



# 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)

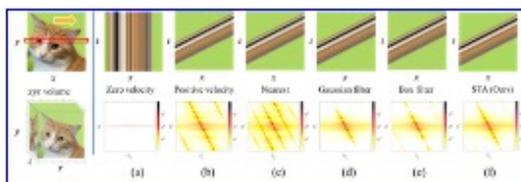


# Cat Paper Collection

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.

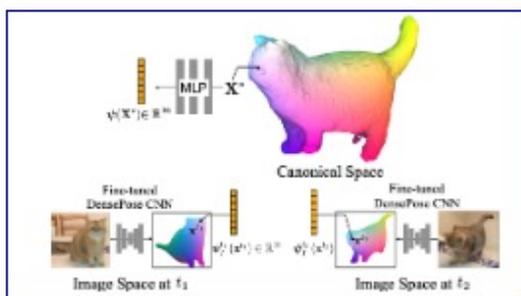
See also [GitHub](#) | [CSV file](#)



## Learning Spatio-Temporal Downsampling for Effective Video Upscaling

Xiaoyu Xiang, Yapeng Tian, Vijay Rengarajan, Lucas Young, Bo Zhu, Rakesh Ranjan  
In ECCV 2022

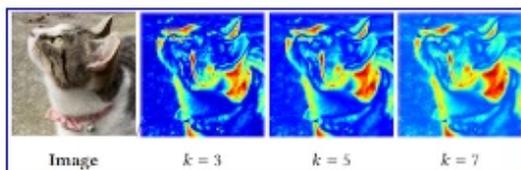
[\[Paper\]](#)



## 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

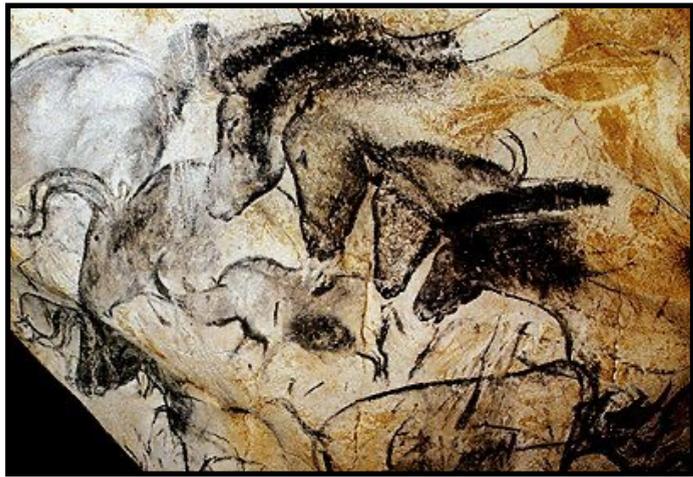
Xiaoyu Xiang, Jon Morton, Fitsum A Reda, Lucas Young, Federico Perazzi, Rakesh Ranjan, Amit Kumar, Andrea Colaco, Jan Allebach  
In ArXiv 2022

[\[Paper\]](#)

Unwatch 56 Fork 87 Starred 1k

# Visual Content Creation

Cave art



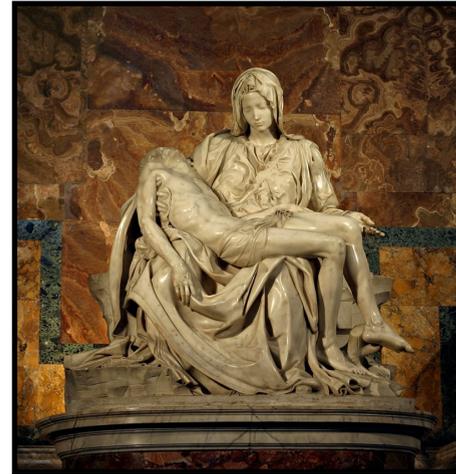
Time  
32,000 BC

# Visual Content Creation

Cave art



Sculpture



Painting



Time

32,000 BC

1498

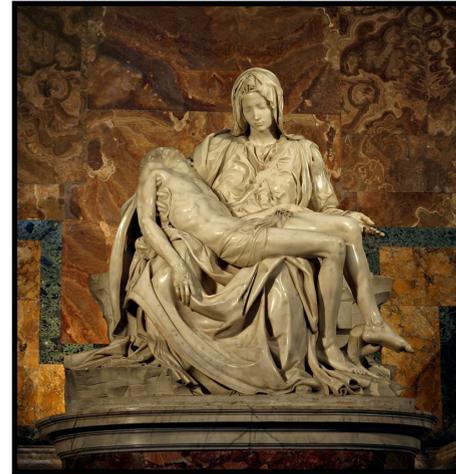
1872

# Visual Content Creation

Cave art



Sculpture



Painting



Computer Graphics



Time

32,000 BC

1498

1872

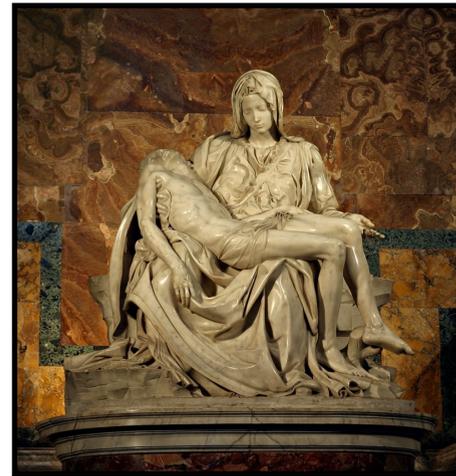
2012

# Who is creating visual content?

Cave art



Sculpture



Painting



Computer Graphics



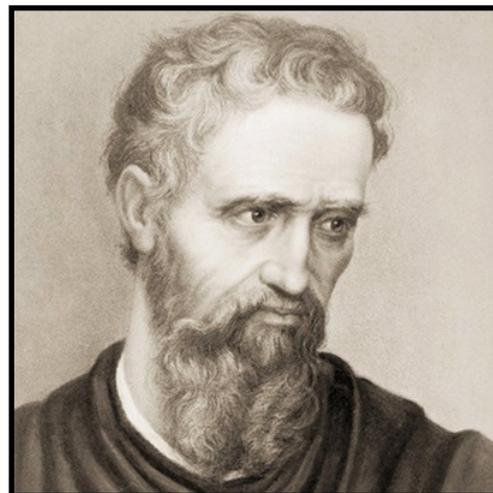
Time

32,000 BC

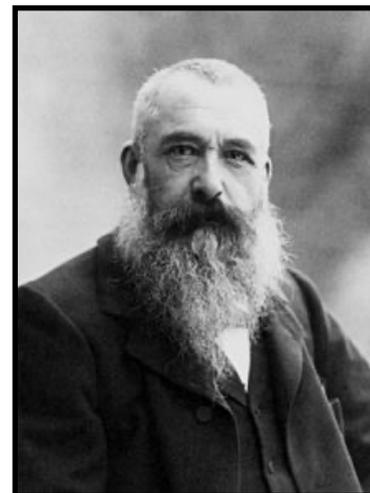
1498

1872

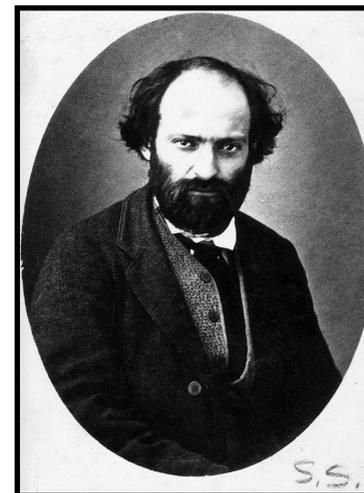
2012



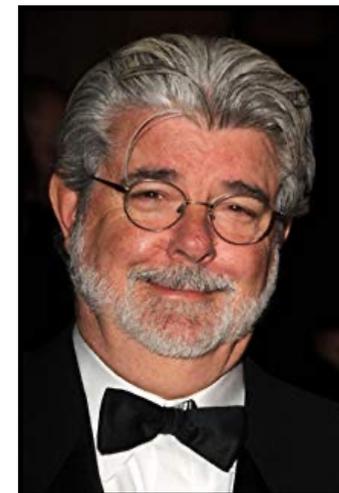
Michelangelo



Claude Monet



Paul Cezanne

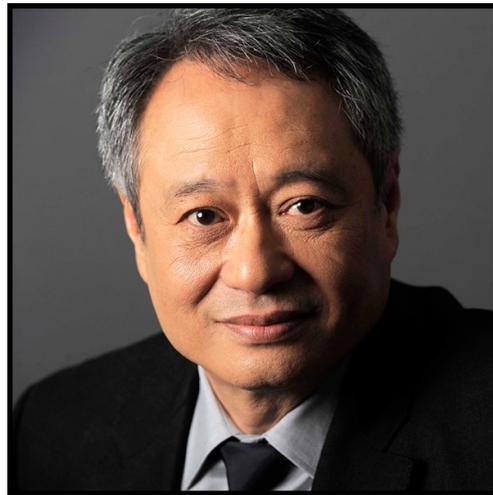


George Lucas

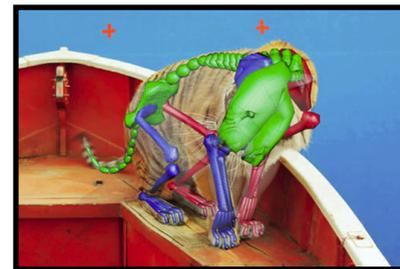


Ang Lee

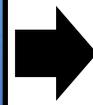
# Who is creating visual content?



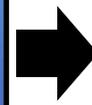
Ang Lee



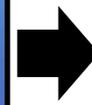
Skeleton



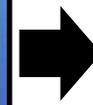
Geometry



Texture



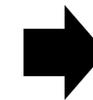
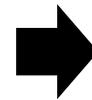
Details



Image



Idea



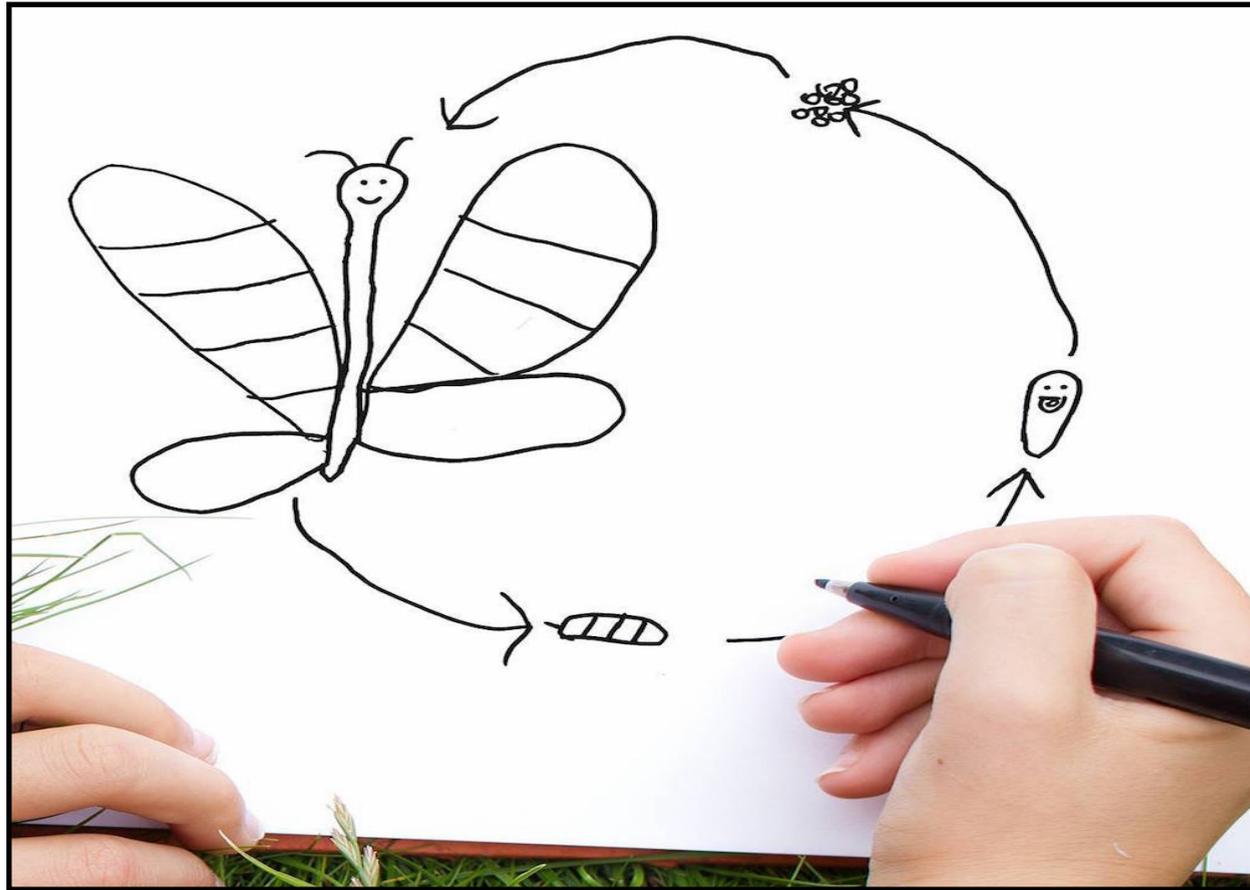
Visual Content

# Who is creating visual content?

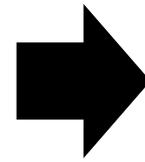
Homework

09/27/2003

# Who is creating visual content?



Kid's drawing



Photoshop result by his father

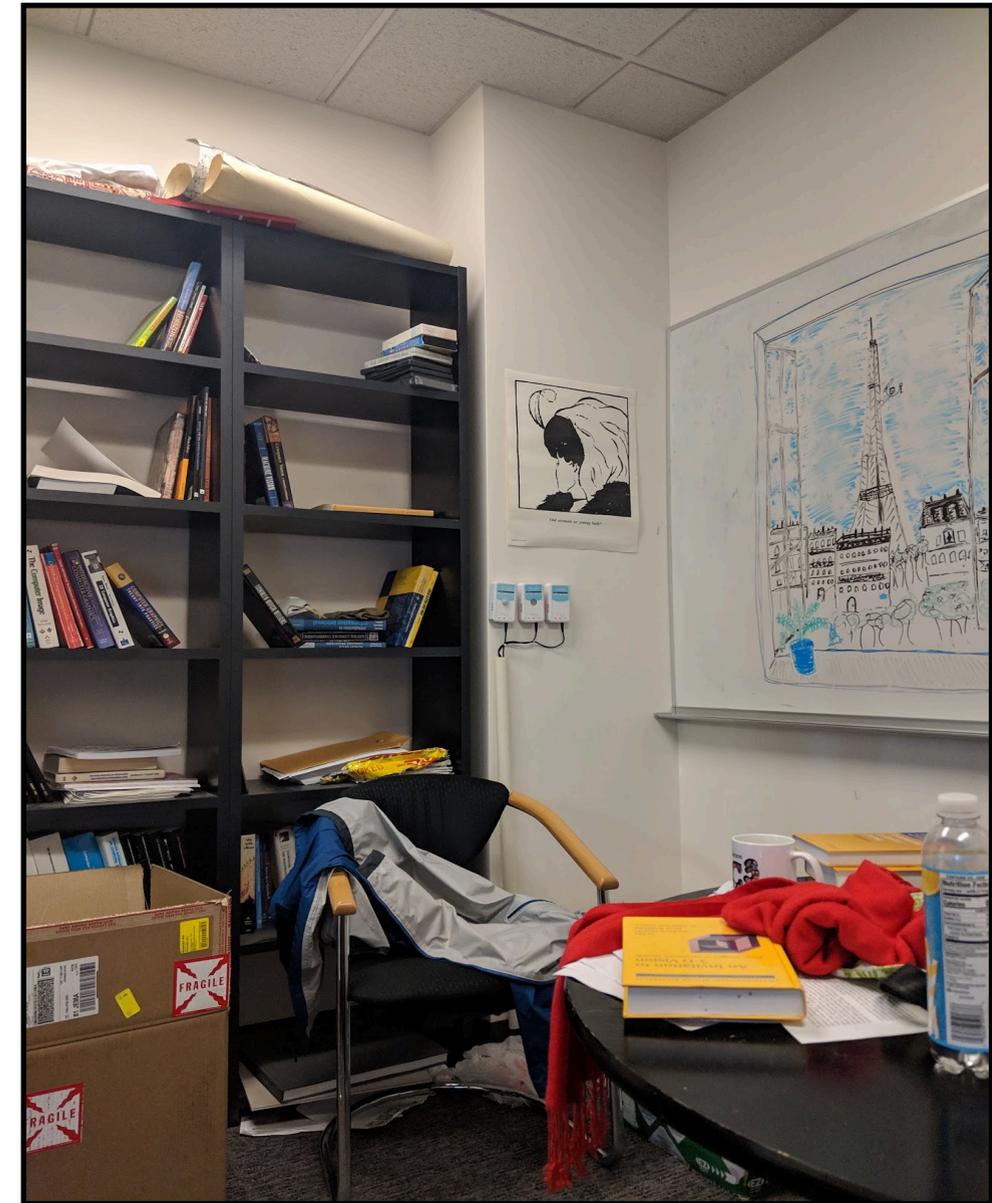
# Creating Visual Realism Manually



CG office



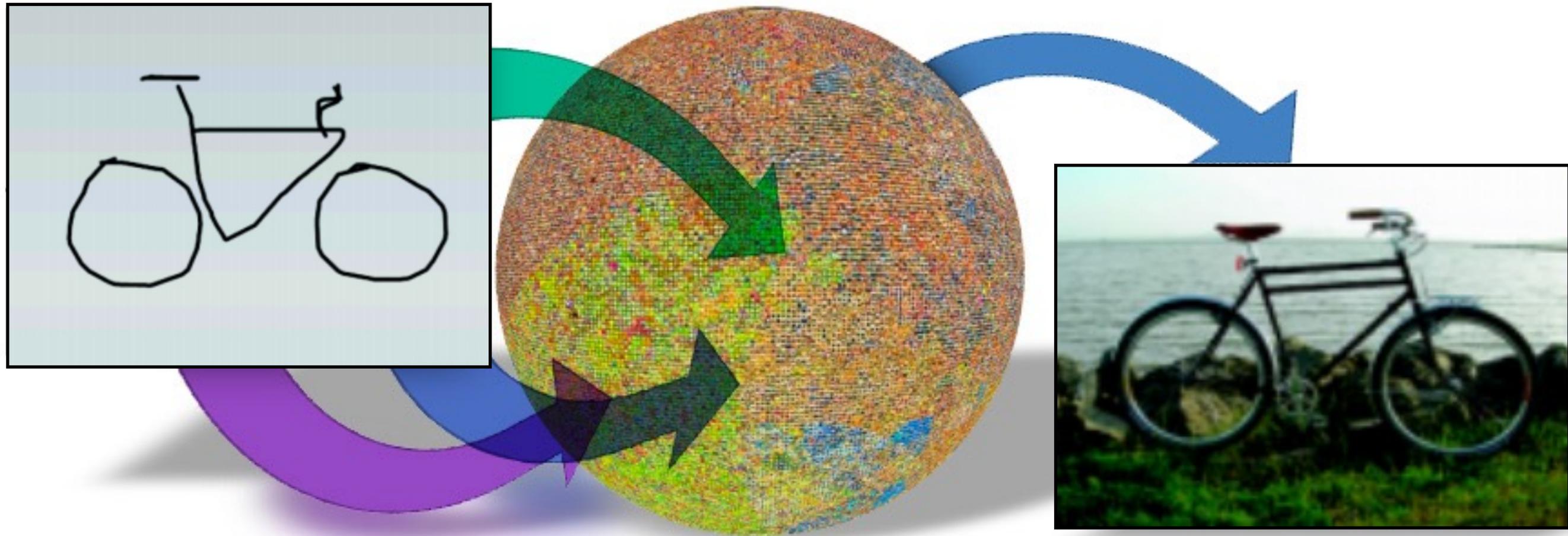
CG office (more details)



My advisor's office

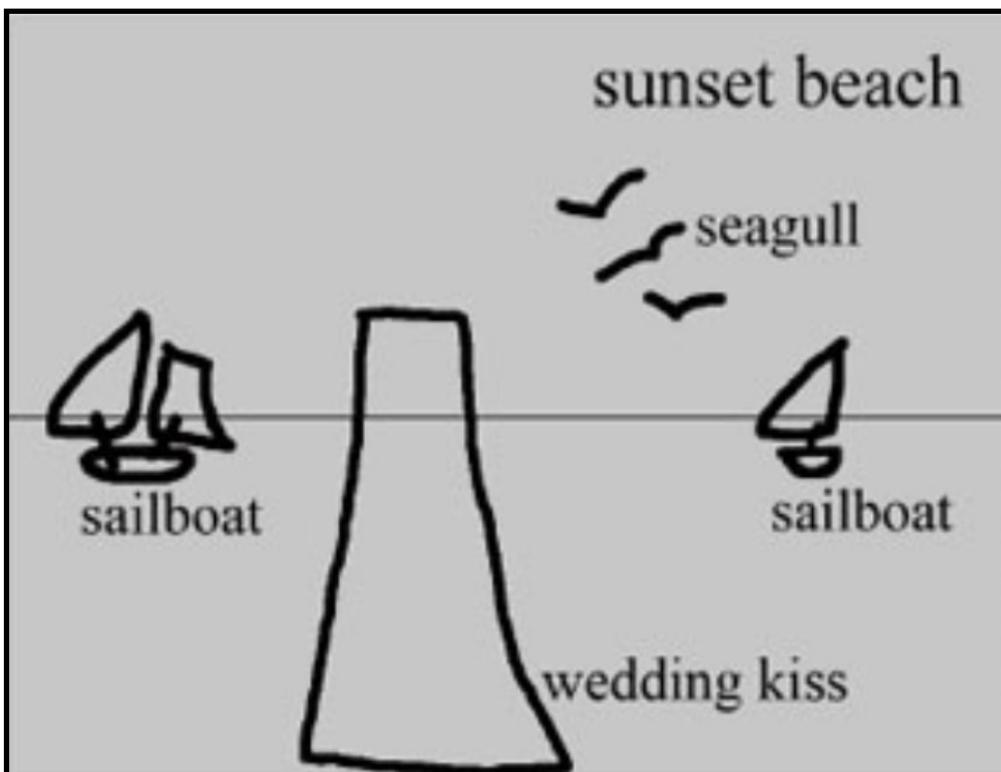
# Data-Driven Graphics (2000s)

Graphics → Image Retrieval



# Data-Driven Graphics (2000s)

Compositing multiple parts



User Input



Database images



Output

# Data-Driven Graphics (2000s)



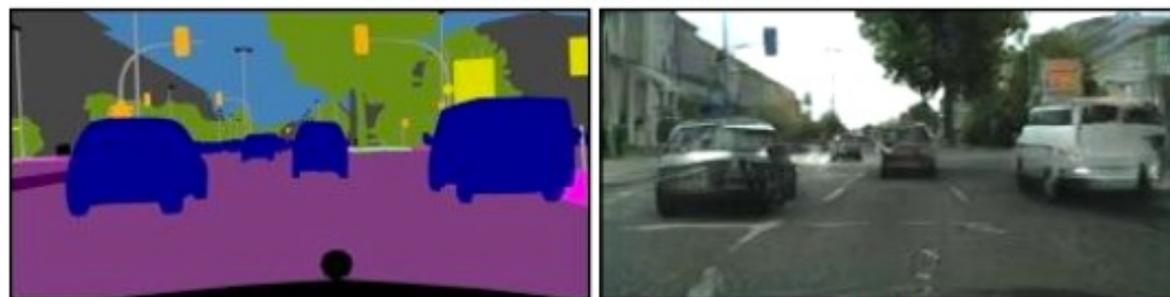
- Hard to combine pieces
- No understanding of visual realism

Help everyone  
easily create visual content

Teach machines  
how to create realistic content

# Image-to-Image Translation with **pix2pix**

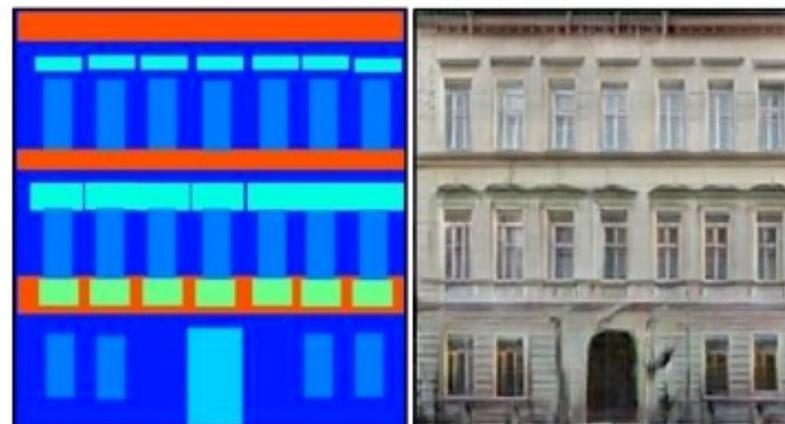
Labels to Street Scene



input

output

Labels to Facade



input

output

BW to Color



input

output

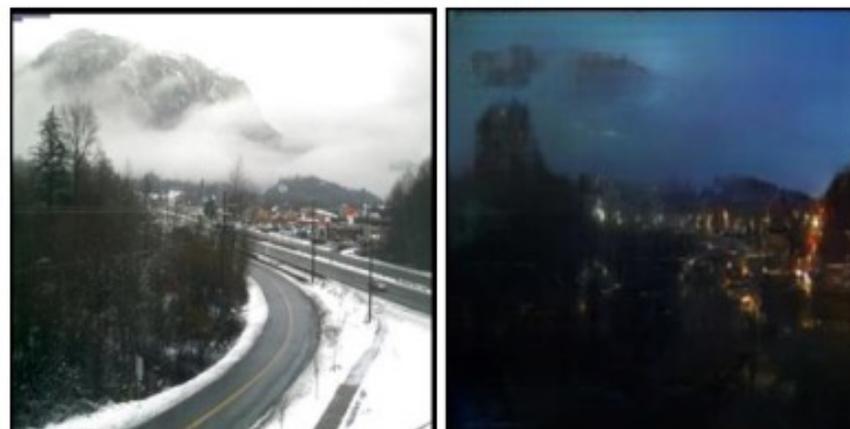
Aerial to Map



input

output

Day to Night



input

output

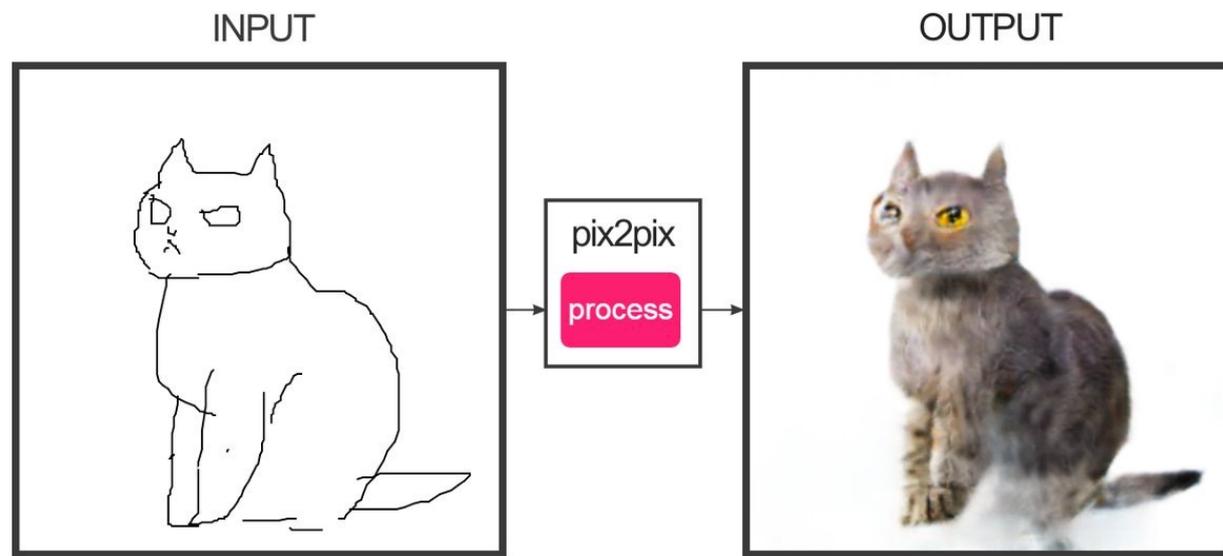
Edges to Photo



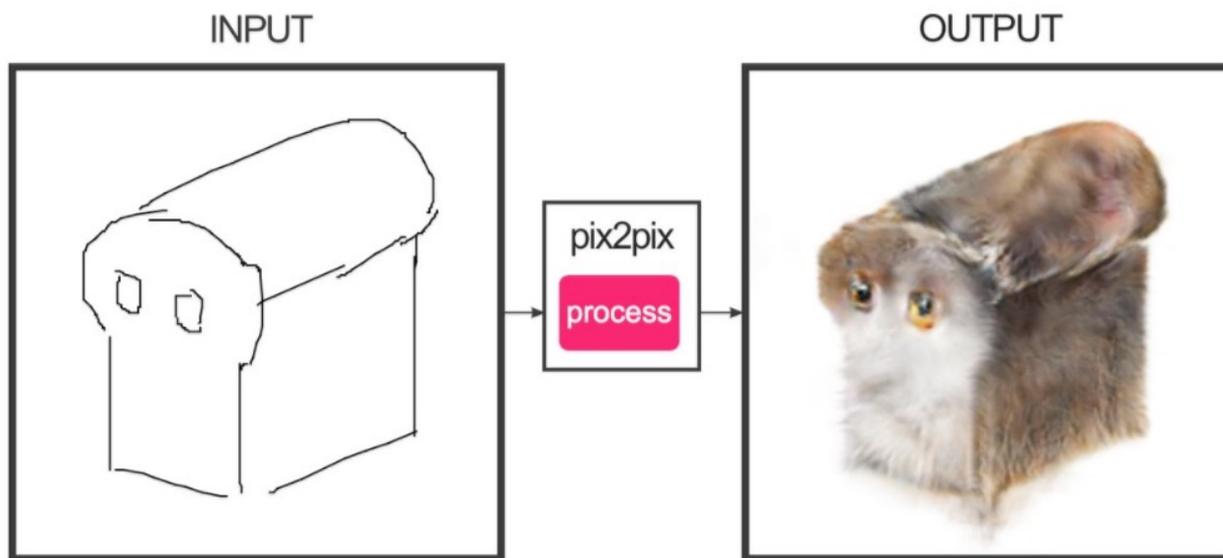
input

output

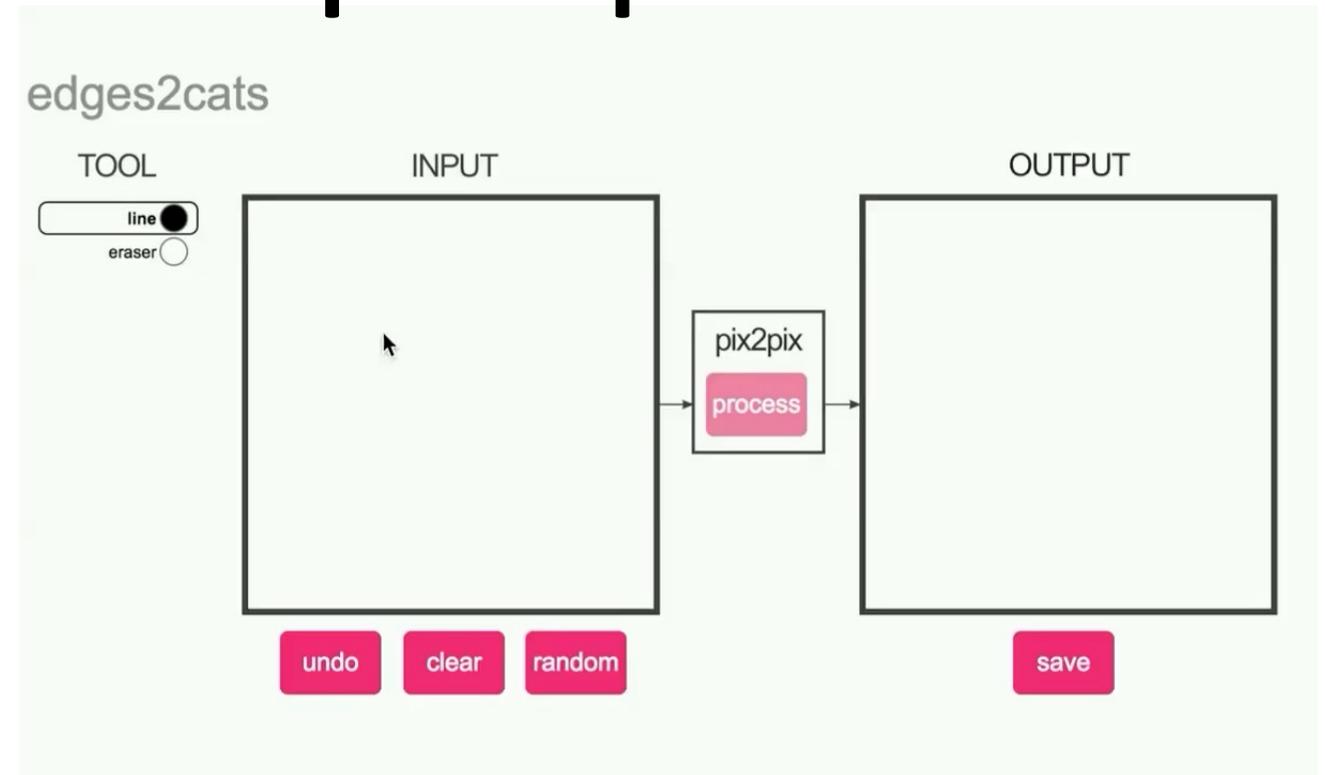
# #edges2cats with pix2pix



@gods\_tail



Ivy Tasi @ivymyt



@matthematician

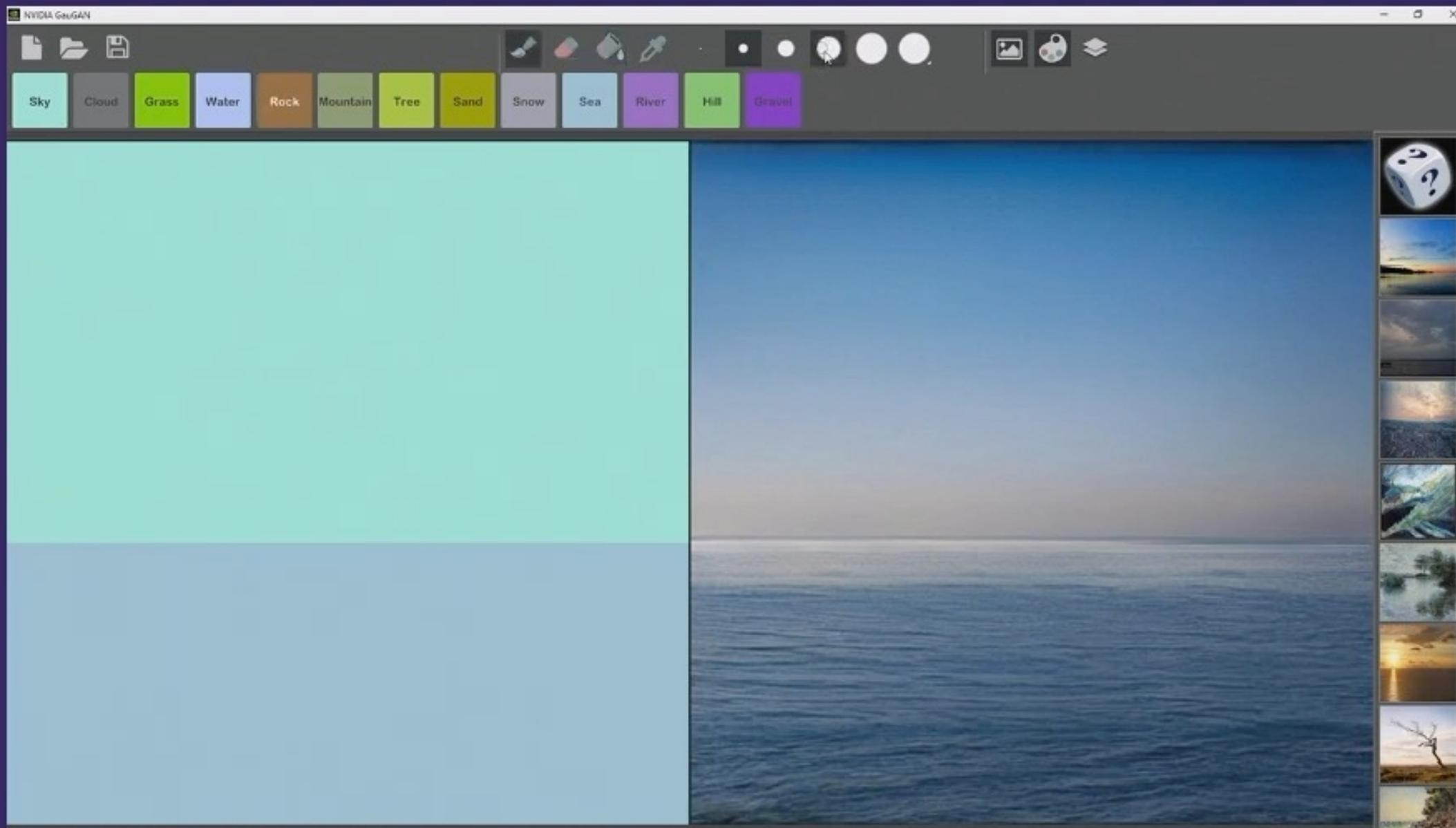


Vitaly Vidmirov @vvid

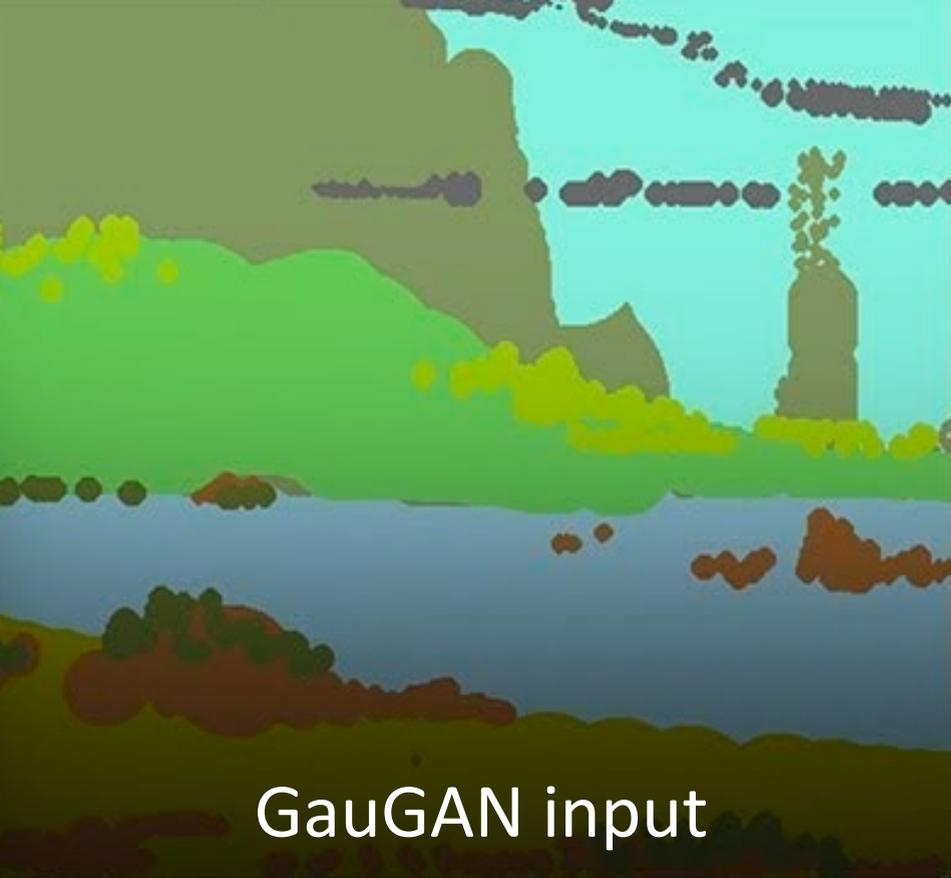
By Christopher Hesse

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

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



SIGGRAPH 2019 Real-time Live! "Best of Show Award" and "Audience Choice Award"



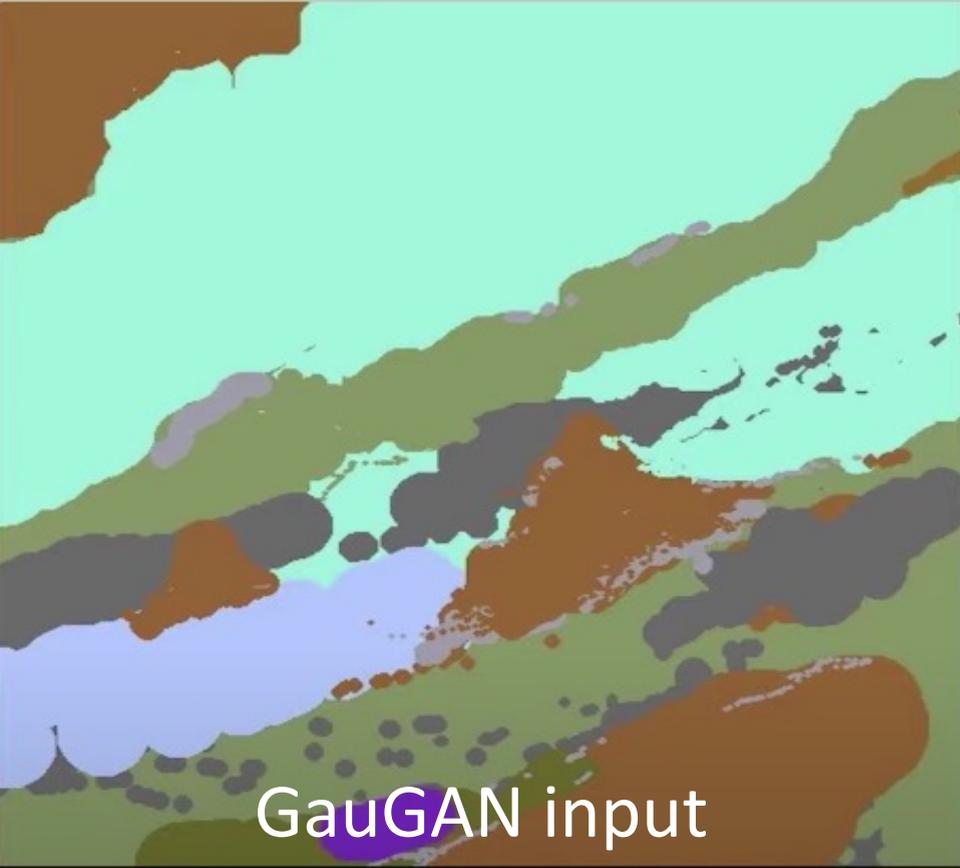
GauGAN input



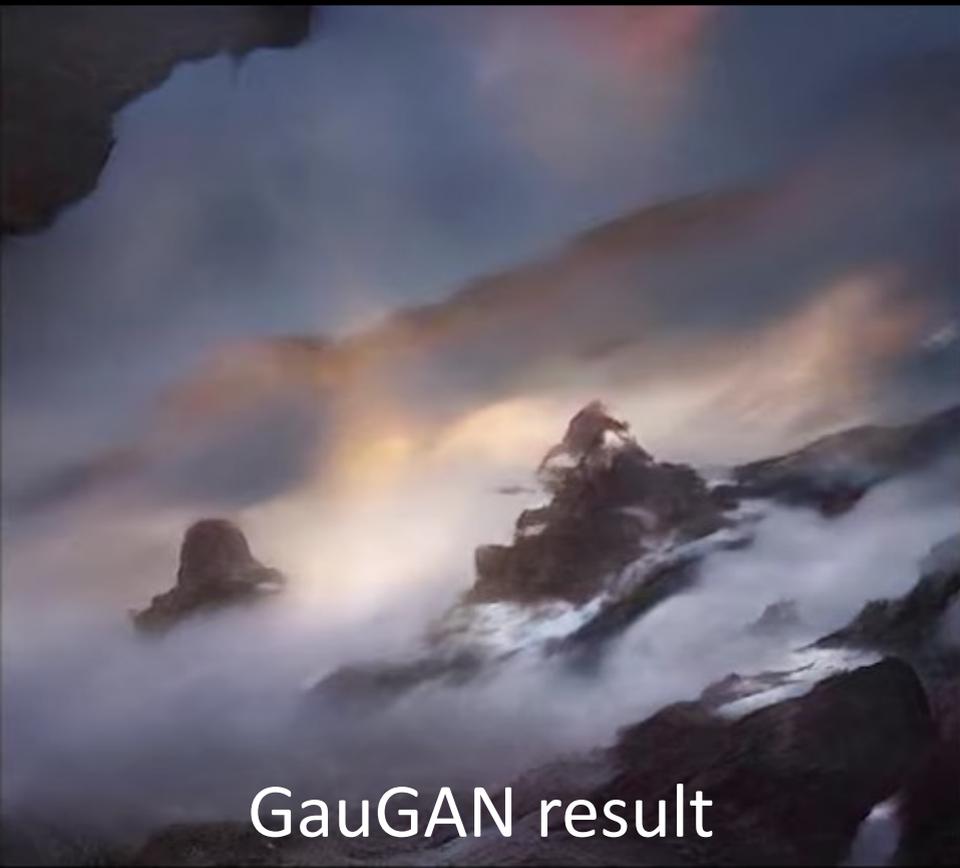
GauGAN result



By Darek Zabrocki, Concept Designer and Illustrator



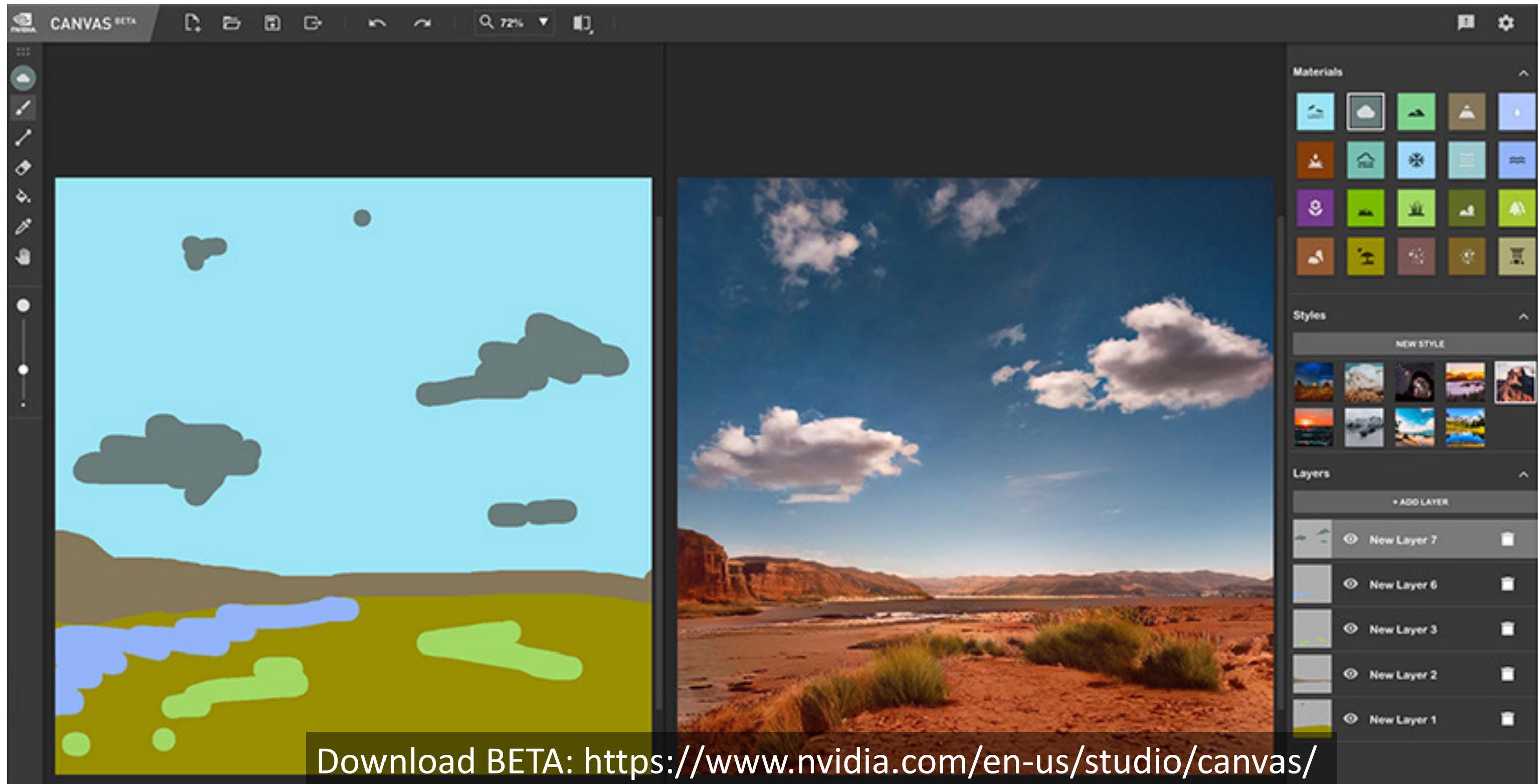
GauGAN input



GauGAN result



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



Download BETA: <https://www.nvidia.com/en-us/studio/canvas/>

# Collection Style Transfer



Photograph ©Alexei Efros



Monet



Van Gogh



Cezanne



Ukiyo-e

# Monet's paintings → photographic style



# Horse → Zebra



# Failure case



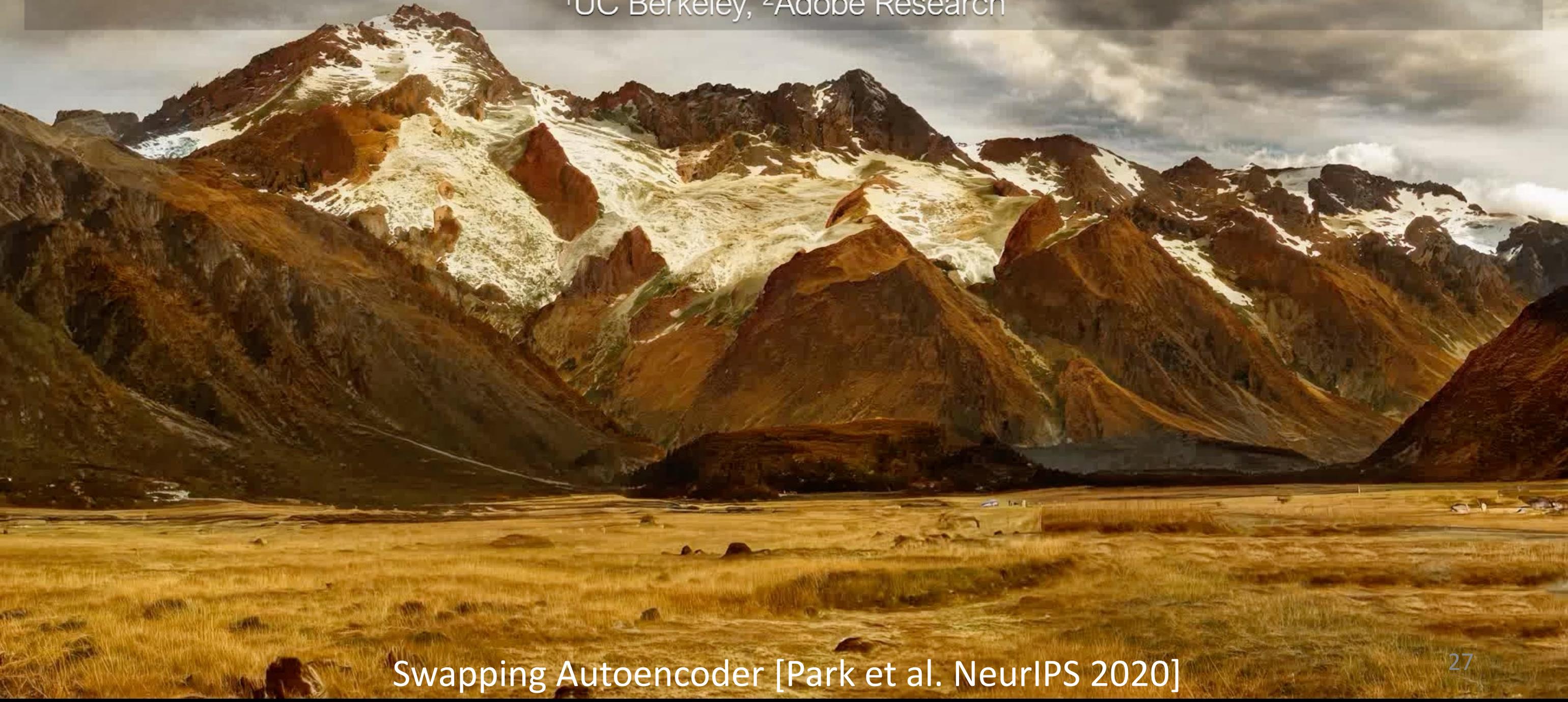
# Failure case



# 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

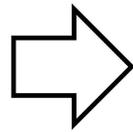


A photo of a **moongate**

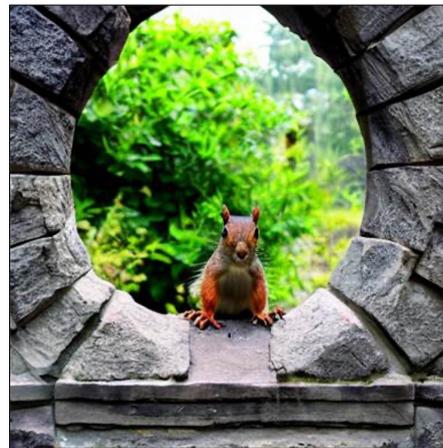


A photo of a **V\* dog**

User input images



A **moongate** in the snowy ice



A squirrel in front of **moongate**

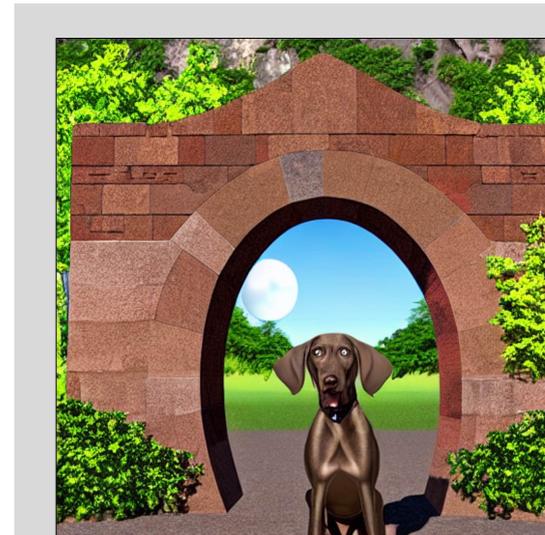
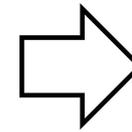


A **V\* dog** in a swimming pool



A **V\* dog** wearing sunglasses

Single-concept generation



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



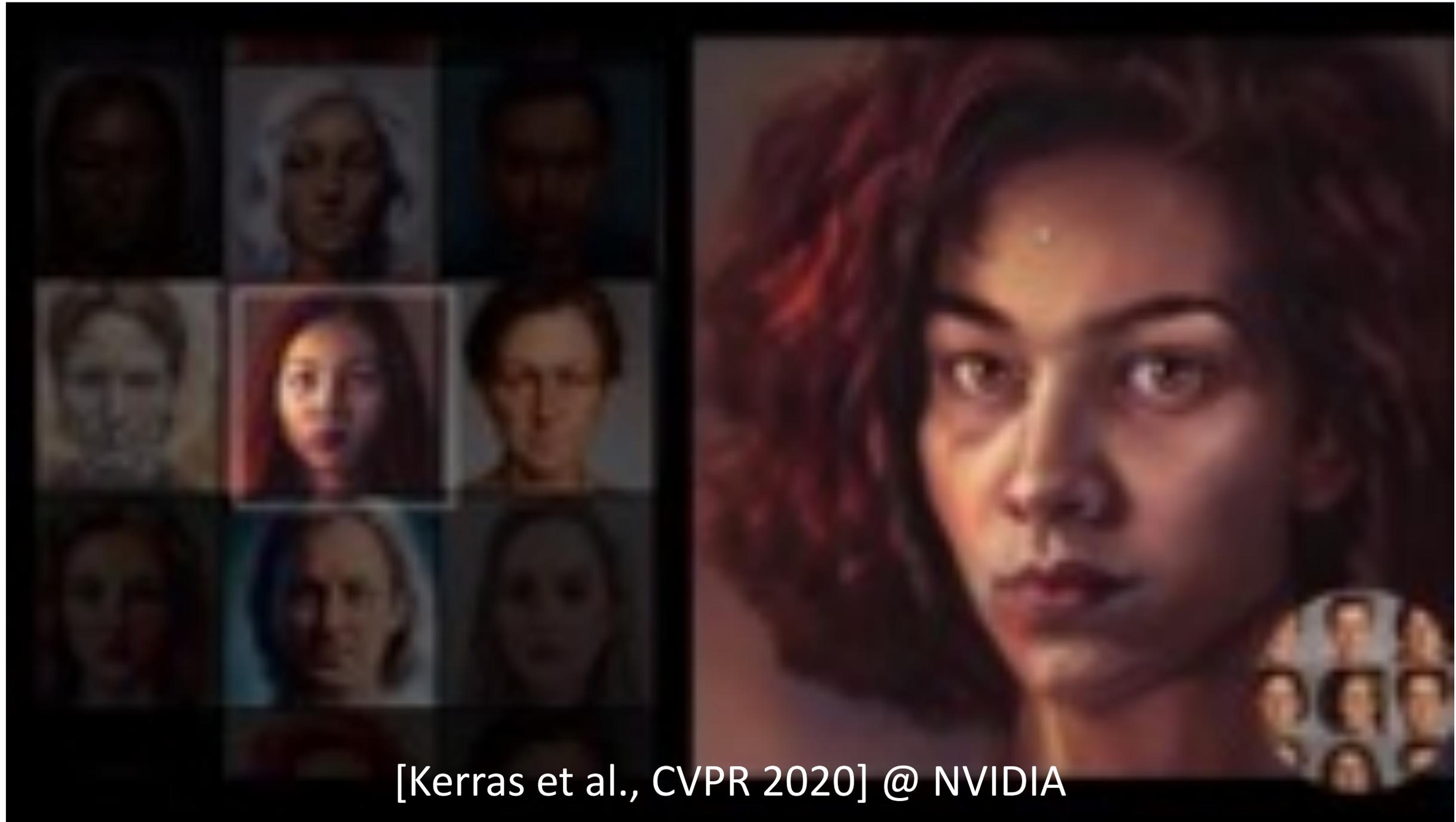
**V\* dog** wearing sunglasses in front of a **moongate**

Multi-concept composition

# 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



Trevi Fountain  
Rome, Italy

[Martin-Brualla et al., CVPR 2021] @ Google Research

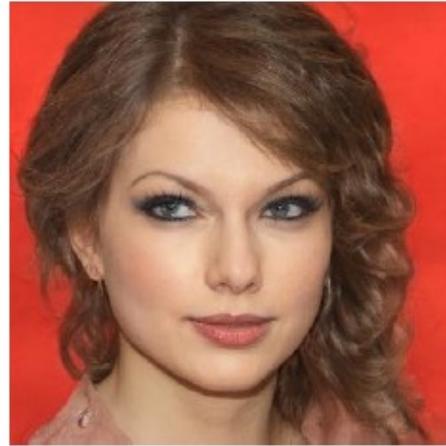
# Text-based Image Editing



“Emma Stone”



“Mohawk hairstyle”



“Without makeup”



“Cute cat”



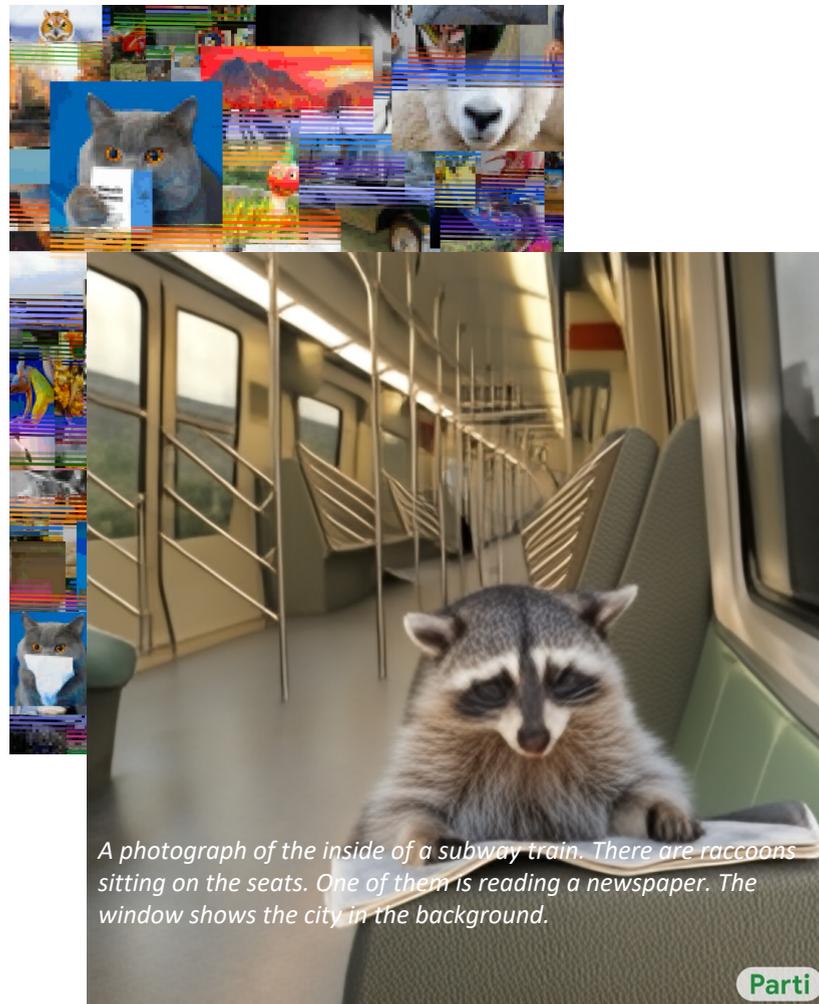
“Lion”



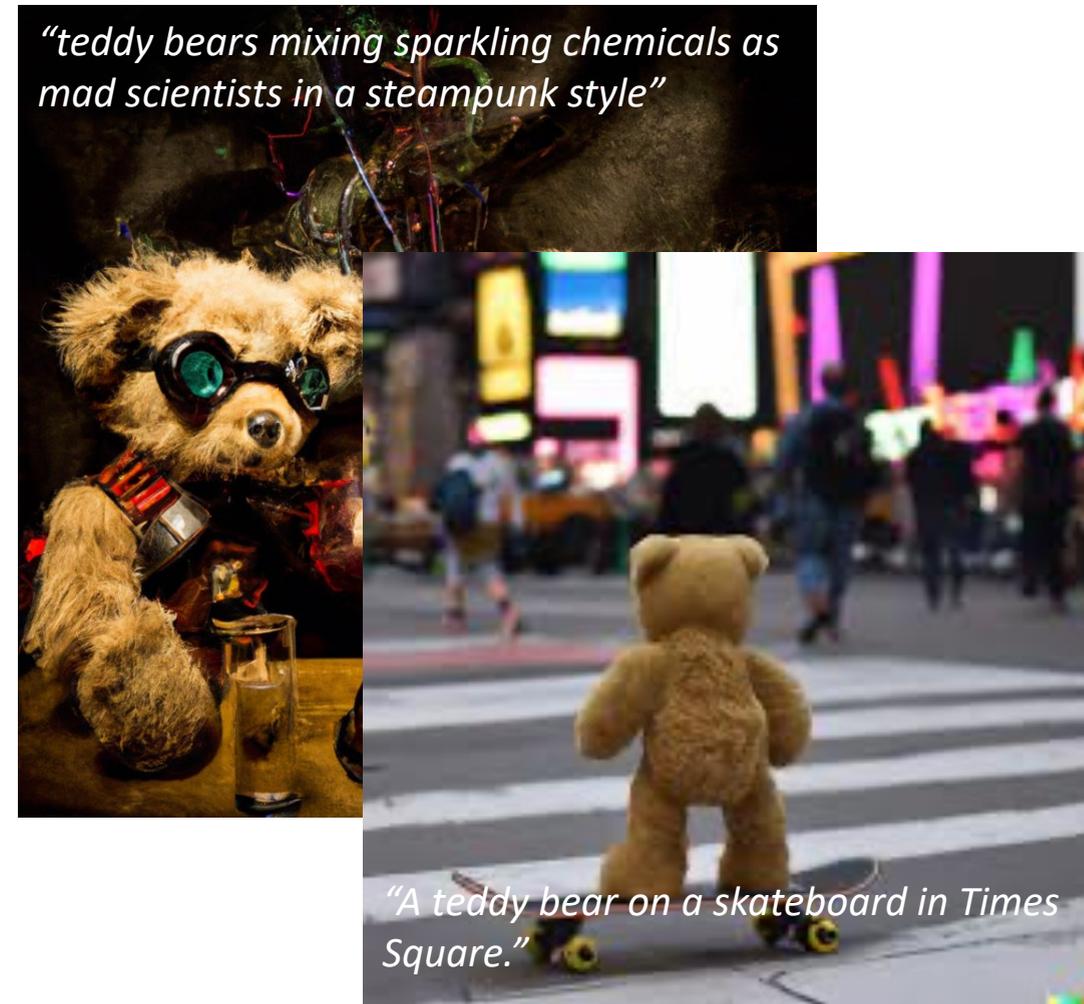
“Gothic church”

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

# Text-to-Image Synthesis

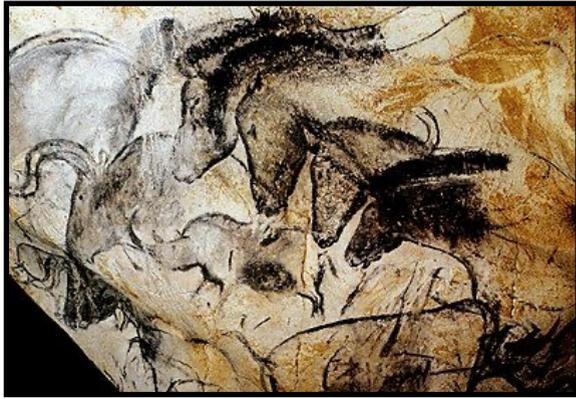


Autoregressive models  
(Image GPT, Parti)



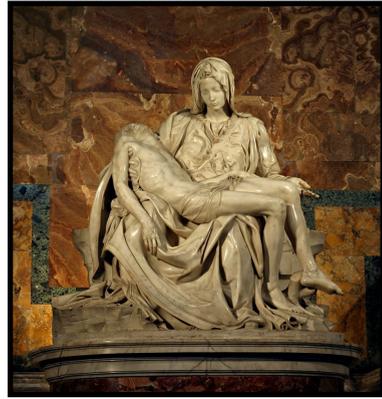
Diffusion models  
(DALL-E 2, Imagen)

Cave art



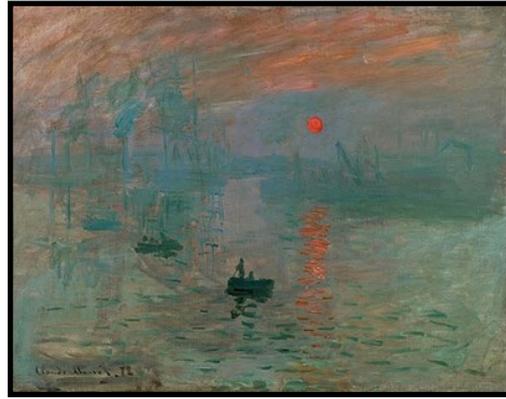
32,000 BC

Sculpture



1498

Painting



1872

Computer Graphics



2012

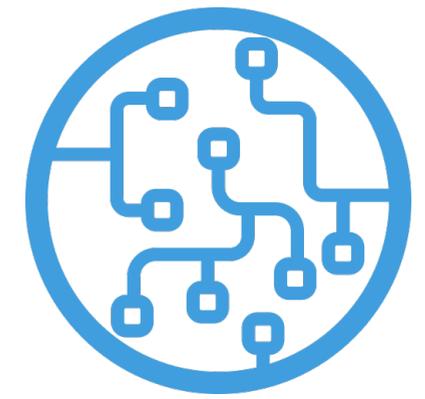
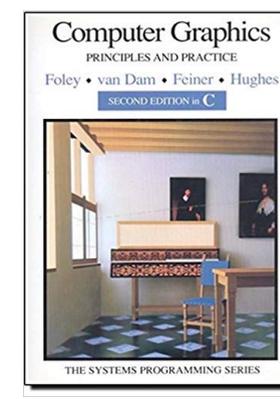
Earth pigments

Chisel

Oil paint

Computer/Algorithms

Data + Learning



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

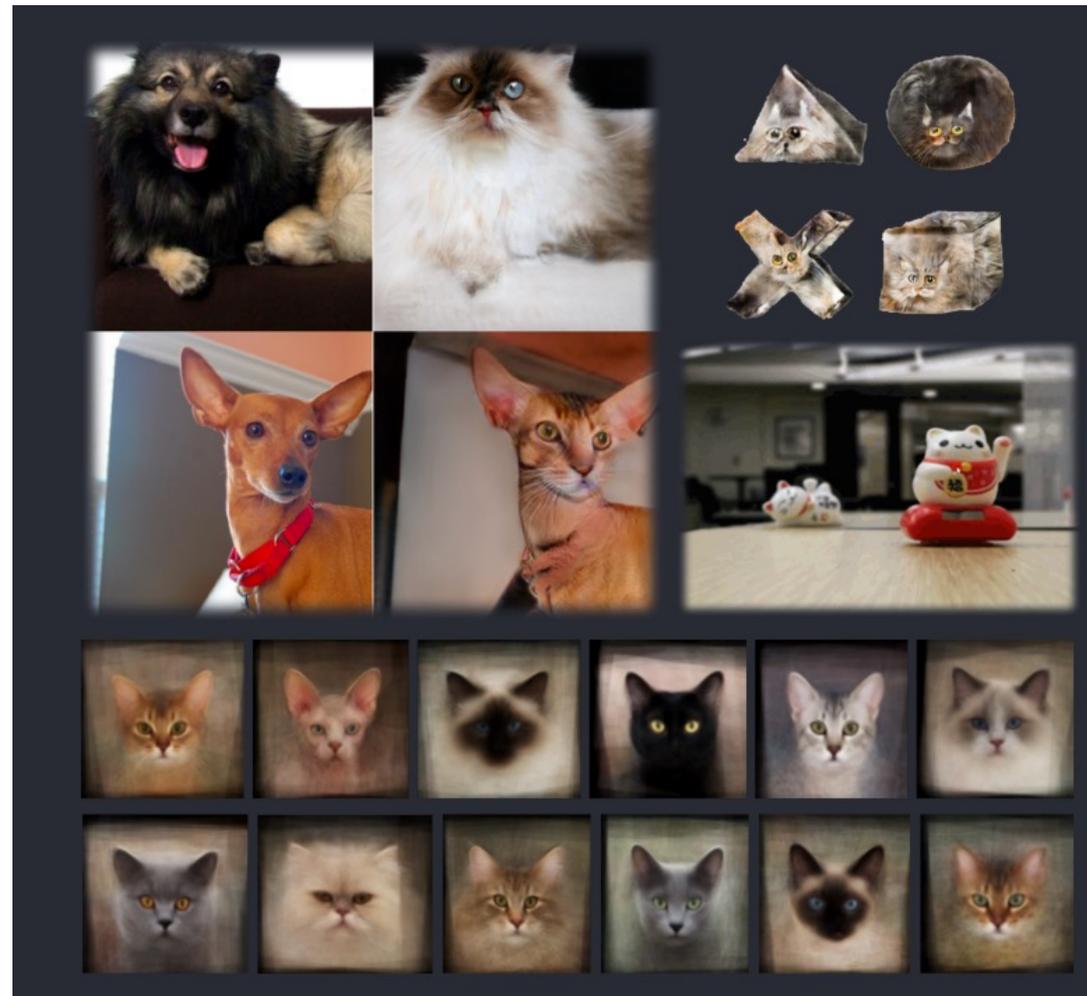
1. You will get a foundation in image editing and synthesis.
  - Texture synthesis and style transfer.
  - Face modeling and synthesis.
  - Image colorization and inpainting.
  - Video generation and editing.
  - Image-to-image translation.
  - Image and video editing. (warping, morphing, compositing)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

# Course objectives

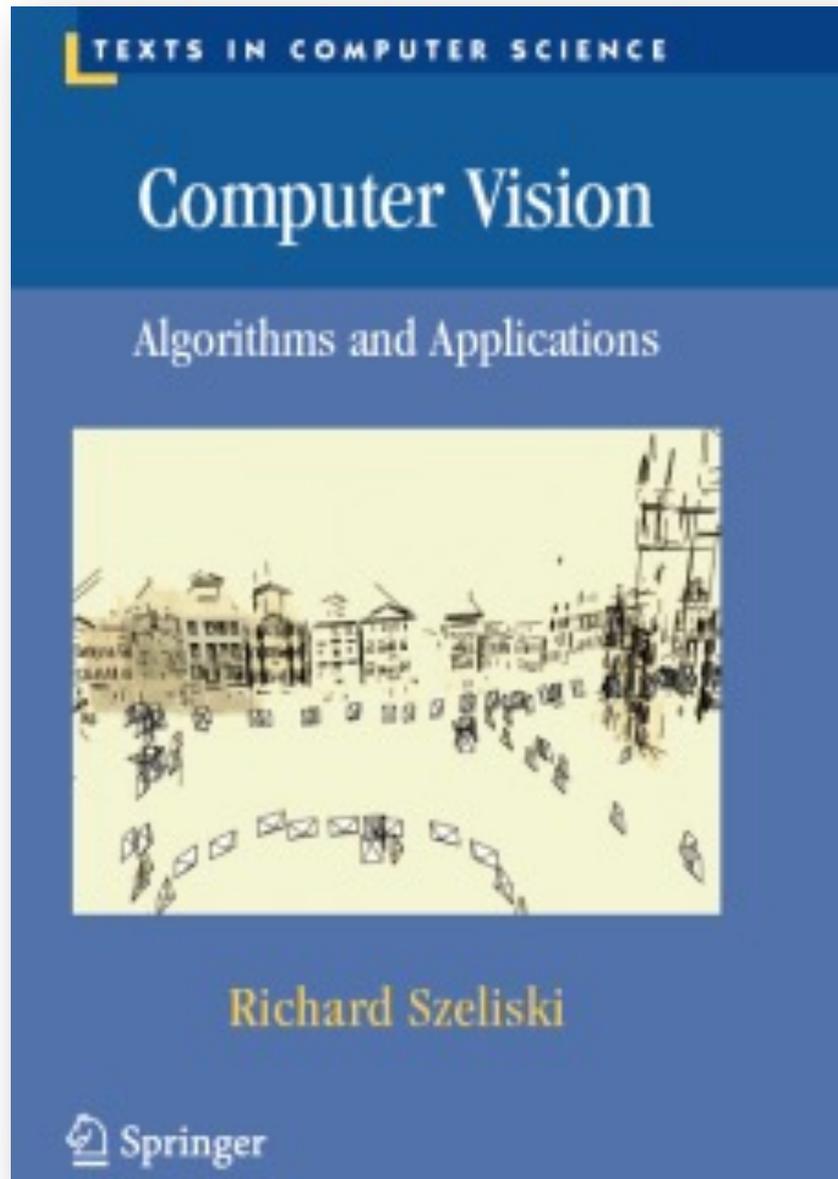
2. You will get a foundation of machine learning concepts
  - (fast) Nearest neighbor search.
  - Principal component analysis, Gaussian Mixture model. Markov Random Field (MRF)
  - Convolutional neural networks.
  - Deep generative models: Auto-encoder, Generative Adversarial Networks, Flow-based models,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

# Course objectives

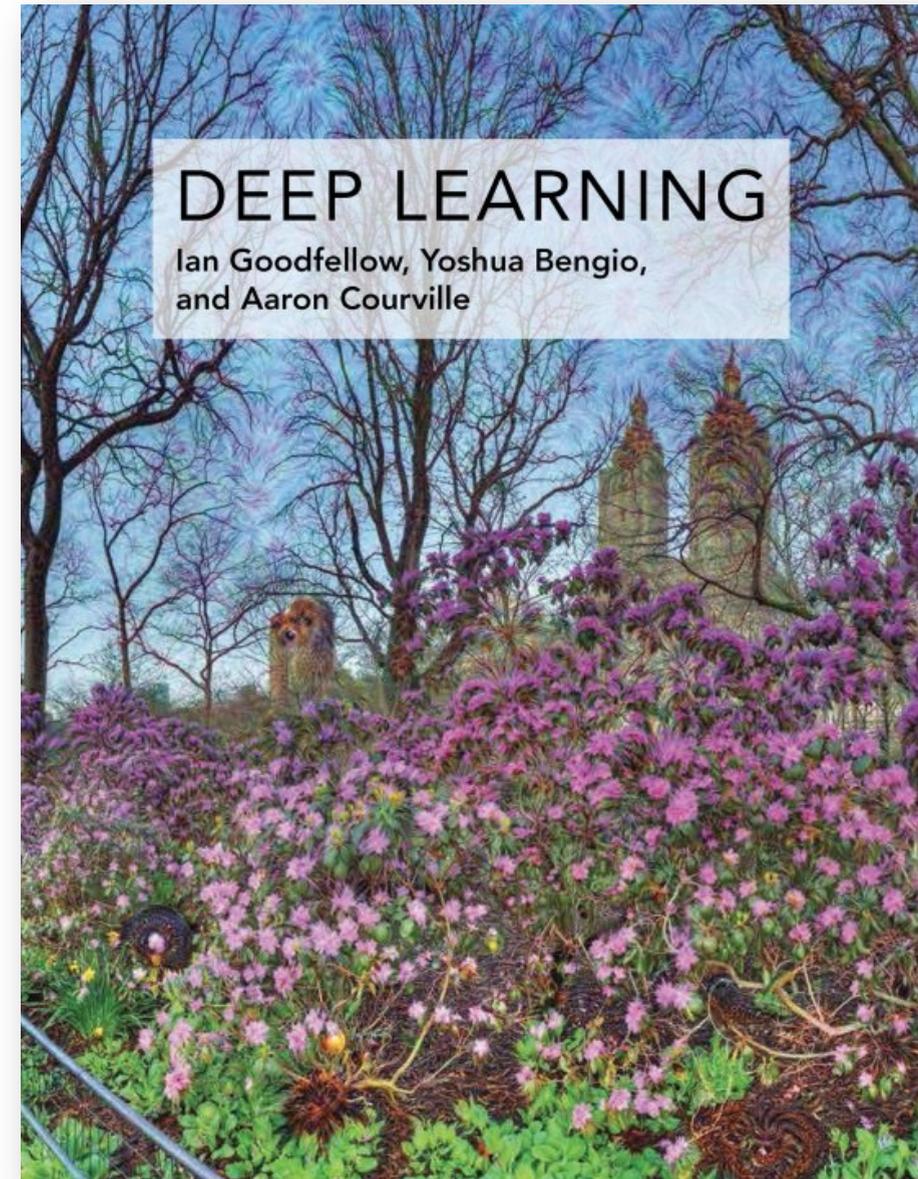
3. You will have some cool results with your own photos



# Textbook



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

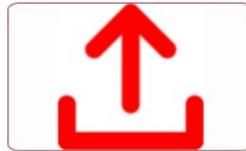


<https://www.deeplearningbook.org/>  
(2016 edition)

# 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

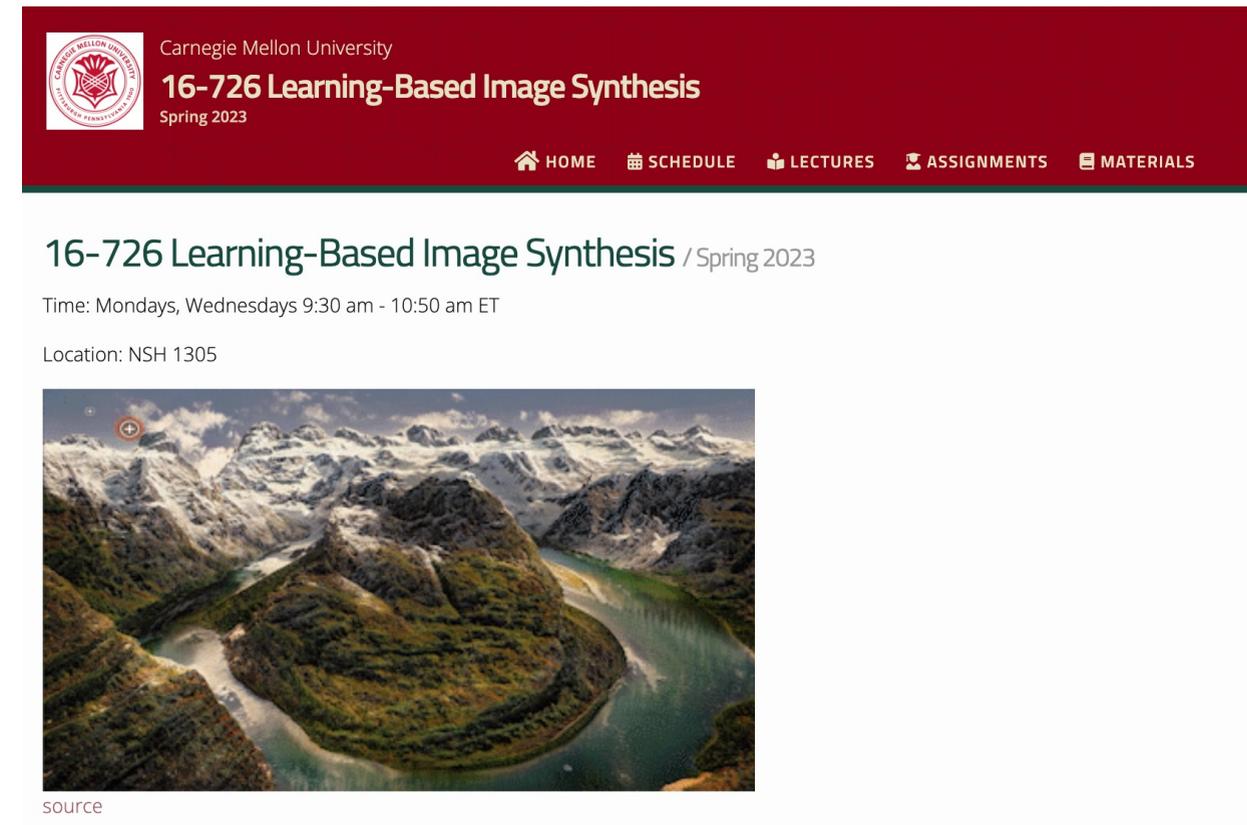
- Derive the math, implement stuff from scratch (+ starter code), and apply it to your own photos
- Every person does their own project (except final)
- Reporting via web page (+ submit code to Canvas)
- Afterwards, vote for class **favorite(s)! Gift!**
- Programming Language:
  - Python and PyTorch
  - 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 course page for 16-726 Learning-Based Image Synthesis at Carnegie Mellon University, Spring 2023. The page features a dark red header with the university logo and navigation links for HOME, SCHEDULE, LECTURES, ASSIGNMENTS, and MATERIALS. Below the header, the course title and semester are displayed, along with the class time (Mondays, Wednesdays 9:30 am - 10:50 am ET) and location (NSH 1305). A large image of a mountain landscape with a river is shown, with a small red circle and crosshair indicating a source point. The word "source" is written below the image.

# 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/>