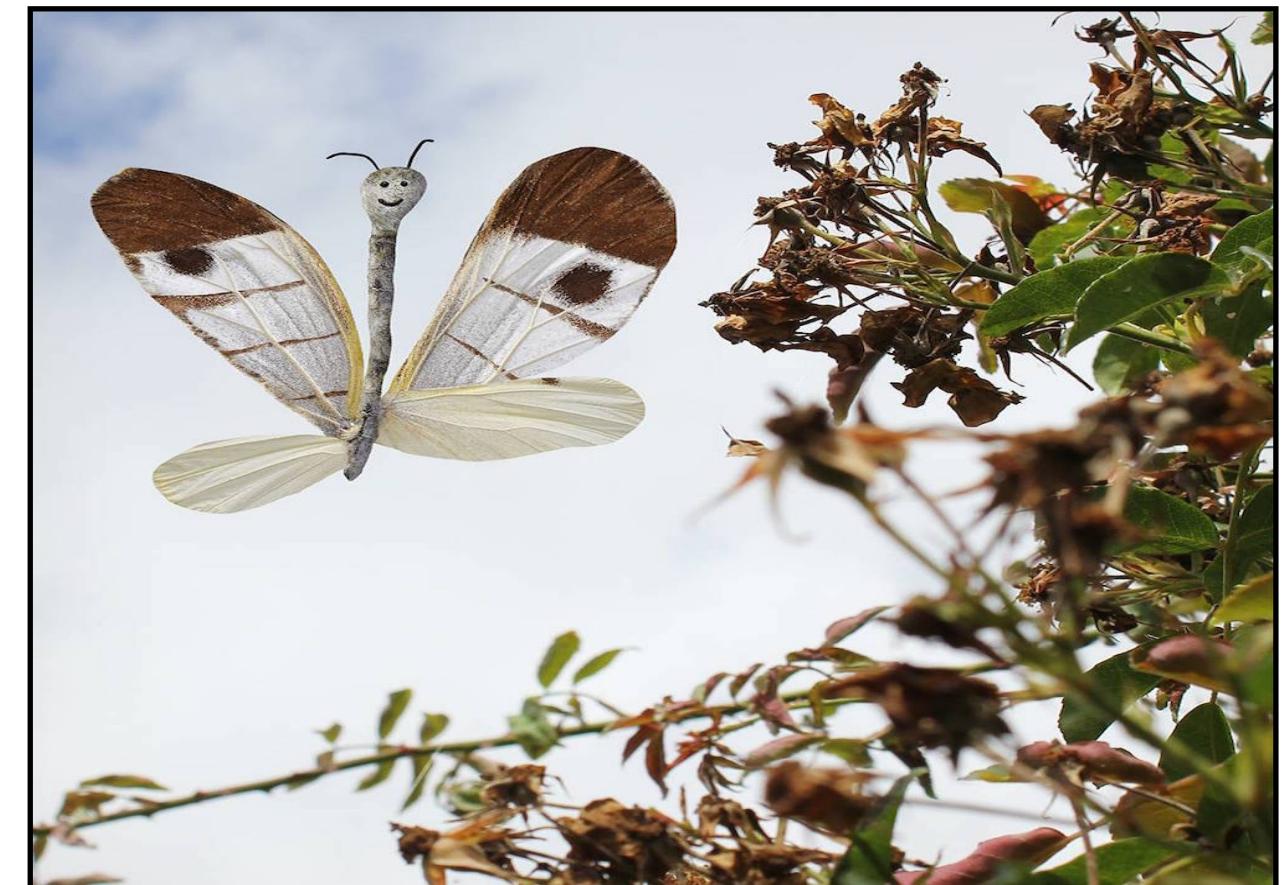
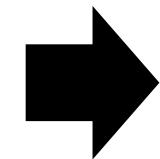
Homework

09/27/2003

# Who is creating visual content?



Kid's drawing



Photoshop result by his father

# Creating Visual Realism Manually



CG office



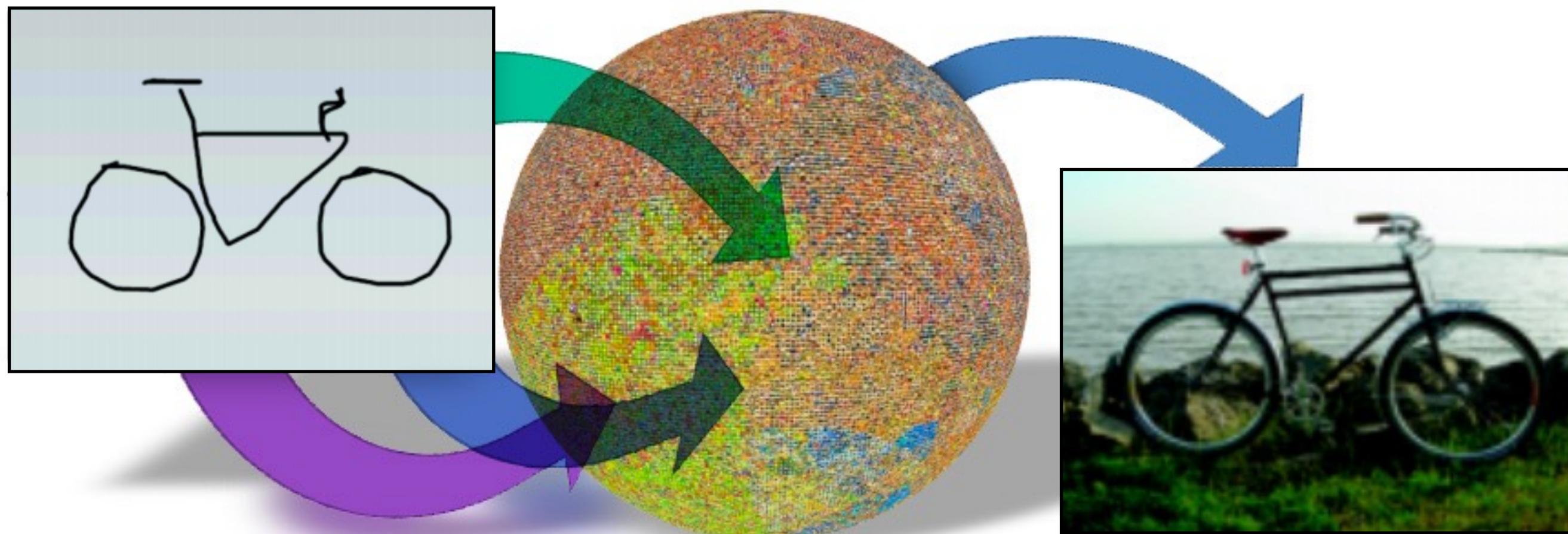
CG office (more details)



My advisor's office  
11

# Data-Driven Graphics (2000s)

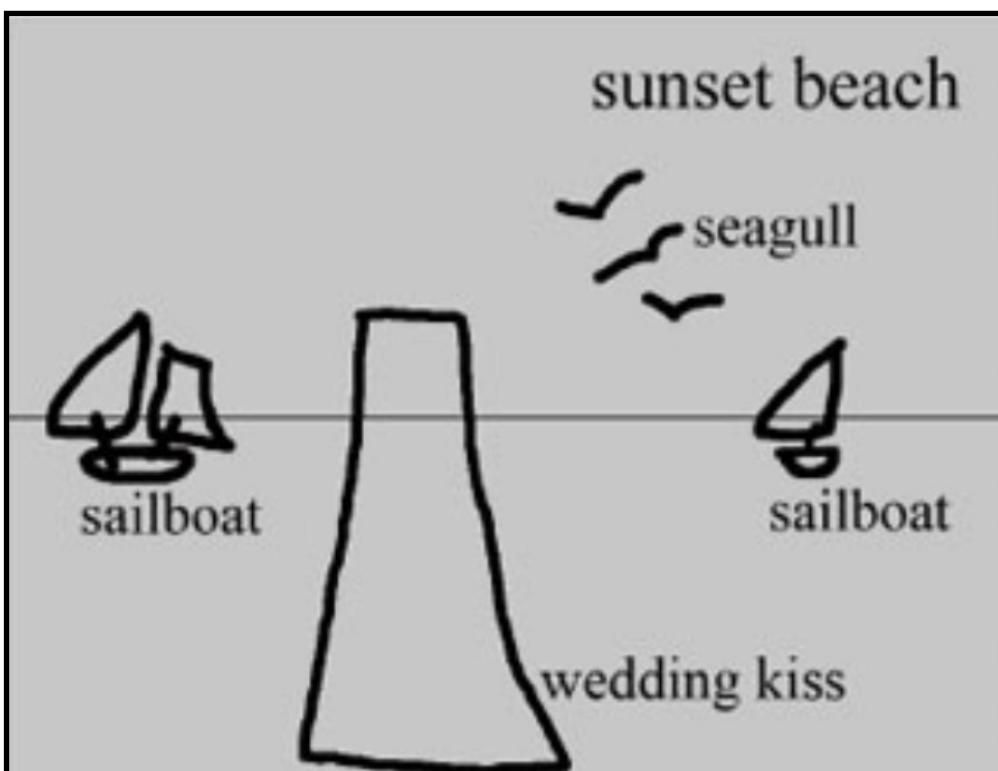
Graphics → Image Retrieval



Picture from James<sup>12</sup> Hays

# Data-Driven Graphics (2000s)

Compositing multiple parts



User Input



Database images



Output

# Data-Driven Graphics (2000s)

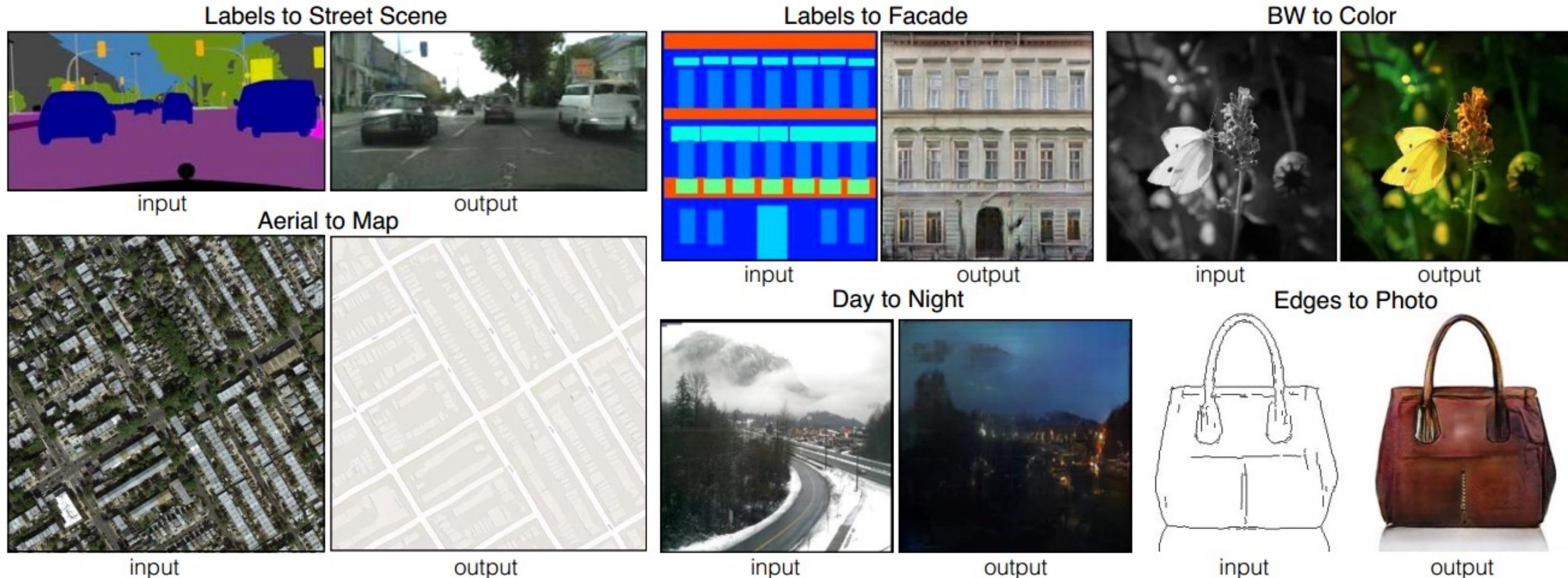


- Hard to combine pieces
- No understanding of visual realism

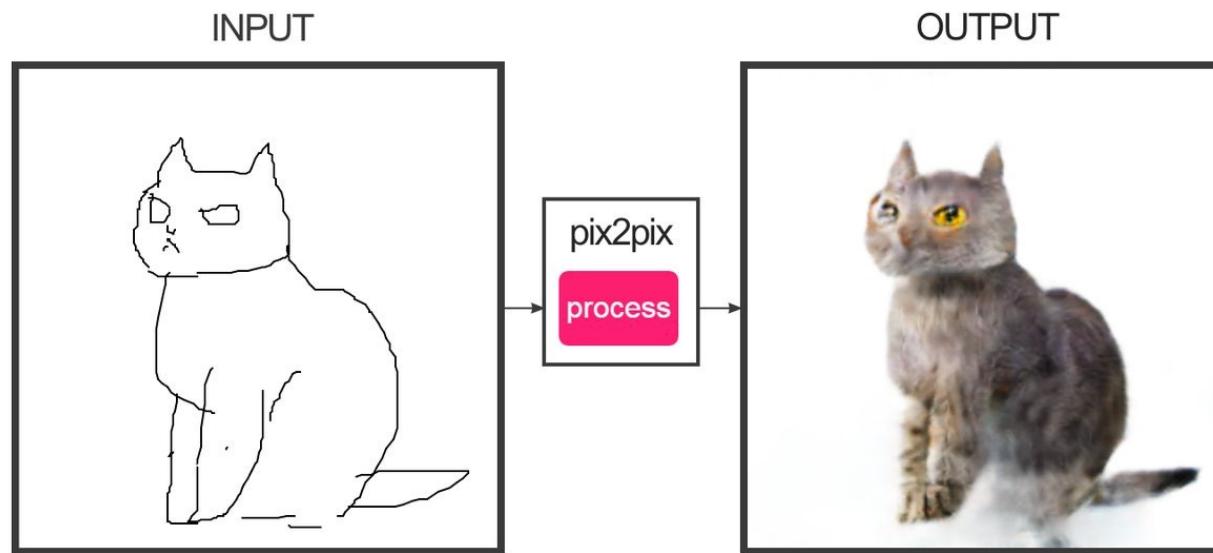
Help everyone  
easily create visual content

Teach machines  
how to create realistic content

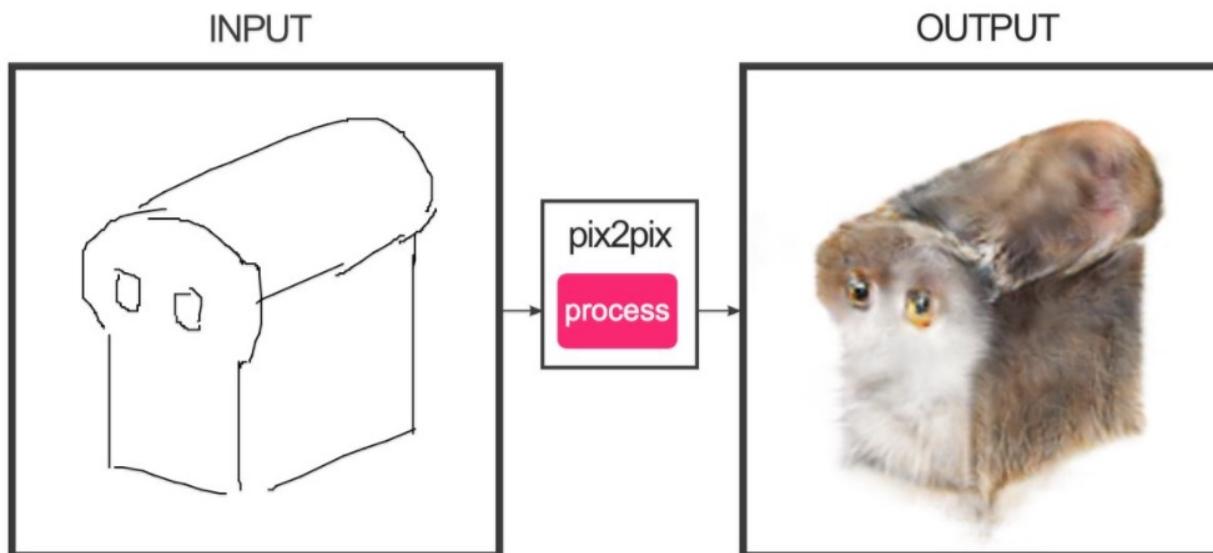
# Image-to-Image Translation with pix2pix



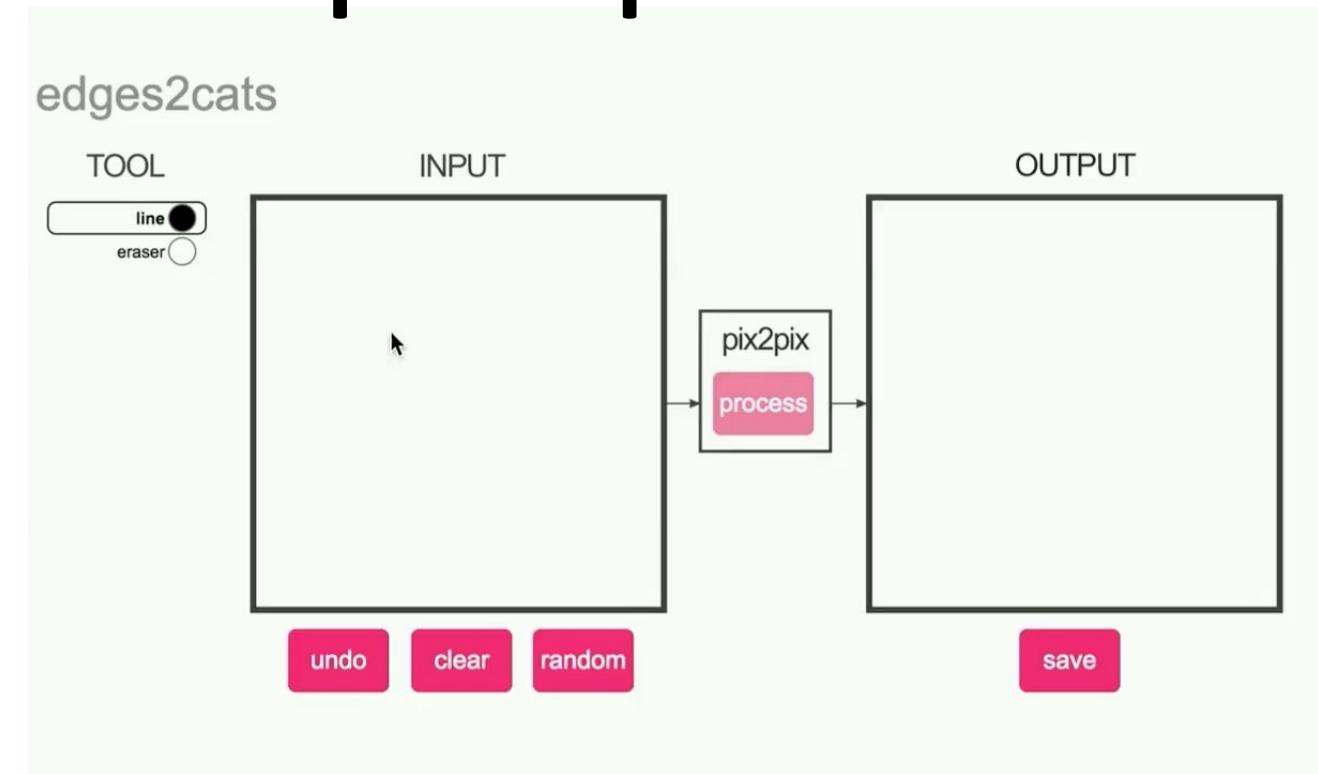
# #edges2cats with pix2pix



@gods\_tail



Ivy Tasi @ivymyt



@matthematician

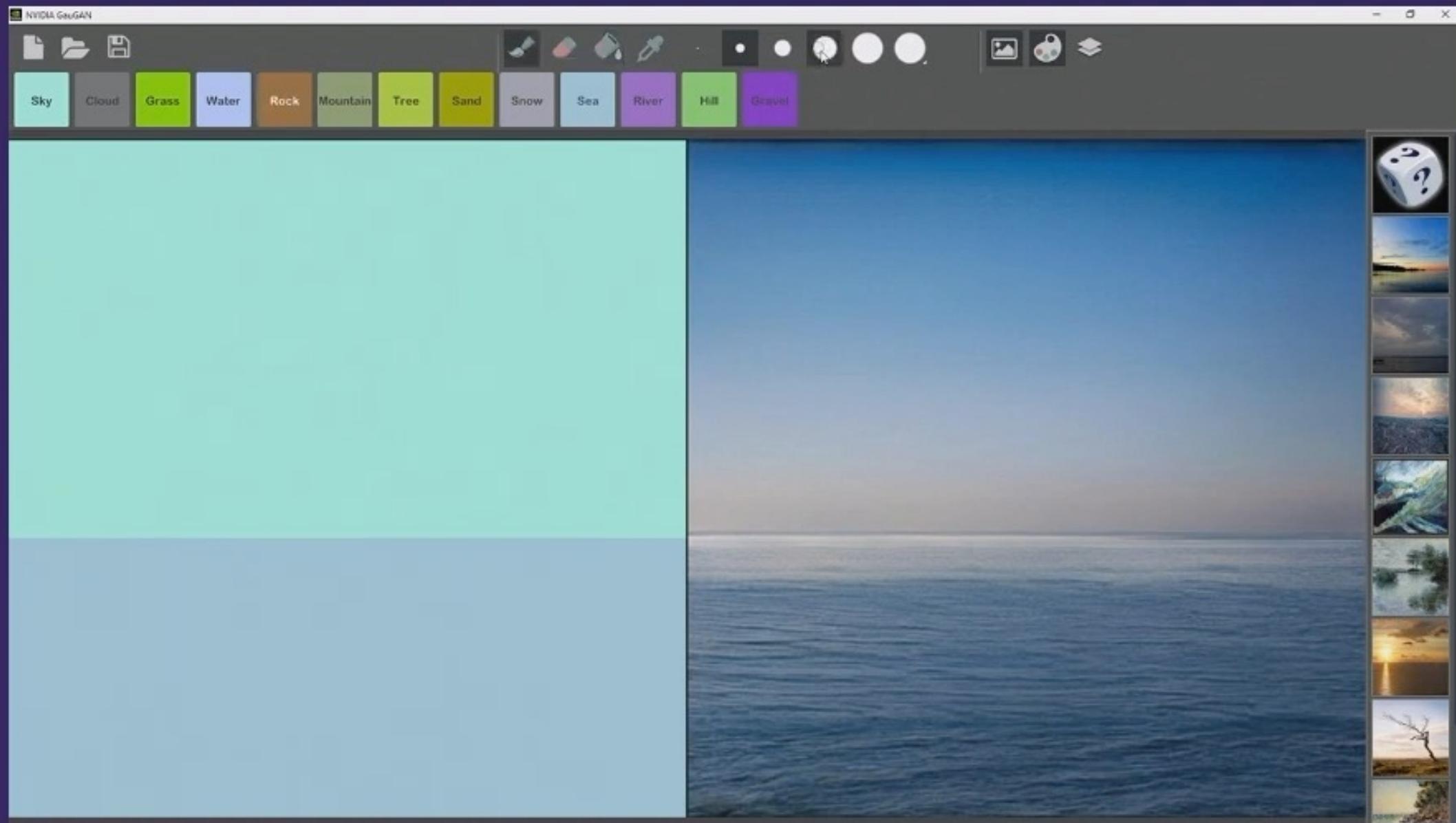


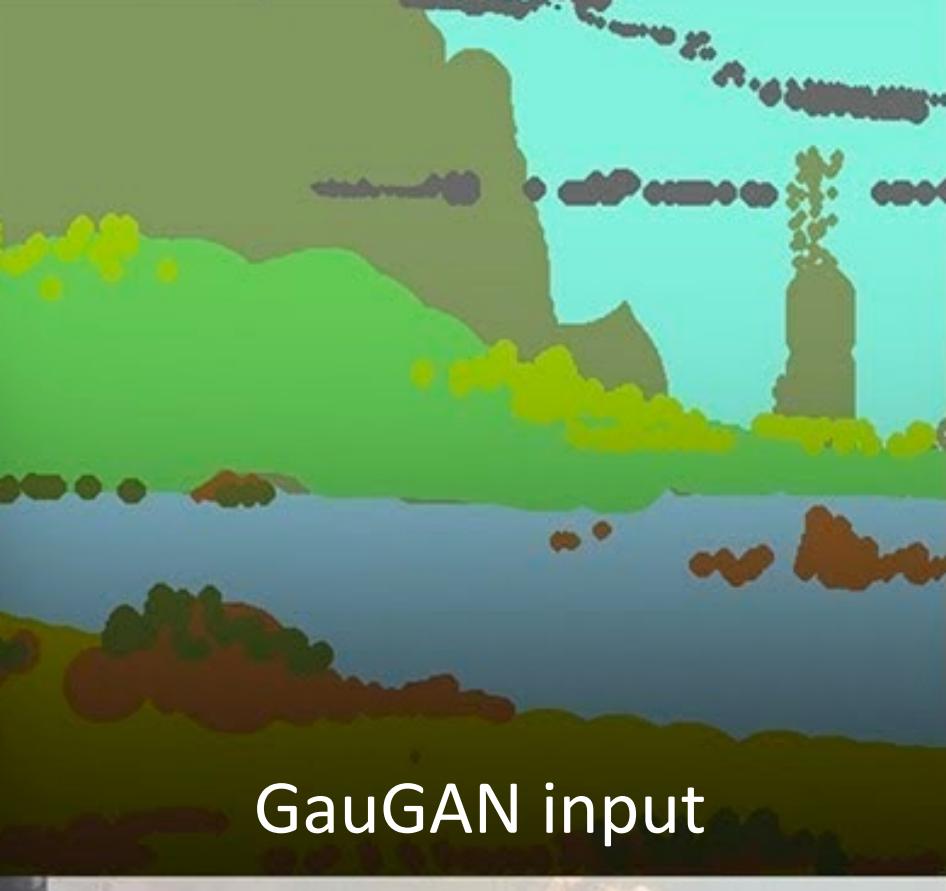
Vitaly Vidmirov @vvid

By Christopher Hesse

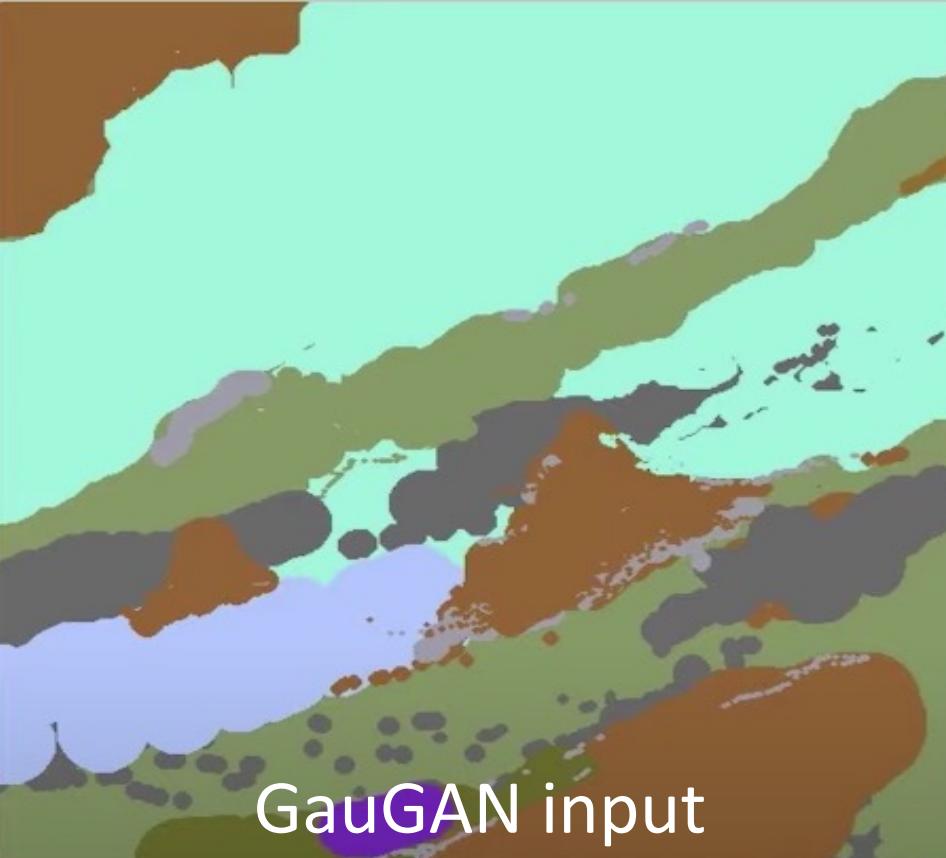
<https://affinelayer.com/pixsrv/>

# GauGAN [Park, Liu, Wang, Zhu. 2019]

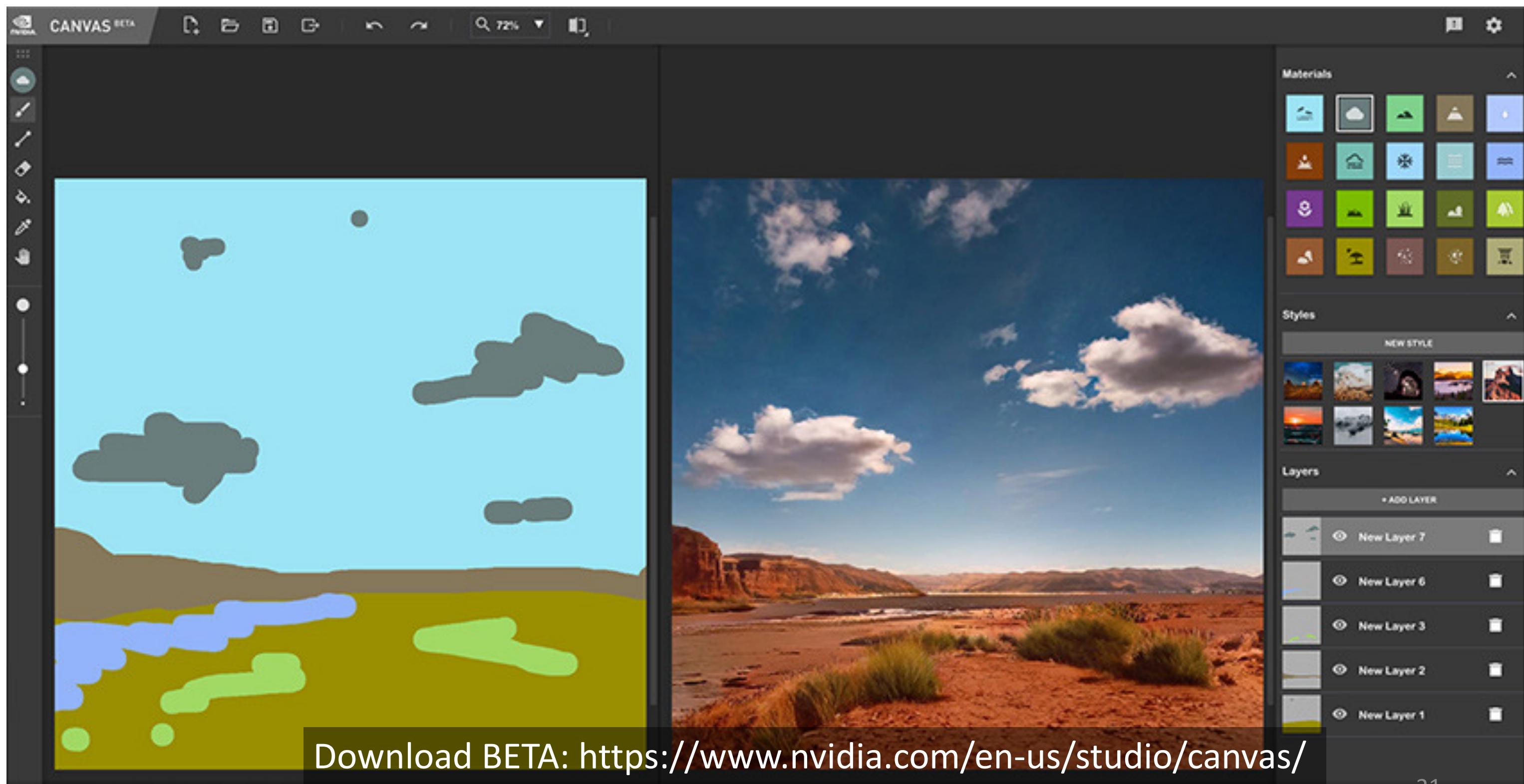




By Darek Zabrocki, Concept Designer and Illustrator



By Darek Zabrocki, Concept Designer and Illustrator <sup>20</sup>



# Collection Style Transfer



Photograph ©Alexei Efros



Monet

Van Gogh



Cezanne



Ukiyo-e

# Monet's paintings → photographic style



# Horse → Zebra

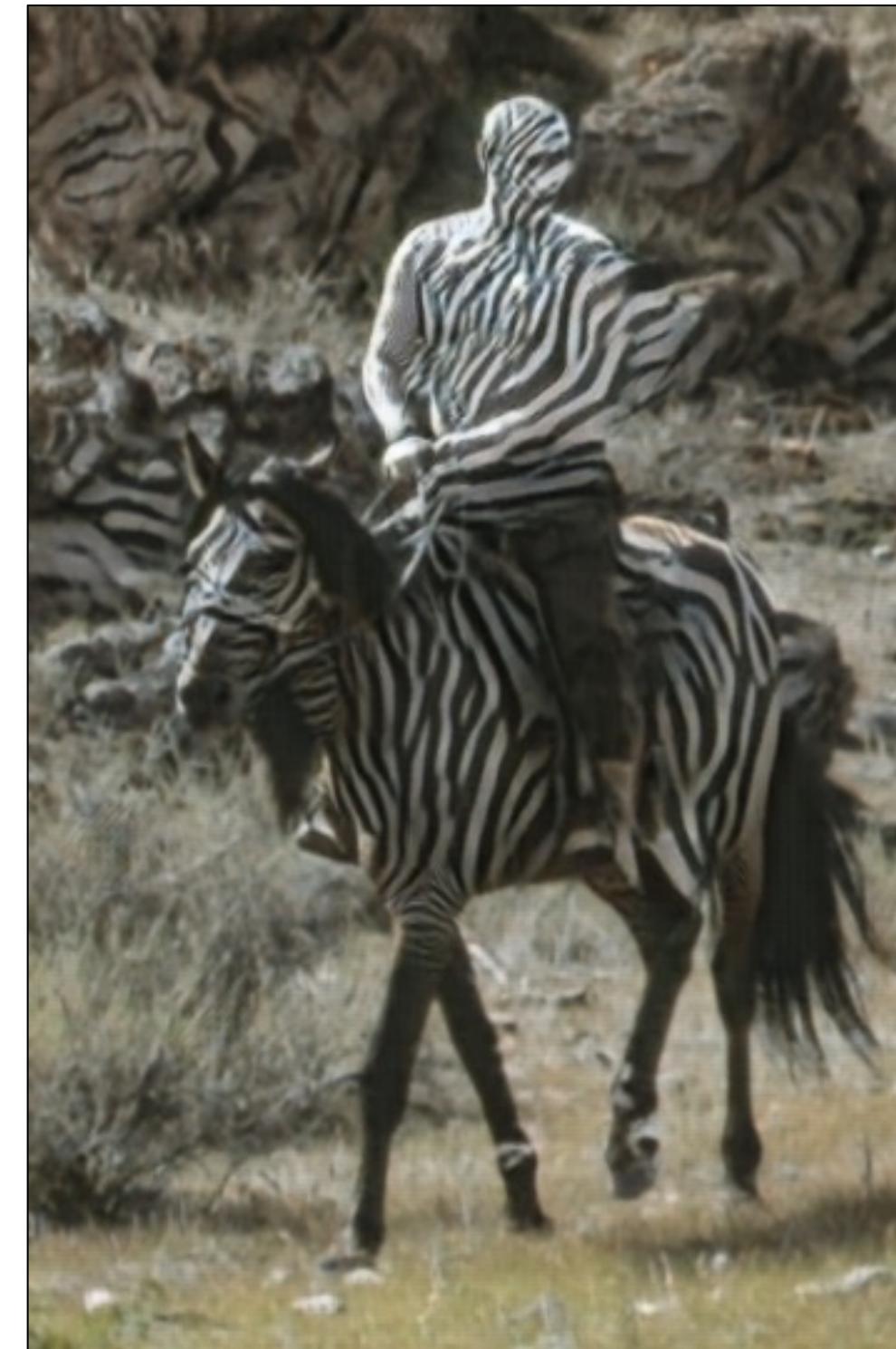


CycleGAN [Zhu, Park, Isola, Efros. 2017]

# Failure case



# Failure case



# Swapping Autoencoder For Deep Image Manipulation

Taesung Park<sup>1</sup>, Jun-Yan Zhu<sup>2</sup>, Oliver Wang<sup>2</sup>, Jingwan Lu<sup>2</sup>, Eli Shechtman<sup>2</sup>, Alexei Efros<sup>1</sup>, Richard Zhang<sup>2</sup>

<sup>1</sup>UC Berkeley, <sup>2</sup>Adobe Research



<not\_ads>



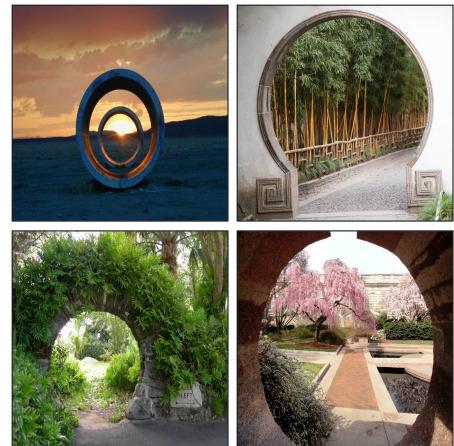
Photoshop 22 Landscape Mixer

# Photoshop 2021 Neural Filters



```
</not_ads>
```

# Custom Stable Diffusion

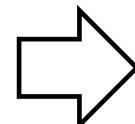


A photo of a **moongate**

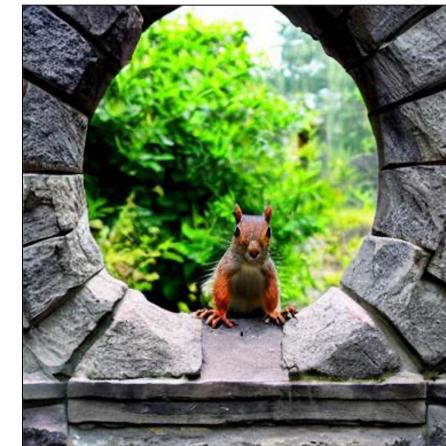


A photo of a **V\* dog**

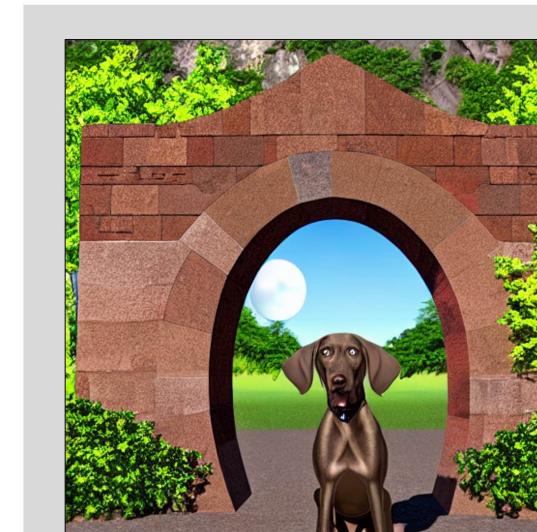
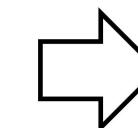
User input images



A **moongate** in  
the snowy ice



A squirrel in front  
of **moongate**



A digital illustration  
of a **V\* dog** in front  
of a **moongate**



**V\* dog** wearing  
sunglasses in front  
of a **moongate**

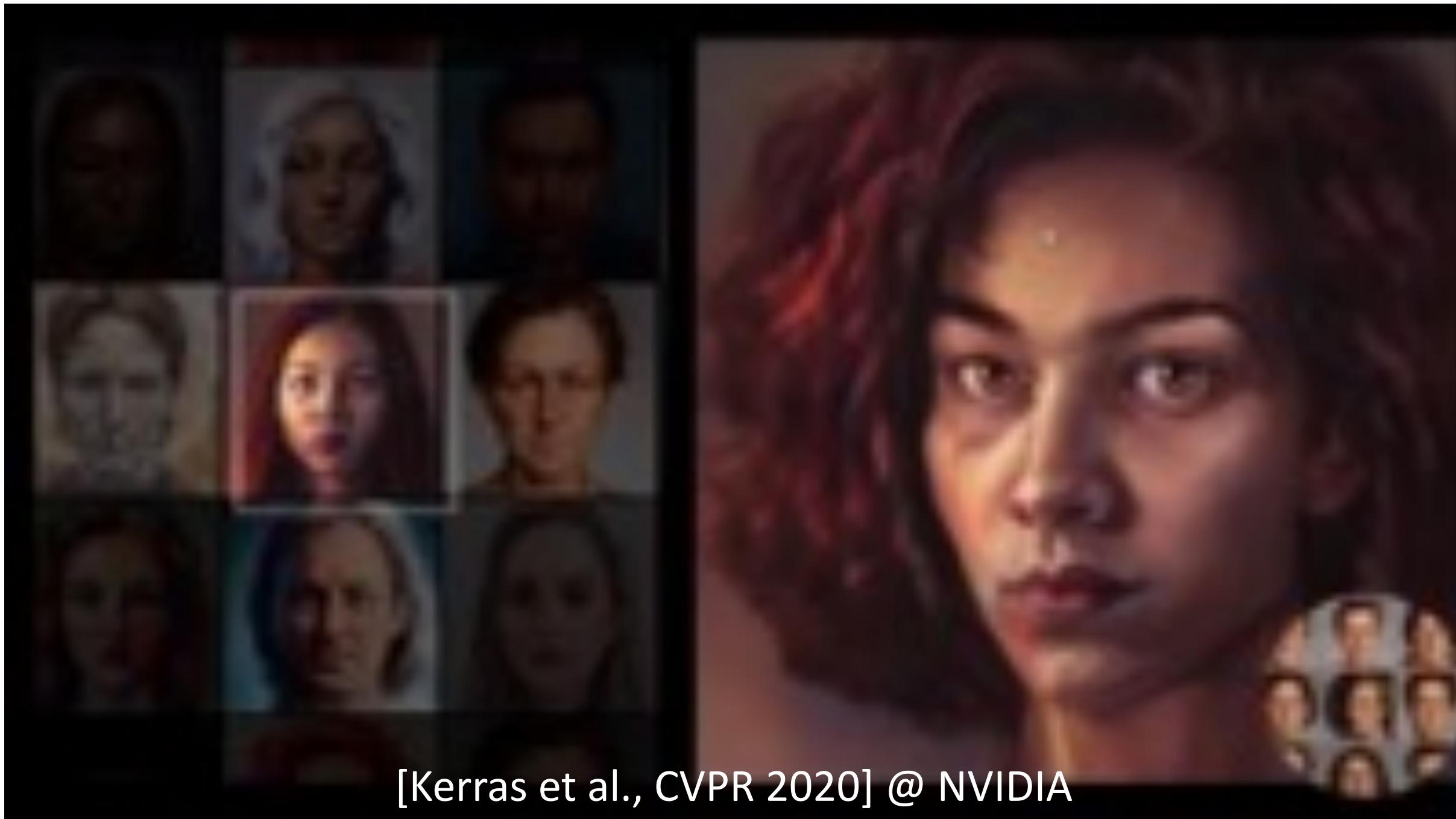
Multi-concept composition

Single-concept generation

# Research Highlights

from other universities & industry labs

# Synthesizing High-res Portraits



[Kerras et al., CVPR 2020] @ NVIDIA

# Everybody Dances Now



# Neural Talking-Head Synthesis

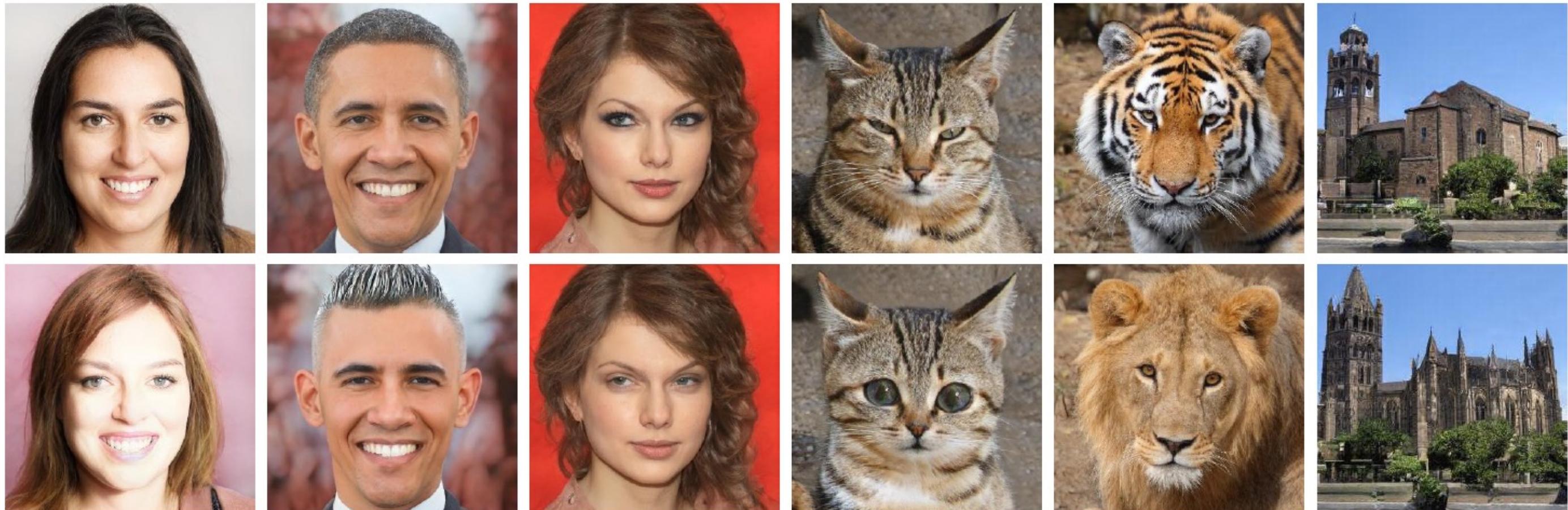


face-vid2vid: One-Shot Free-View Neural Talking-Head Synthesis for Video Conferencing  
Ting-Chun Wang, Arun Mallya, Ming-Yu Liu. CVPR 2021 @ NVIDIA

# NeRF in the Wild



# Text-based Image Editing



“Emma Stone”

“Mohawk hairstyle”

“Without makeup”

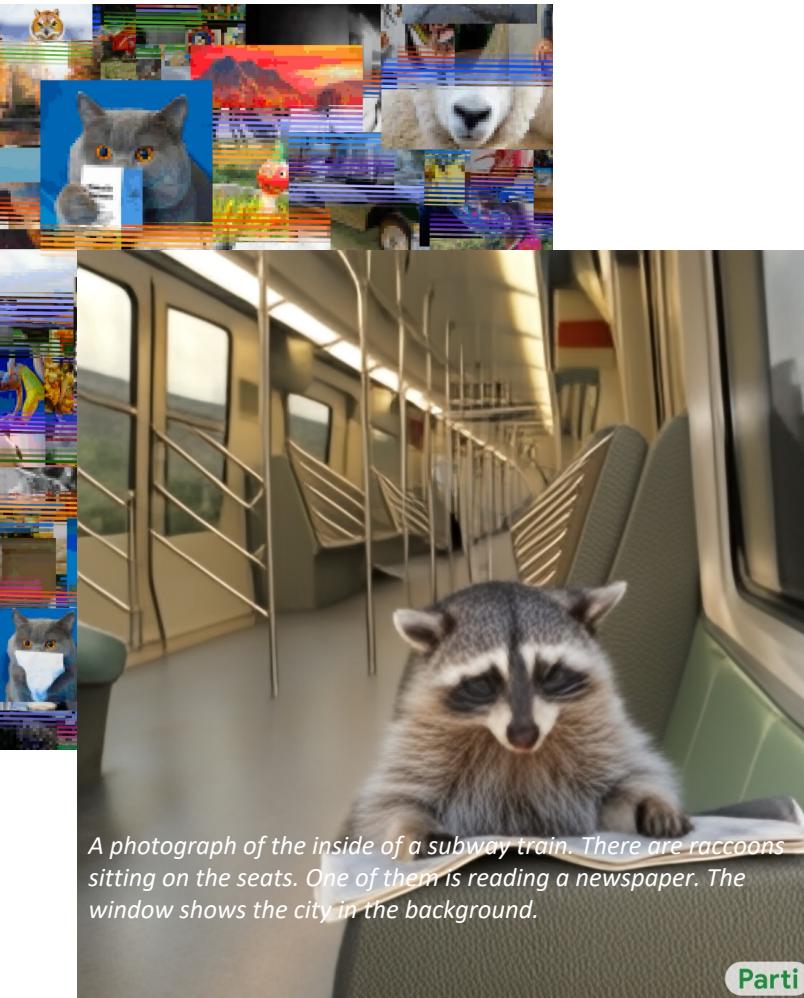
“Cute cat”

“Lion”

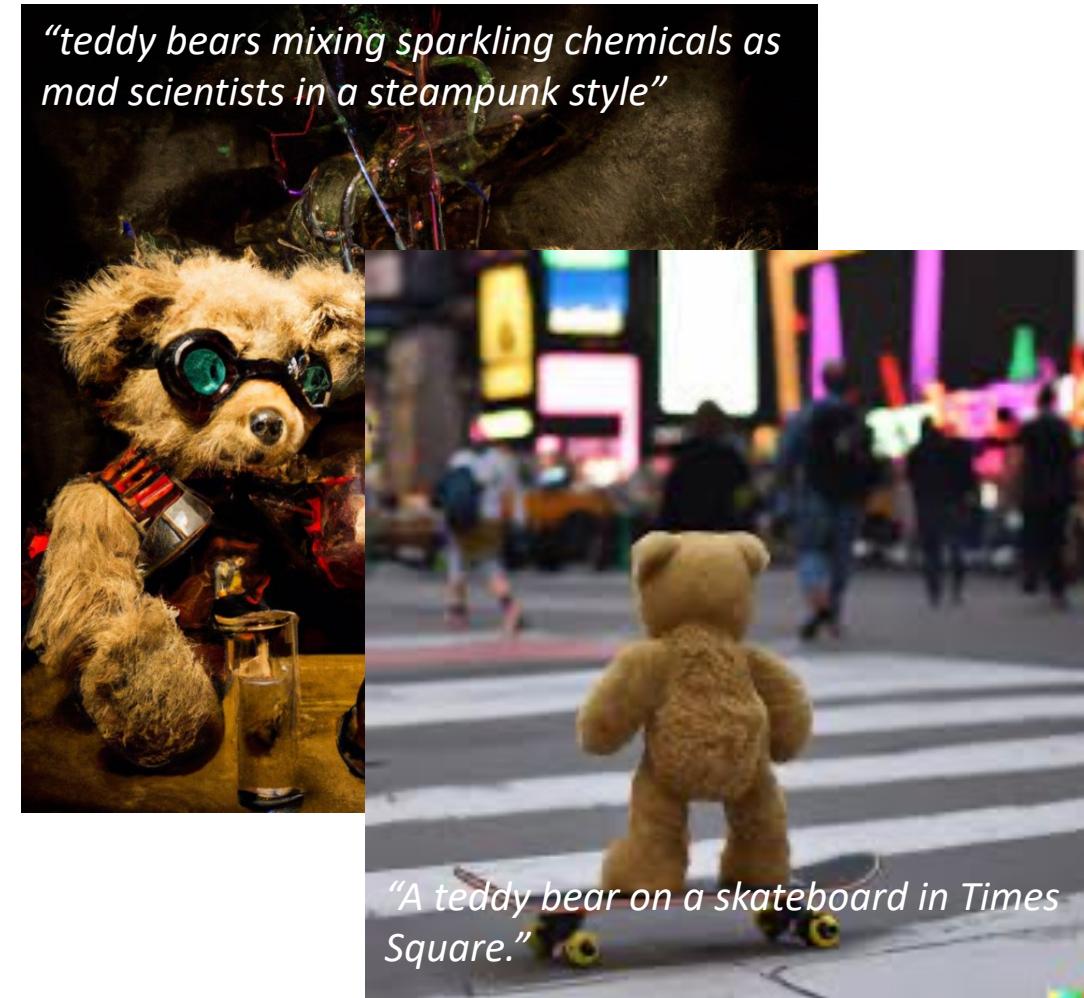
“Gothic church”

StyleCLIP [Or Patashnik\*, Zongze Wu\*, et al., ICCV 2021]

# Text-to-Image Synthesis



Autoregressive models  
(Image GPT, Parti)

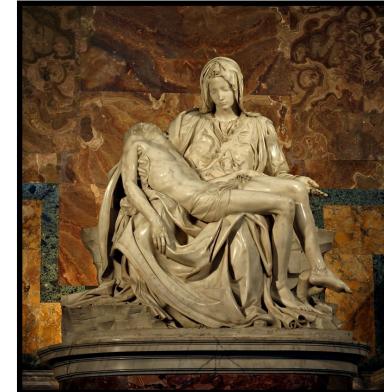


Diffusion models  
(DALL-E 2, Imagen)

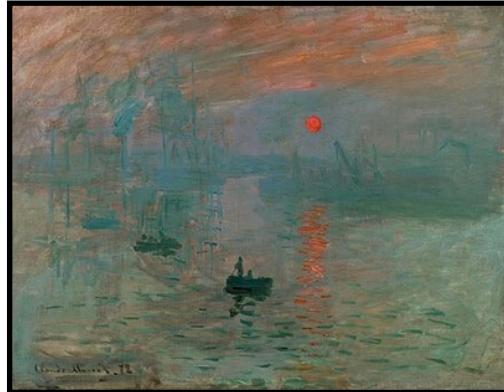
Cave art



Sculpture



Painting



Computer Graphics

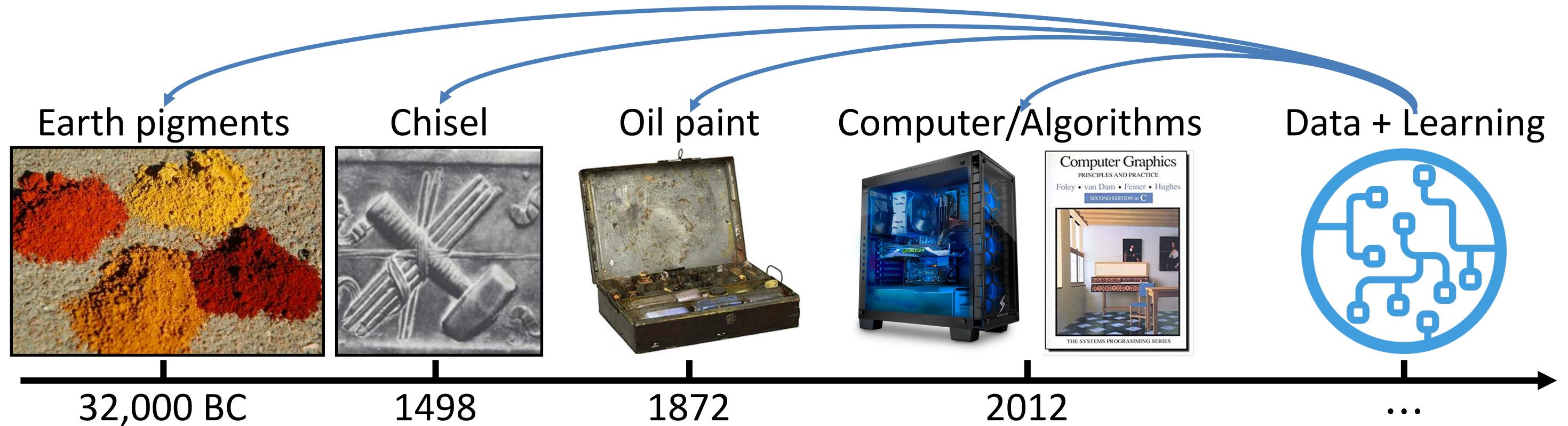


32,000 BC

1498

1872

2012



## Course preview

- A modern machine learning perspective
- Widely-used learning algorithms
- Interactive content creation tools

# Teaching Staff

## Instructors



Jun-Yan Zhu

junyanz at  
cs.cmu.edu

## Teaching Assistants



Nikos Gkanatsios

ngkanats at  
andrew.cmu.edu

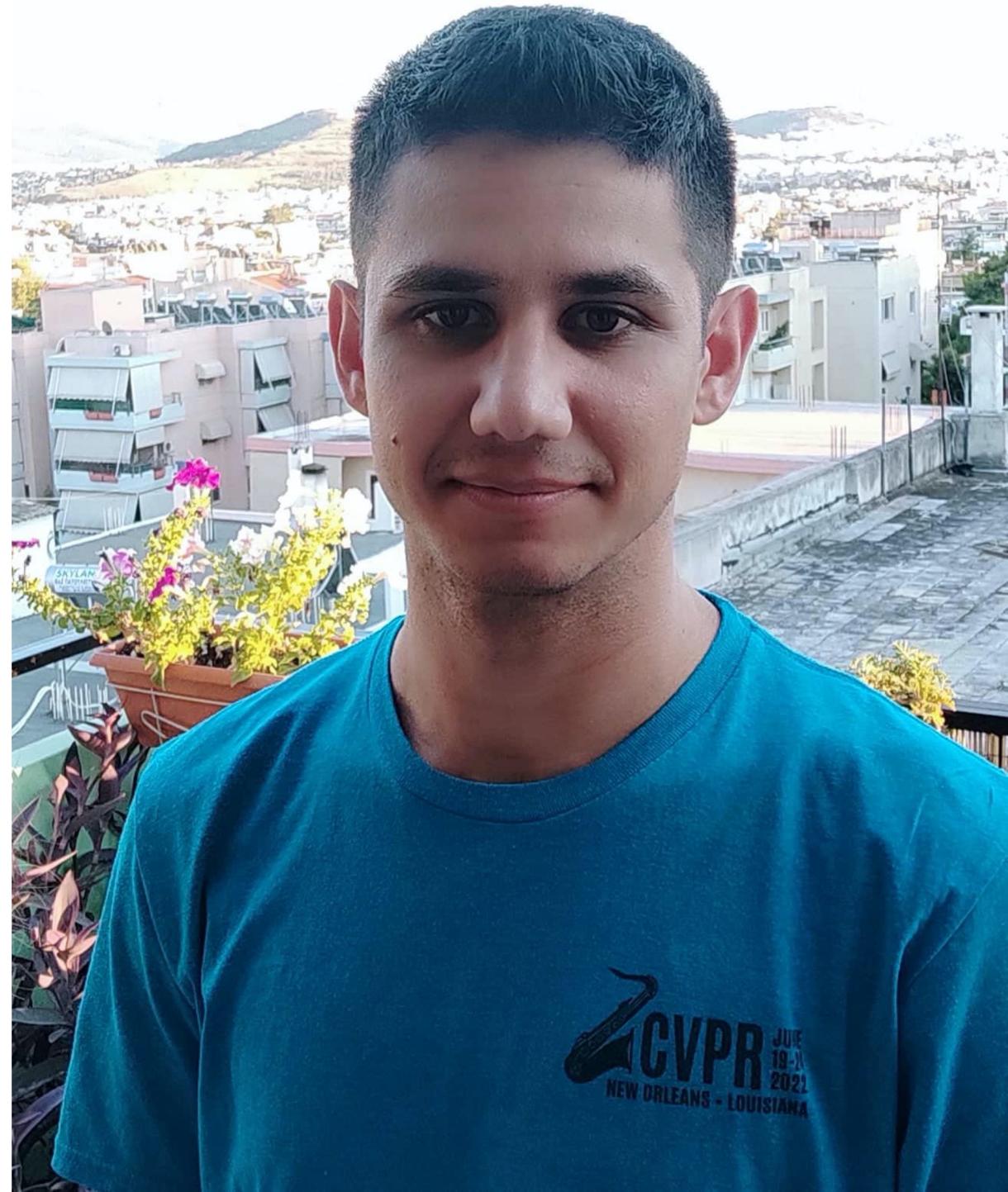


Emily Kim

ekim2 at  
andrew.cmu.edu

# Nikos Gkanatsios

- PhD student at the Robotics Institute
- Advised by Prof. Katerina Fragkiadaki
- Interested in continual learning for vision and robotics



# Emily Kim

- From South Korea
- Studied Math-Computer Science at Harvey Mudd College
- Advised by Professor Jessica Hodgins
- Research in enhancing deep learning models using synthetic data generated with GANs



# Logistics

# Course objectives

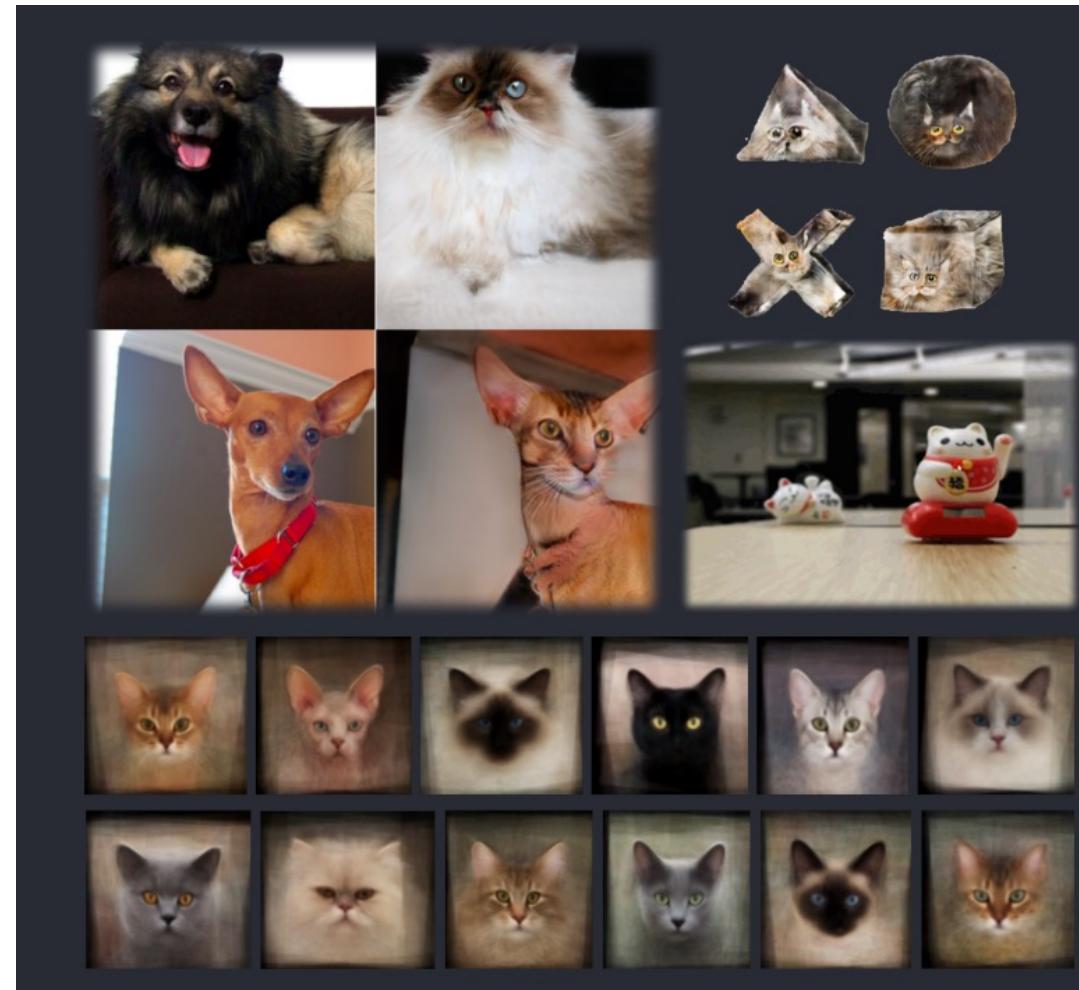
1. You will get a foundation in image editing and synthesis.
  - Texture synthesis and style transfer.
  - Face modeling and synthesis.
  - Image colorization and inpainting.
  - Video generation and editing.
  - Image-to-image translation.
  - Image and video editing. (warping, morphing, compositing)
  - Image and video forensics.

# Course objectives

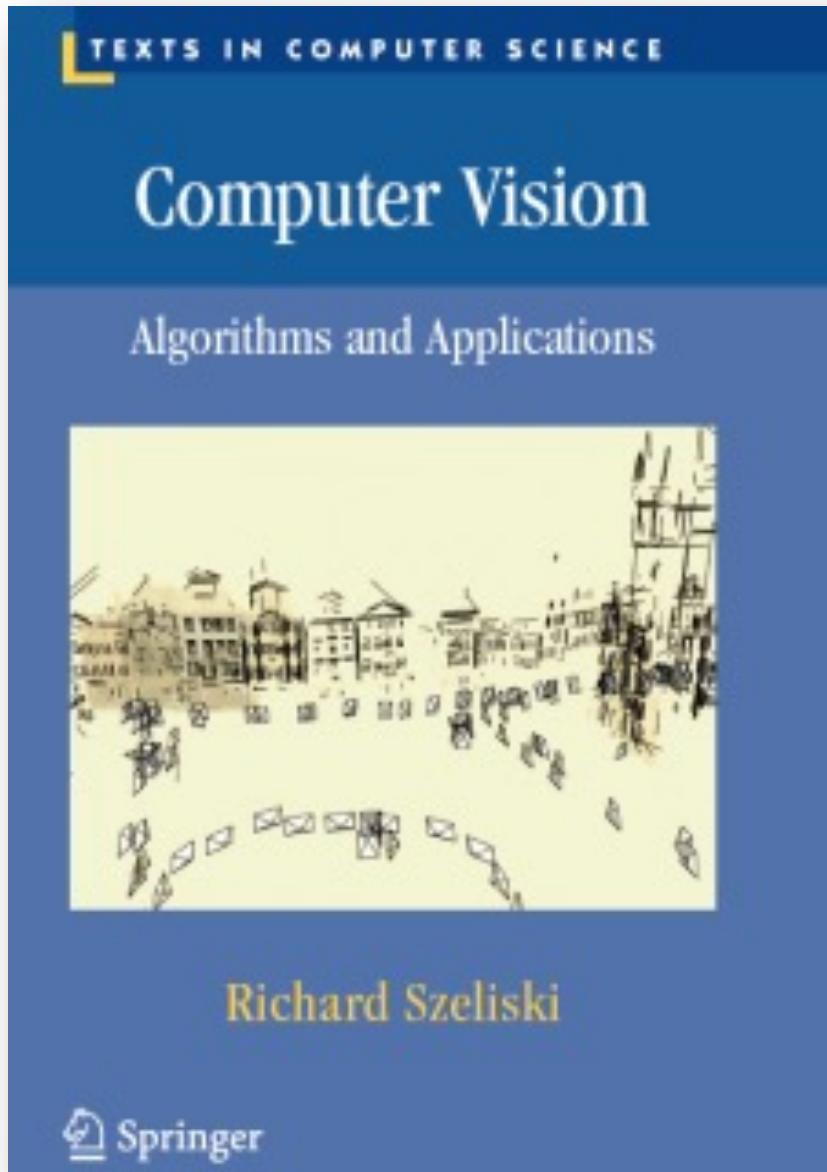
2. You will get a foundation of machine learning concepts
  - o (fast) Nearest neighbor search.
  - o Principal component analysis, Gaussian Mixture model.
  - o Markov Random Field (MRF)
  - o Convolutional neural networks.
  - o Deep generative models: Auto-encoder, Generative Adversarial Networks, Flow-based models, Variational Auto-encoder, Autoregressive Models, Diffusion Models.
  - o Conditional generative models.
  - o Neural Radiance Fields (NeRF)

# Course objectives

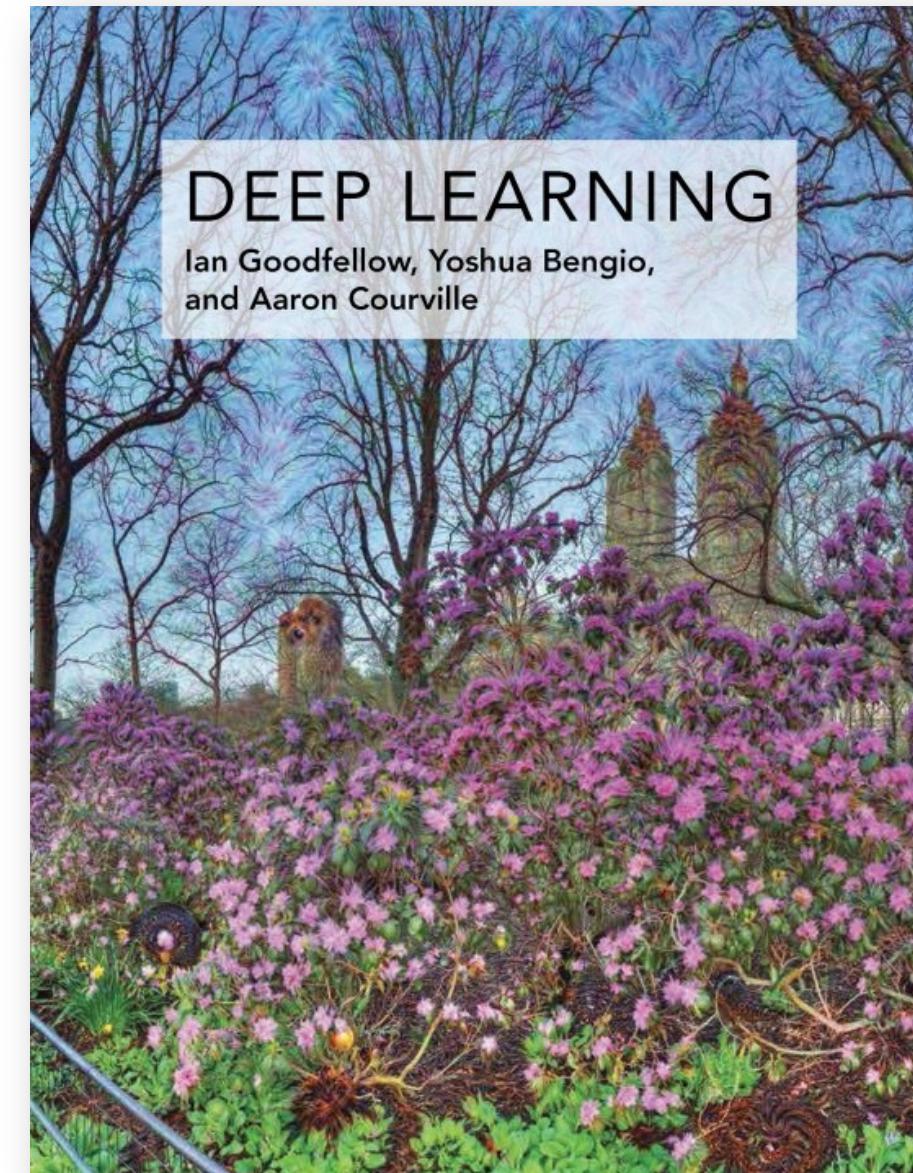
3. You will have some cool results with your own photos



# Textbook



<https://szeliski.org/Book/>  
(2021 edition")



<https://www.deeplearningbook.org/>  
(2016 edition)

# Grading

- Emphasis on programming projects (**65%**).
  - Classic: 1. image alignment. 2. image blending
  - Deep learning: 3. neural style transfer. 4. GANs and conditional GANs.
  - 5. reconstructing and editing an image with GANs.
- Late Policy for programming assignments.
  - Five (5) emergency late days for semester, to be spent wisely
  - 10% of penalty per 24 hours afterwards
- One paper presentation (**10%**):
  - 10-20 min, 1-2 people in a group.
  - Need to answer questions about this paper from now on.
- Final Project (**25%**)
  - A webpage-based report + a presentation.
  - No late day.
  - 2-3 people per group.

# Assignments



Assignment #0 - How to submit assignments? ↗



Assignment #1 - Colorizing the Prokudin-Gorskii Photo Collection ↗ ↘

Winner: [Konwoo Kim]

Honorable Mentions: [Juyong Kim] [Zihang Lai] [Manuel Rodriguez]



Assignment #2 - Gradient Domain Fusion ↗ ↘

Winner: [Manuel Rodriguez]

Honorable Mentions: [George Cazanavette]



Assignment #3 - When Cats meet GANs ↗ ↘

Winner: [Jun Luo]

Honorable Mentions: [George Cazanavette]



Assignment #4 - Neural Style Transfer ↗ ↘

Winner: [Zihang Lai]

Honorable Mentions: [Zijie Li] [Tarang Shah]



Assignment #5 - GAN Photo Editing ↗ ↘

Winner: [George Cazanavette]

Honorable Mentions: [Manuel Guevara] [Zijie Li] [Zhe Huang]

+ more Diffusion Model modules

# For each assignment

- Derive the math, implement stuff from scratch (+ starter code), and apply it to your own photos
- Every person does their own project (except final)
- Reporting via web page (+ submit code to Canvas)
- Afterwards, vote for class **favorite(s)! Gift!**
- Programming Language:
  - Python and PyTorch
  - you can use other languages, but you are on your own

# Academic Integrity

- Can discuss projects, but don't share code
- Don't look up code or copy from a friend
- If you're not sure if it's allowed, ask
- Acknowledge any inspirations
- If you get stuck, come talk to us

# Getting help outside of class

- Course Web Page
  - <https://16726-image-synthesis.github.io/sp23/>
- Discussion board:
  - Piazza.com
- Assignment submission
  - Canvas
- Office hours (EST)
  - Nikos: noon-1 pm Thursday
  - Emily: 1-2 pm Wednesday
  - Jun-Yan: 11 am-12 pm Tuesday

The screenshot shows the homepage of the course website. At the top, there is a red header bar with the Carnegie Mellon University logo and the course title "16-726 Learning-Based Image Synthesis" and "Spring 2023". Below the header, there is a green navigation bar with links for "HOME", "SCHEDULE", "LECTURES", "ASSIGNMENTS", and "MATERIALS". The main content area features the course title "16-726 Learning-Based Image Synthesis / Spring 2023", the time "Time: Mondays, Wednesdays 9:30 am - 10:50 am ET", and the location "Location: NSH 1305". Below this information is a large, scenic photograph of a winding river flowing through a mountainous landscape, with a small red circle highlighting a specific point on the map.

# Why you should NOT take this class

- Project-based class
  - No canned problem sets.
  - Not theory-heavy.
  - will read many research papers.
  - Open-ended by design.
- Need time to think, not just hack
  - **Creativity** is a class requirement.
- Not worth it if you don't enjoy it.

# Now... reasons TO take this class

- Not too many similar courses at other places.
- You get to create pictures and unleash your creative potential.
- Interested in grad school and research? ☺
- Interested in industry jobs? ☺

**Become a friend with every pixel!**

# Thank You!



16-726, Spring 2023

<https://learning-image-synthesis.github.io/sp23/>