

# Advanced Computer Vision

## Week 02

Sep. 6, 2022  
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# Image Processing with Python

# Anaconda – "Virtual Environment"

## Purpose?

→ Package & environment management system [1]

## Why?

- **Various versions** of the package are required to run the code
- To use multiple versions on a system, we have to **repeat** the process of installing and uninstalling.
- Conda easily creates, saves, loads and **switches** between environments on your local system.



[1] <https://docs.conda.io/en/latest/>

# Conda: Installation

## Download Conda file

```
$ wget https://repo.anaconda.com/archive/Anaconda3-xxxx.xx-Linux-x86_64.sh
```

## Install Conda

```
$ sh Anaconda3-xxxx.xx-Linux-x86_64.sh
```

## Apply .bashrc

```
$ source ~/.bashrc
```

## If you missed base initialization

```
$ conda config --set auto_activate_base true
```

## How to turn on and off Conda?

```
$ conda activate
```

```
$ conda deactivate
```

```
Preparing transaction: done
Executing transaction: done
installation finished.
Do you wish the installer to initialize Anaconda3
by running conda init? [yes|no]
[no] >>> |
```

Type "yes" for  
initialization

# Conda: Create Your Own Environment

## Create a new Conda environment

```
$ conda create -n my_env python=3.7
```

## Check available Conda environments

```
$ conda env list
```

## Activate the environment

```
$ conda activate my_env
```

## Check Python version

```
$ python --version
```

## Remove environment

```
$ conda env remove -n my_env
```



→ **Please activate your environment, whenever you open a new terminal!**

→ **For more efficient programming, please try tmux! [1]**

[1] <https://github.com/SeokjuLee/terminal-setup>

# Conda: Package Management

## Install new packages on the Conda

```
$ conda install new_pkg
```

## Install some basic packages as follows:

```
$ conda install numpy
```

```
$ conda install scikit-learn
```

```
$ conda install scipy
```

```
$ conda install scikit-image
```

```
$ conda install -c conda-forge opencv
```

```
$ conda install matplotlib
```

```
$ conda install tqdm
```

**Some packages are not available with Conda installation. Please try pip! [1]**

## First, install pip (package installer for Python)

```
$ conda install pip
```

```
$ pip install new_pkg
```

## Check the list of installed packages in the current environment

```
$ conda list
```

```
(test) slee@oem-System-Product-Name:/SSD1/slee$ python puzzle_1.py
Traceback (most recent call last):
  File "puzzle_1.py", line 6, in <module>
    import numpy as np
ModuleNotFoundError: No module named 'numpy'
```

Type "-c" option to specify the channel (package distributor)

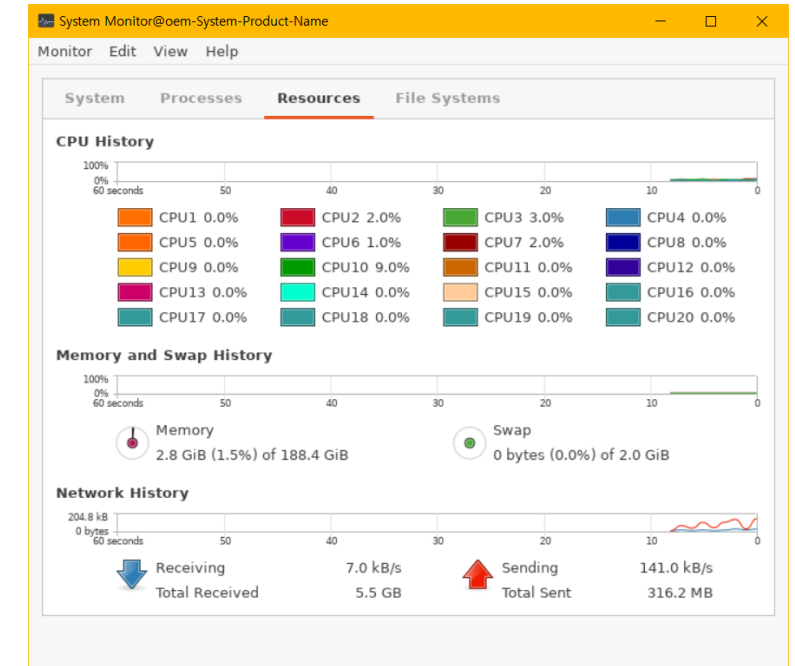


[1] <https://daewonyoon.tistory.com/359>

# Install Useful Applications

## System monitor

\$ sudo apt-get install [mate-system-monitor](#)



## Vim (improved vi – text editor for terminal) [1]

\$ sudo apt-get install [vim](#)

## Check disk space

\$ sudo apt-get install [ncdu](#)

## Tmux

\$ sudo apt-get install [tmux](#)

## Sublime Text ([link](#)): code editor

```
ncdu 1.15.1 - Use the arrow keys to navigate, press ? for help
-- /home/omg
621.7 MiB [#####] /Music
552.3 MiB [#####] /.cache
338.0 MiB [#####] /Downloads
280.4 MiB [#####] /snap
189.0 MiB [#####] /.config
139.9 MiB [#####]
93.6 MiB [#####]
44.9 MiB [#####]
20.9 MiB [#####]
15.0 MiB [#####]
5.7 MiB [#####]
1.1 MiB [#####]
692.0 KiB [#####]
88.0 KiB [#####]
76.0 KiB [#####]
56.0 KiB [#####]
28.0 KiB [#####]
16.0 KiB [#####]
16.0 KiB [#####]
8.0 KiB [#####]
8.0 KiB [#####]
4.0 KiB [#####]
4.0 KiB [#####]
4.0 KiB [#####]
4.0 KiB [#####]
4.0 KiB [#####]
Total disk usage: 2.2 GiB Apparent size: 2.2 GiB Items: 31240
```

ncdu help

1:Keys	2:Format	3>About
up, k	Move cursor up	
down, j	Move cursor down	
right/enter	Open selected directory	
left, <, h	Open parent directory	
n	Sort by name (ascending/descending)	
s	Sort by size (ascending/descending)	
C	Sort by items (ascending/descending)	
M	Sort by mtime (-e flag)	
d	Delete selected file or directory	
t	Toggle dirs before files when sorting	
-- more --		
Press q to close		

[1] <https://gmlwjd9405.github.io/2019/05/14/vim-shortkey.html>

# Image Processing Puzzle





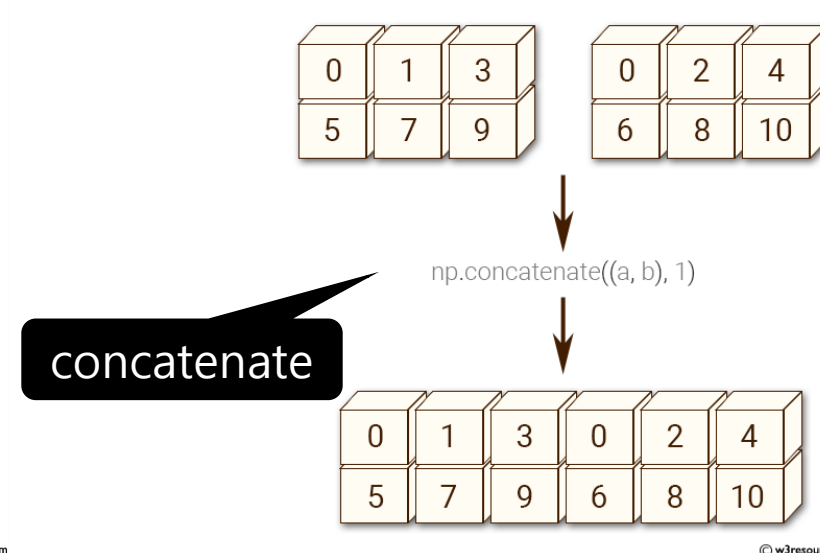
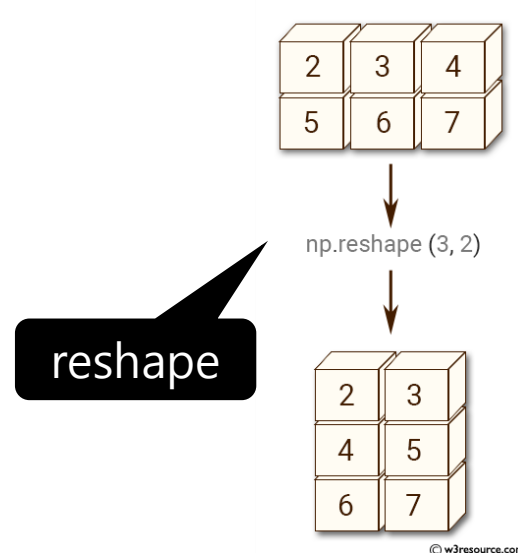
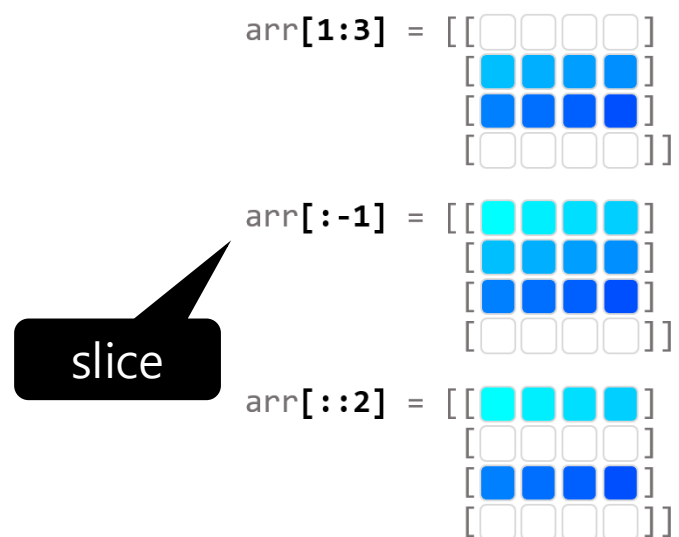
# Summary of Previous Lesson

## Basics of Python functions

→ How to define and use

## Basics of NumPy arrays

- Many useful operations for multi-dimensional arrays
- Please always check the current shape of arrays using the **shape** method!
- Basic math operations: add, subtract, min, max, mean, etc. along different axis
- Basic transformations: slicing, reshape, concatenate, stack, append, etc.



[1] w3resource.com

# Now, Let's Play with Images!

## Solve image processing puzzles.

→ Multiple image processing missions to make specific images.

→ If you need, please refer below pages.

Numpy: <https://numpy.org/doc/stable/reference/>

Scikit-learn image: <https://scikit-image.org/>

PIL image: <https://pillow.readthedocs.io/en/stable/reference/Image.html>

Codes are available at:

<https://view.kentech.ac.kr/a6fac1a2-7304-409e-85f0-78b1d527034f>

### Installed packages

**scikit-learn 1.0.2**

4 dependencies

numpy

scipy

joblib

threadpoolctl

**matplotlib 3.5.1**

**scikit-image 0.19.2**

8 dependencies

numpy

scipy

networkx

pillow

imageio

tiffio

PyWavelets

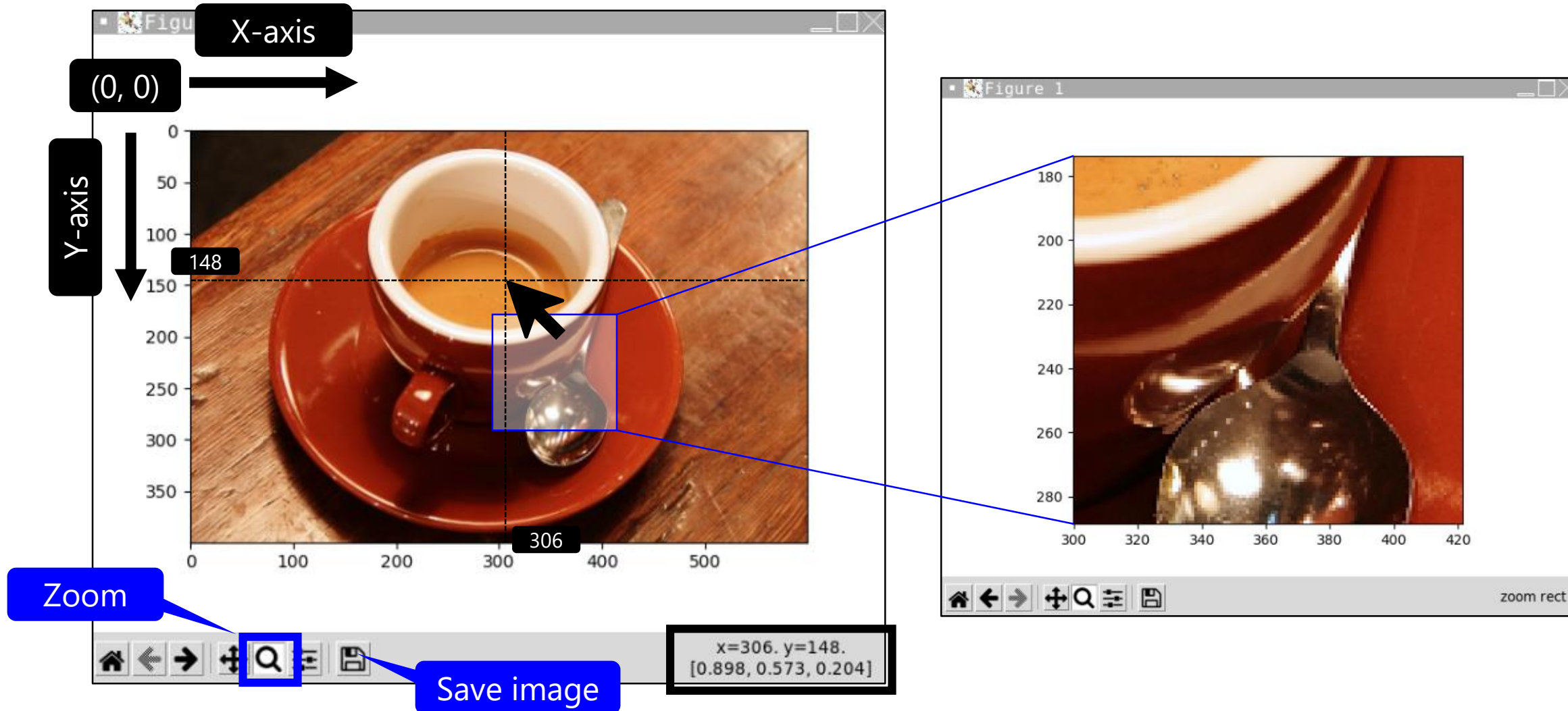
packaging

**numpy 1.22.3**

# Image Processing Puzzle

**Now we will try visualization**

→ Enables image debugging



# Image Processing Puzzle

## Discussion 2: shifting image over x-axis

→ Use loop to generate the target image

```
hh, ww, ch = im.shape
```

Check the shape

```
for i in range(ww):
```

Search space: maximum width

```
    print('index:', i)
```

```
    im1 = np.zeros(im.shape)
```

Initialize

```
    im1[:, i:, :] = im[:, :ww-i, :]
```

Assign

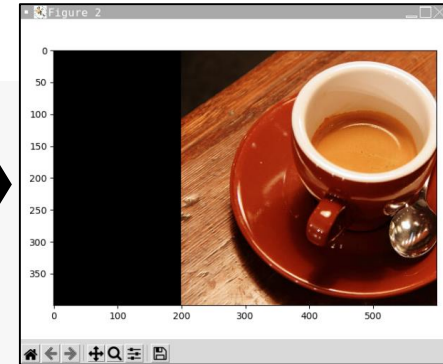
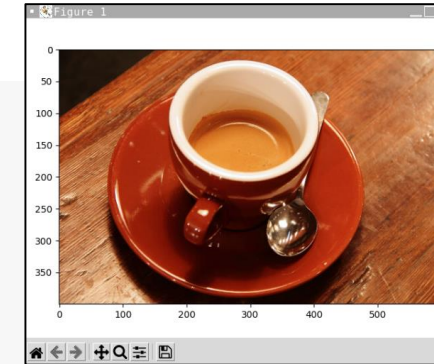
```
    if (im1 == gt1).all():
```

```
        break;
```

Break the loop if the target is matched

```
check_same(gt1, im1)
```

Check if the output is correct



# Image Processing Puzzle

## Discussion 2-2: shifting over both x- and y-axis

→ Use loop to generate the target image → Too slow!

```
flag = False
hh, ww, ch = im.shape
for i in range(hh):
    for j in range(ww):
        print('index:', i, j)
        im1 = np.zeros(im.shape)
        im1[i:, j:, :] = im[:hh-i, :ww-j, :]
        error = np.abs(im1 - gt1).mean()
        if error == 0:
            flag = True
            break;
    if flag:
        break;
check_same(gt1, im1)
```

Search space: both maximum height + width  
Use "**nested loop**"

You can check the processing time using the below code lines:

```
import time
start = time.time()
...
print(time.time() - start)
```

# Image Processing Puzzle

## Discussion 2-2: shifting over both x- and y-axis

→ Dimension reduction. Please discuss this code in your report!

```
hh, ww, ch = im.shape
```

```
gt1_h = gt1.sum(axis=(0,2))
```

```
gt1_v = gt1.sum(axis=(1,2))
```

```
jj = (gt1_h == 0).sum()
```

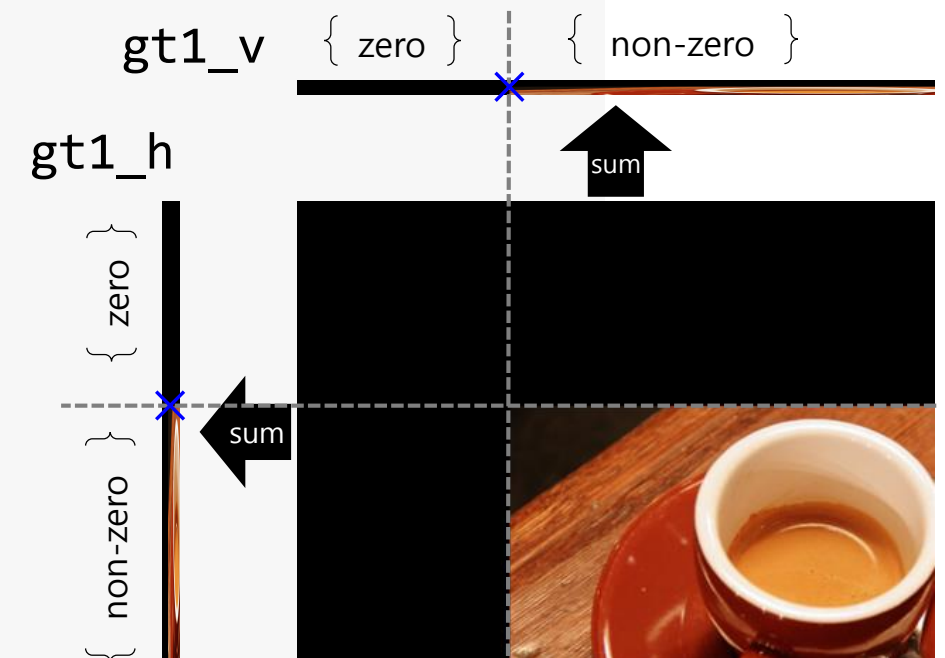
```
ii = (gt1_v == 0).sum()
```

```
im1[ii:, jj:, :] = im[:hh-ii, :ww-jj, :]
```

```
check_same(gt1, im1)
```

**Dimension reduction**

Automatic binary sum  
(= count the number of zeros)



→ Once you are familiar with the **“for-loop”** statement,

Try to implement your code **efficiently** through **dimension reduction**!

# Image Processing Puzzle

## Discussion 4: Image multiplication

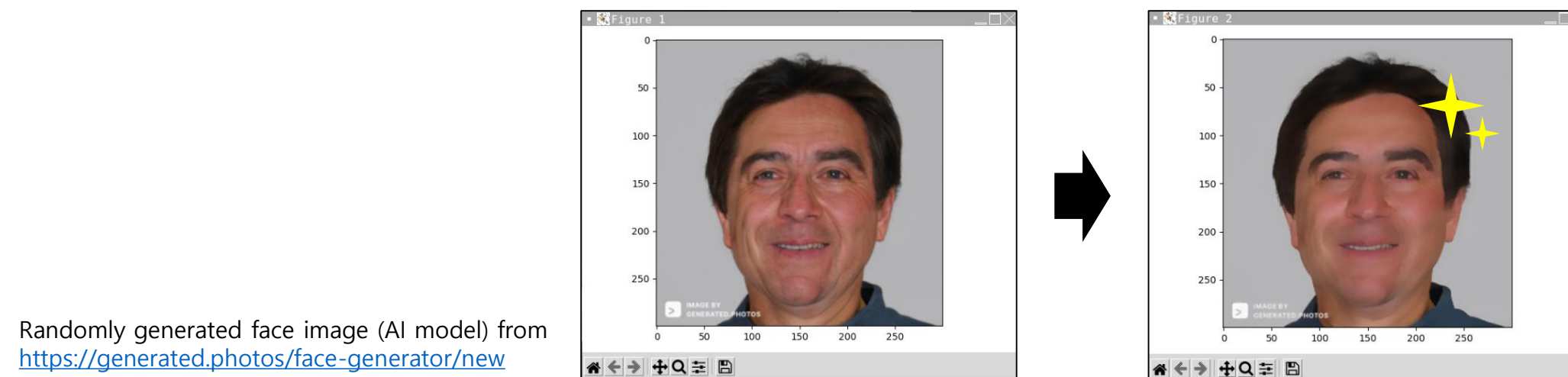
→ Multiply a binary mask to black out unnecessary parts.

## Discussion 5: Image cropping and resizing

→ Crop a specific region with slicing, and resize the image.

## Discussion 6: Photoshop - bilateral filter

→ Let's see how to do "photoshop" with a basic filtering algorithm.





# Discussion

## <Image Processing Puzzle 2>

Please paste your result images (screenshot or save) in this report if needed.

### ### Discussion 2-3: Shifting image ###

2.7. Try yourself! Please try to use "dimension reduction".

2.8. Please visualize your output image.

### ### Discussion 4 - Image multiplication ###

4.1. Please load a ground truth (GT) array from 'samples/puzzle2/gt1.npy'

4.2. Please convert 'im' to look like 'gt1' by multiplying the binary mask.

4.3. What is broadcasting?

4.4. What are the rules for allowing broadcasting?

### ### Discussion 5: Image cropping and resizing ###

5.1. Crop the image (cat's eye) by array slicing.

5.2. Increase the size of the "cat's eye" image to 400 x 400. Please discuss the difference between "rescale" and "resize".

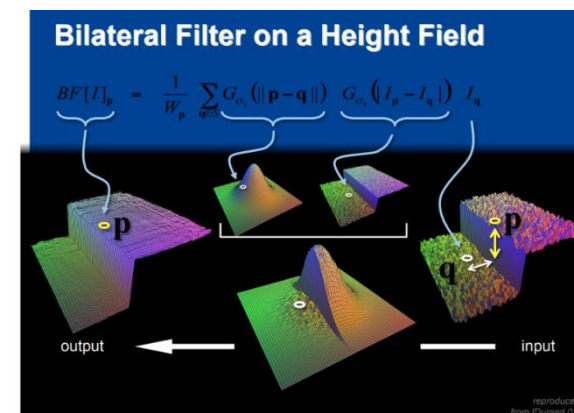
### ### Discussion 6: Photoshop - bilateral filter ###

6.1. Please capture random faces from "https://generated.photos/face-generator/new"

6.2. Please apply a "bilateral filter" on the image.

6.3. Please analyze the effect of the bilateral filter by changing the input parameters.

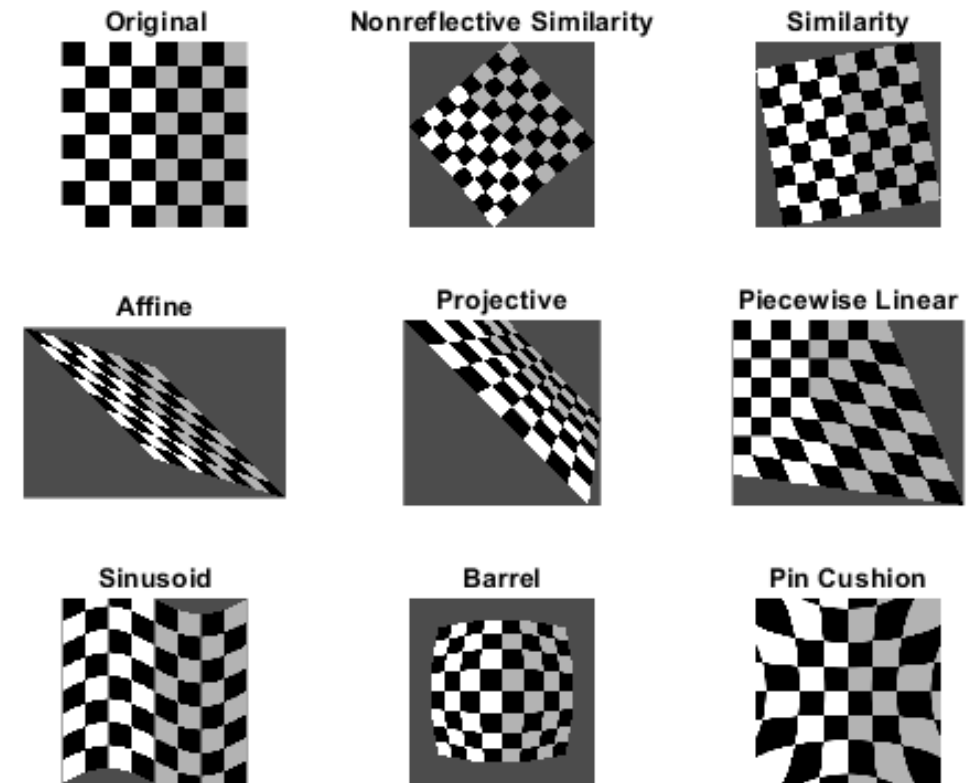
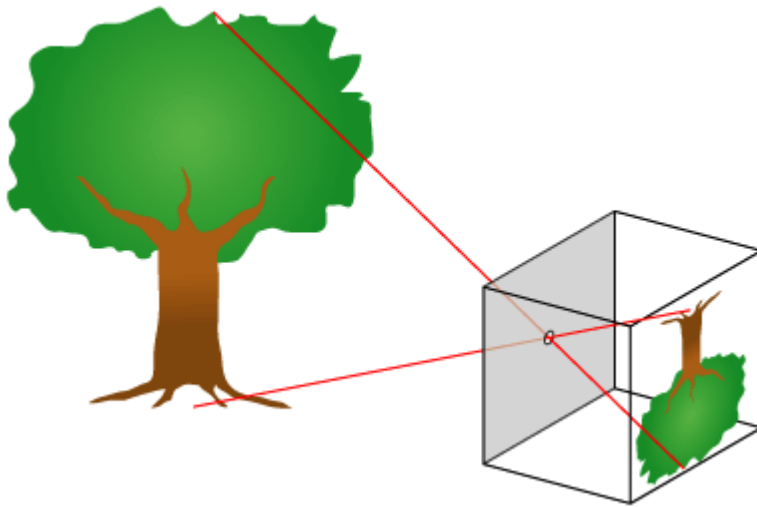
6.4. What are the pros and cons of filtering?





# Next Contents

- Basic camera theory
  - Pinhole camera model
- Basic image transformation



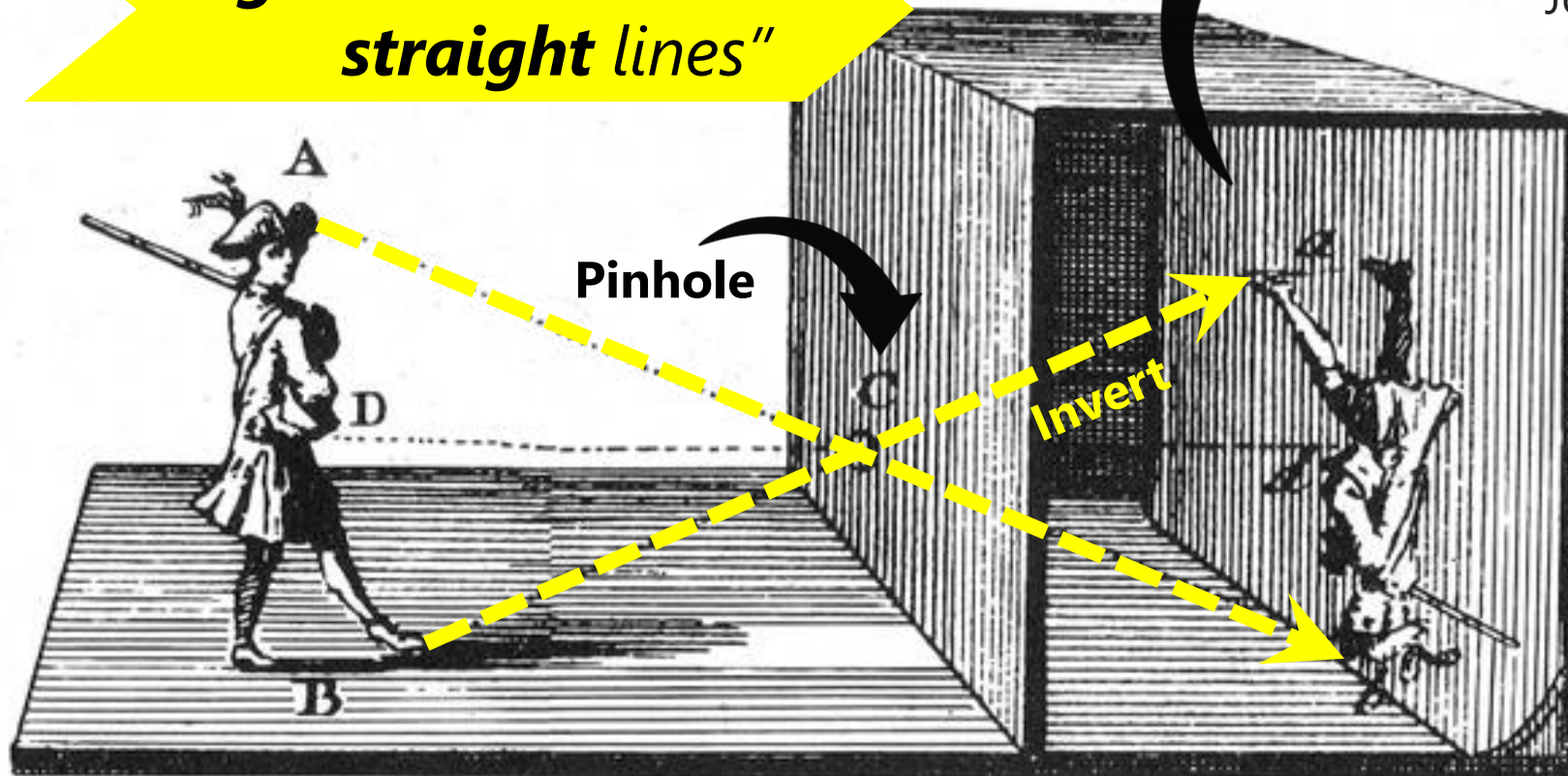
# Brief Overview of Pinhole Camera Model

# Camera Obscura – *Darken Room*

**Camera (Latin)** = room or chamber

**Obscura (Latin)** = dark

**"Light travels in  
straight lines"**



**Photosensitive  
Surface**



Joseph Nicéphore Niépce  
(1765 – 1833)



**The inventor of photography**

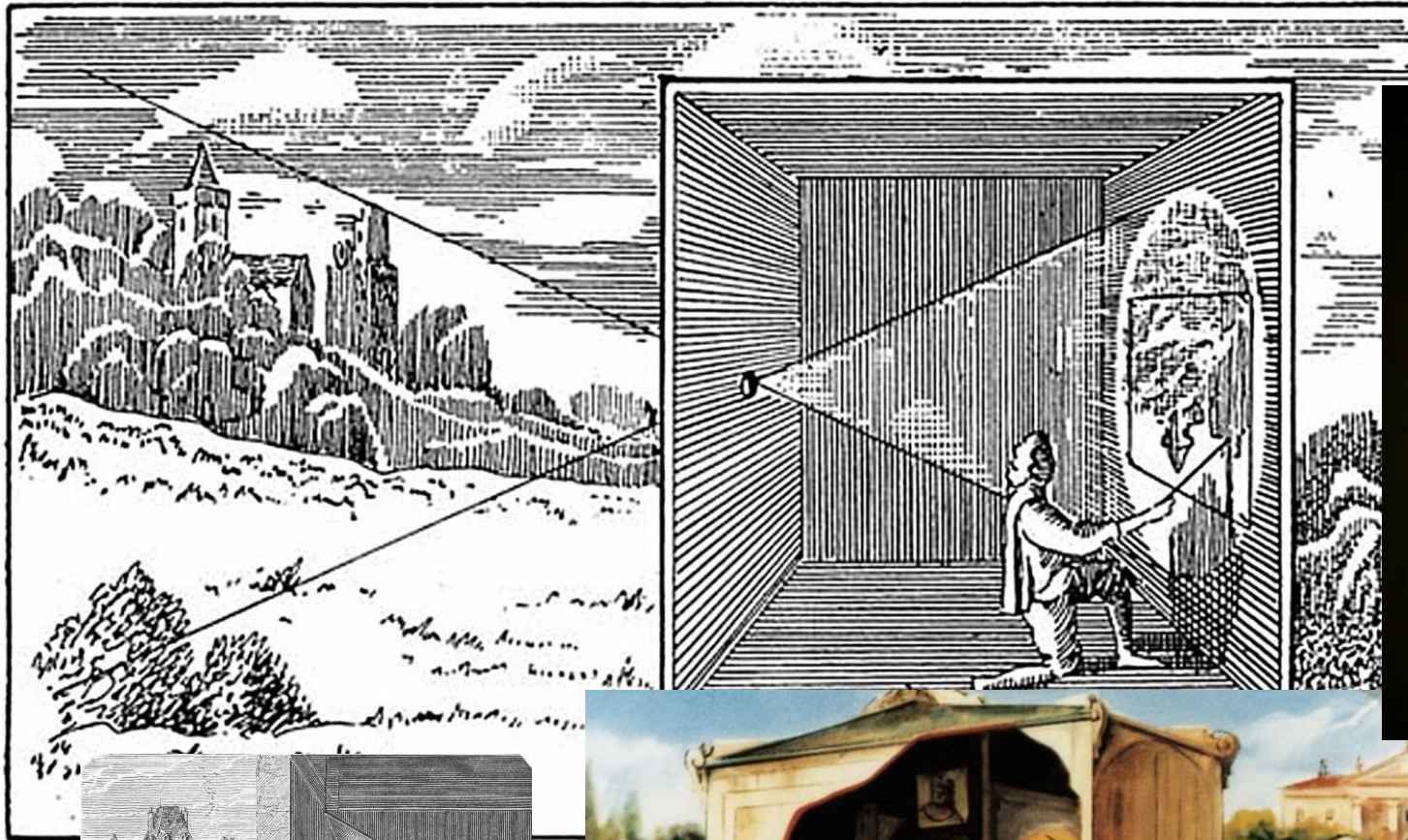


**The first photograph**

→ It took 8 hours



# Camera Obscura – Based on *Art*

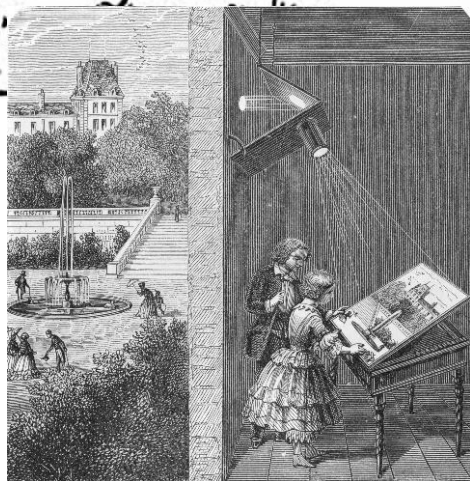


Amazing, cheap, fun way to experiment during COVID-19 quarantine



By Mathieu Stern

**Inviting nature into your home!**

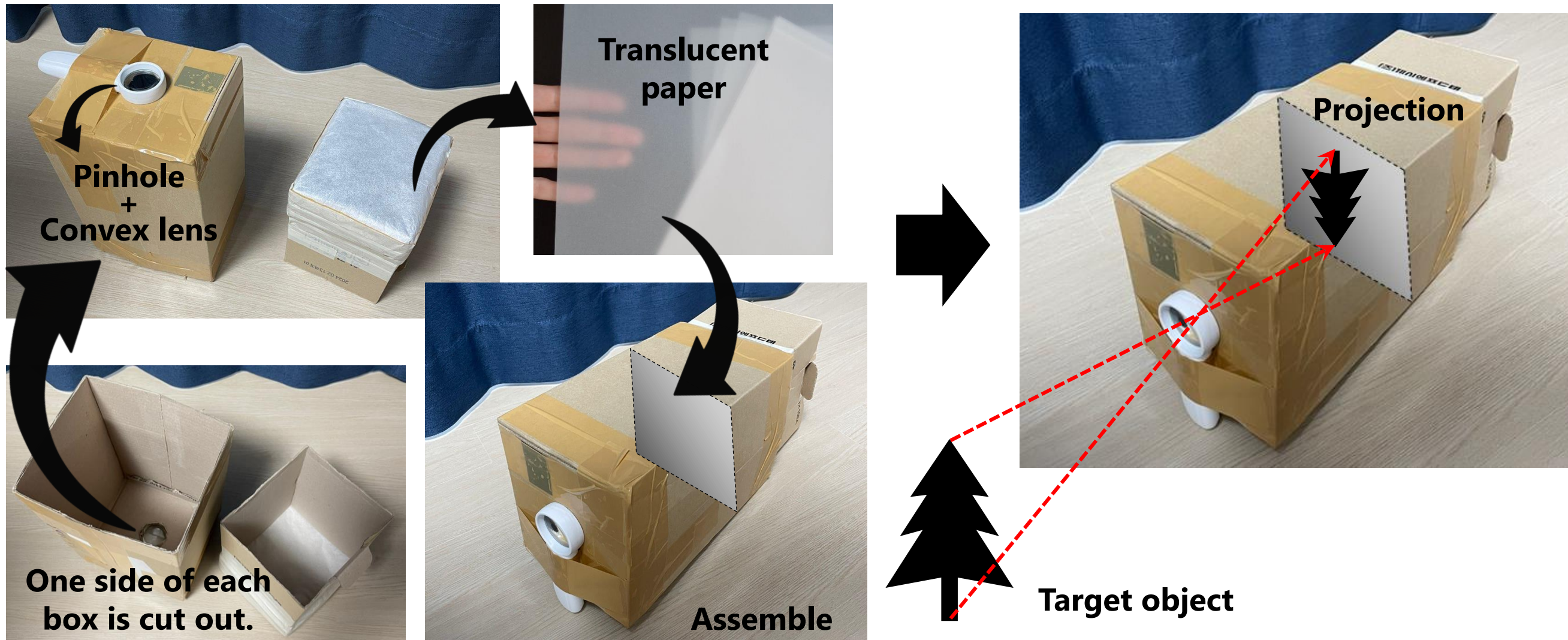


Agents of Change: Camera Obscura (Art Land Magazine)



# Camera Obscura – Making

**Preparation:** two boxes, convex lens, translucent paper





# Camera Obscura – Experiments



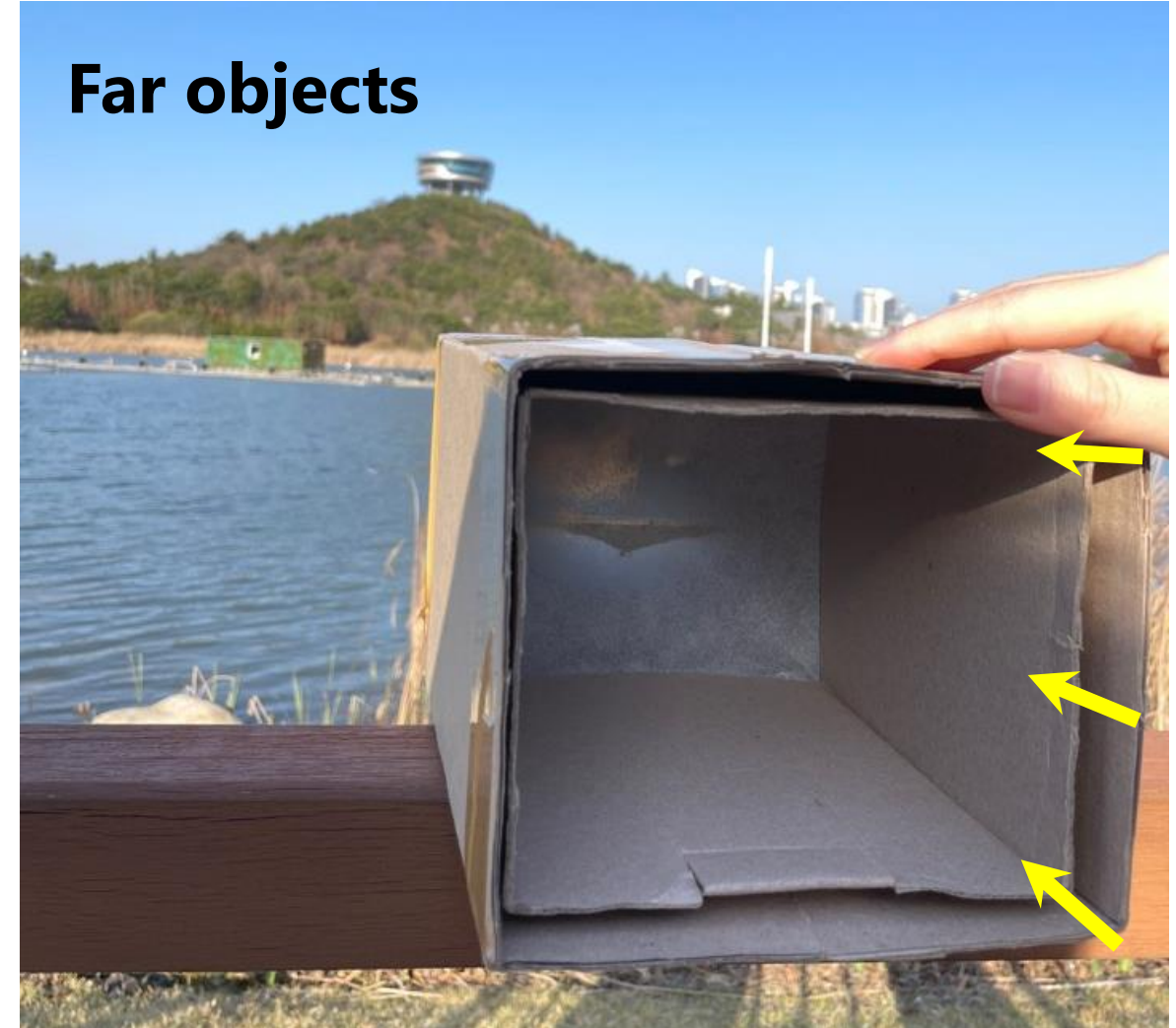


# Camera Obscura – About Focal Length

Near  
objects



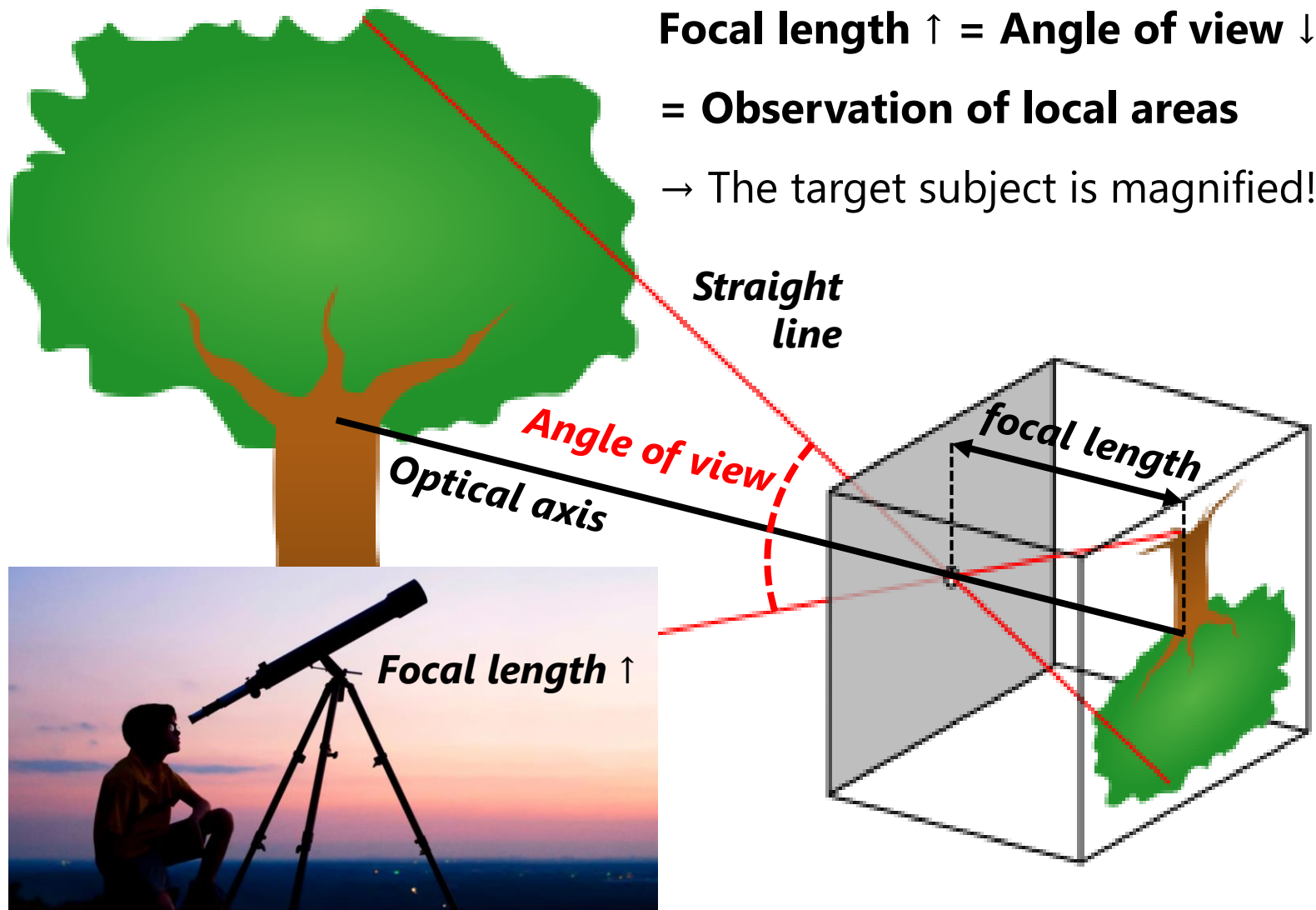
Far objects



- **Near** objects: focal length  $\uparrow$
- **Far** objects: focal length  $\downarrow$

# Pinhole Camera Model

## Simplified example of ray optics



We will make it!

**\*Resolution** (for image, "spatial")

→ The number of pixels in each dimension

**\*Frame rate** (for video, "temporal")

→ The number of image frames per second

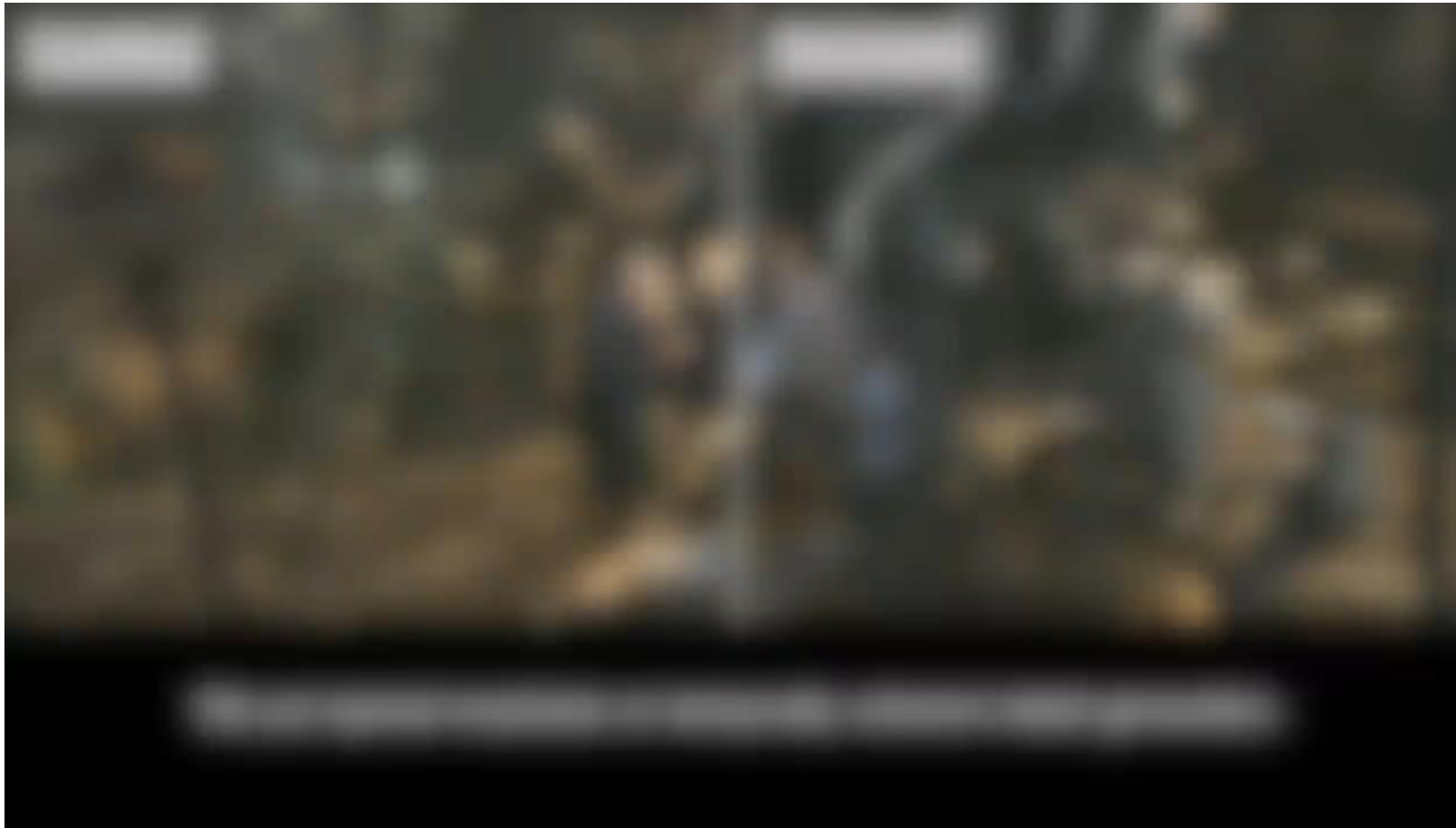
Screen = Photographic film = CCD sensor



# About Resolution

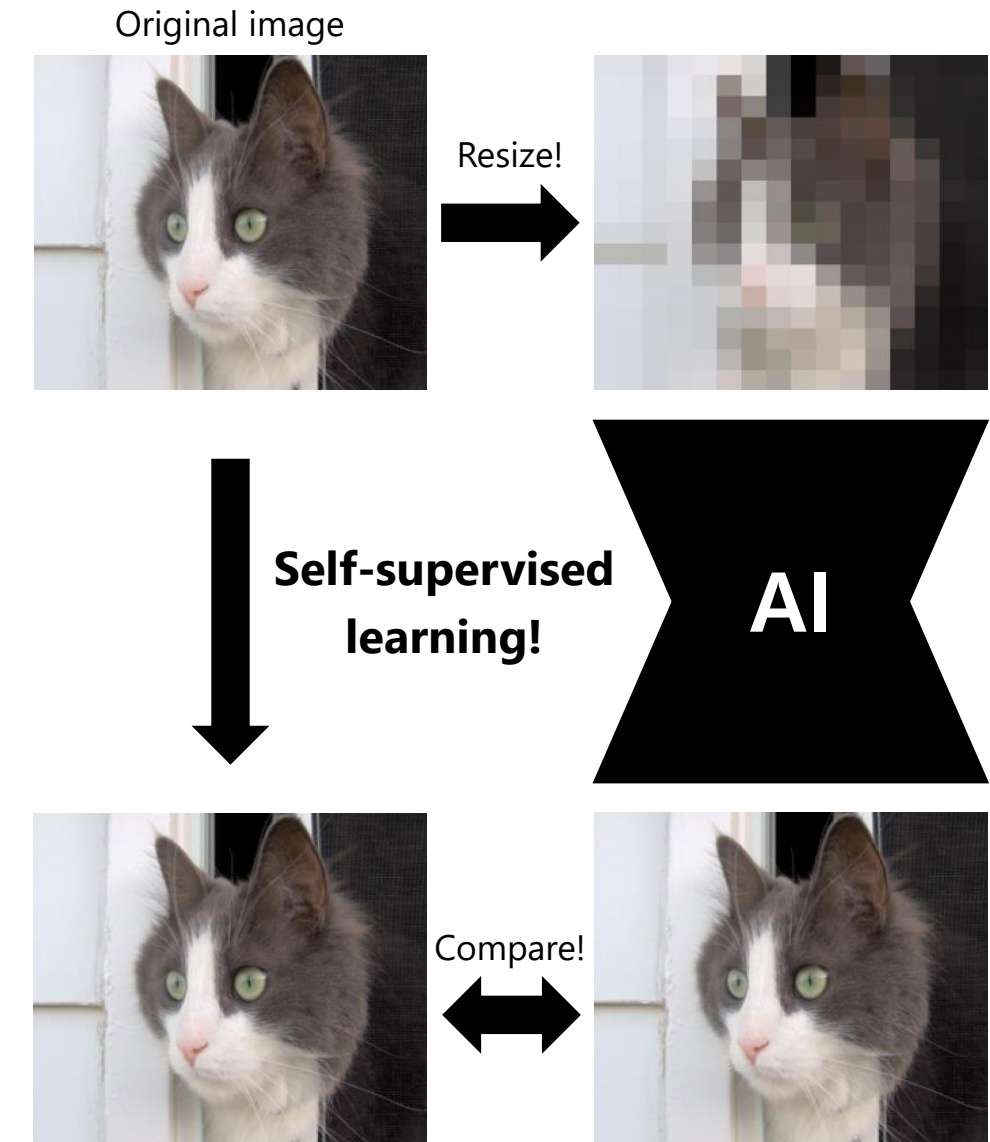
## Example of deep learning application:

→ Image super resolution, “**spatial** processing”



TecoGAN (SIGGRAPH'19)

## How to train?



# About Frame Rate

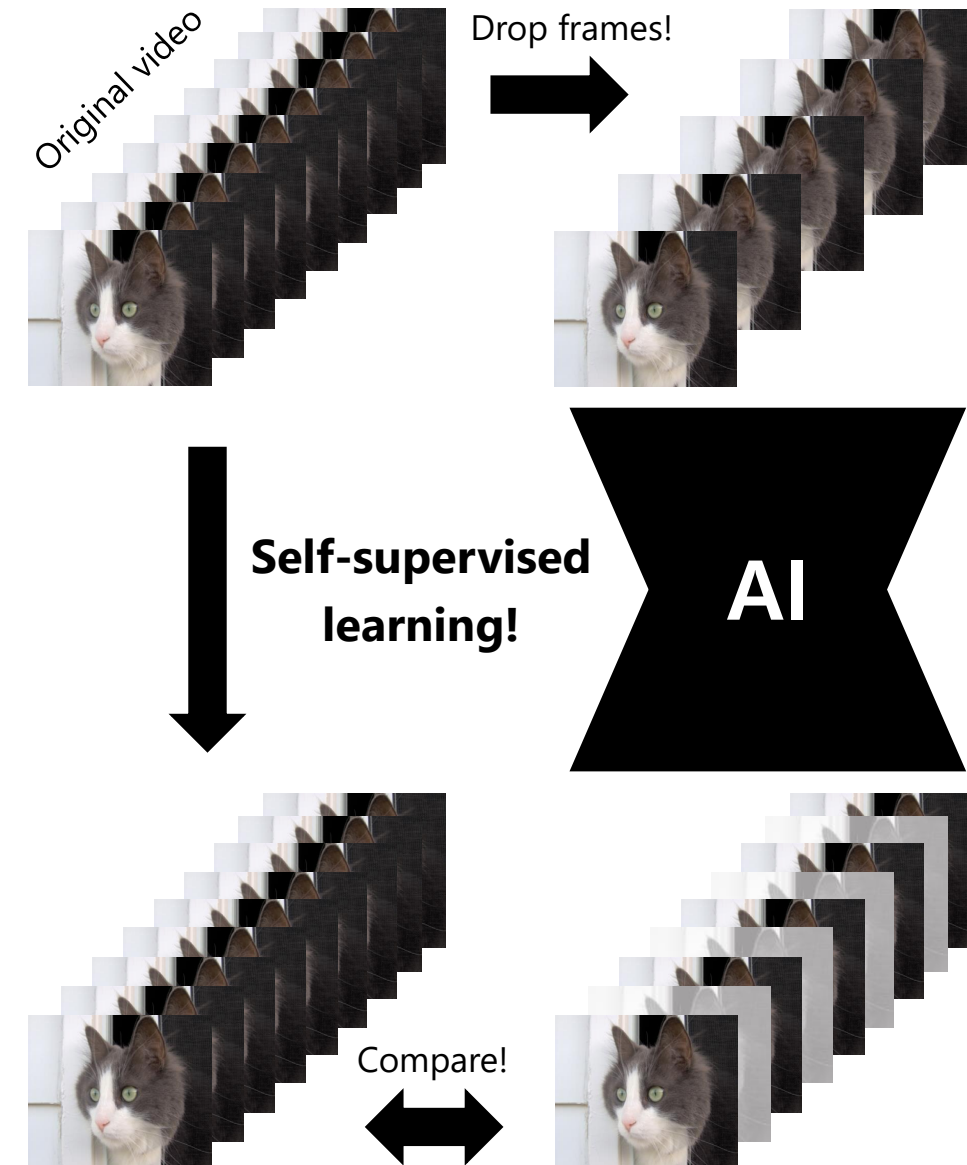
## Example of deep learning application:

→ Video frame interpolation, “**temporal** processing”



Transforming Standard Video Into Slow Motion with AI  
(Research at NVIDIA, 2018)

## How to train?





# About Shutter Speed

## A.k.a., exposure time:

The length of time that the digital sensor inside the camera is exposed to light



→ **How shutter speed affects motion.**

“The faster your shutter speed,  
the sharper your image will be.”

# About Shutter Speed

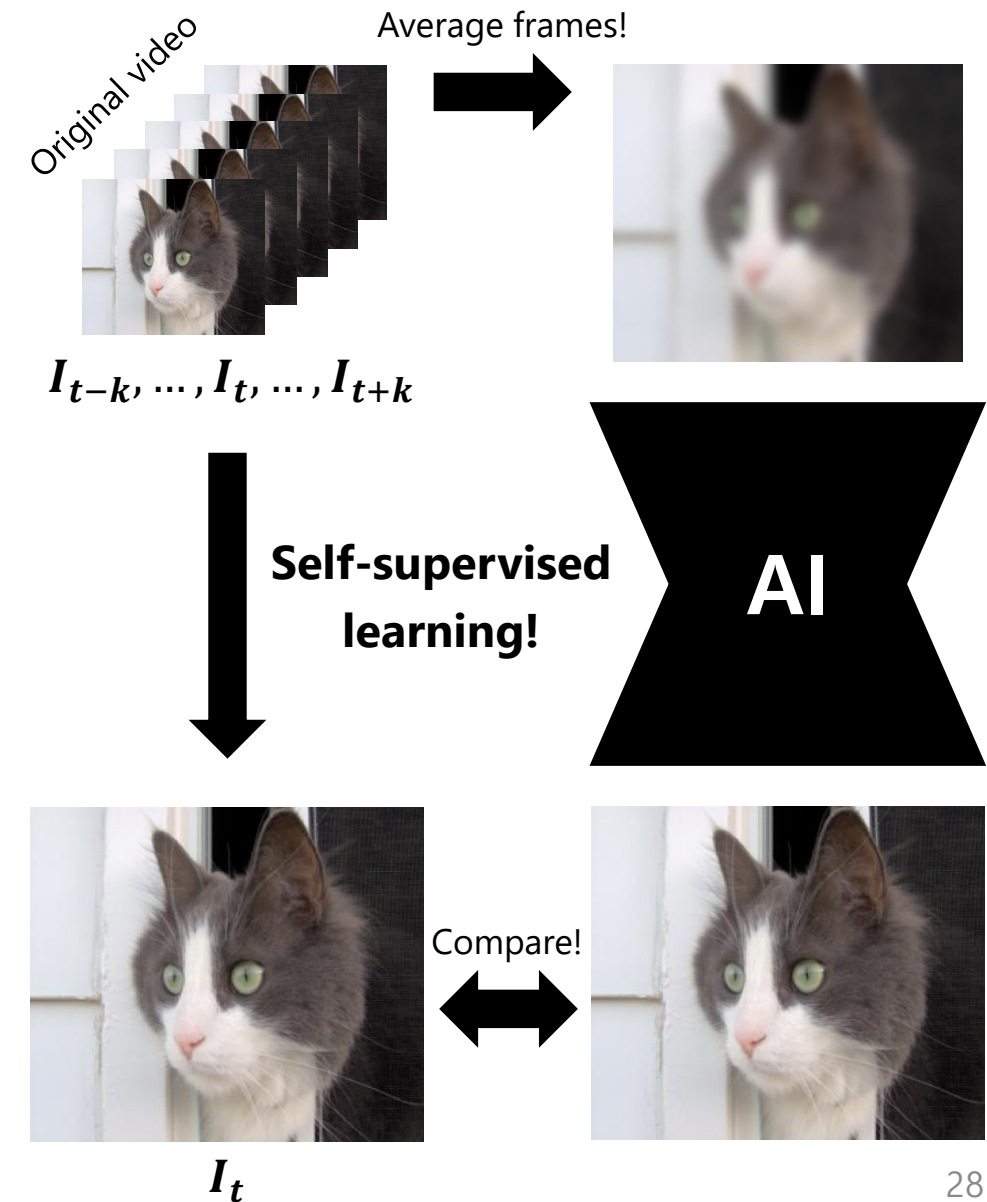
## Example of deep learning application:

→ Motion deblurring



Fix Blurry Photos with Motion Deblur AI (by AKVIS, 2021)

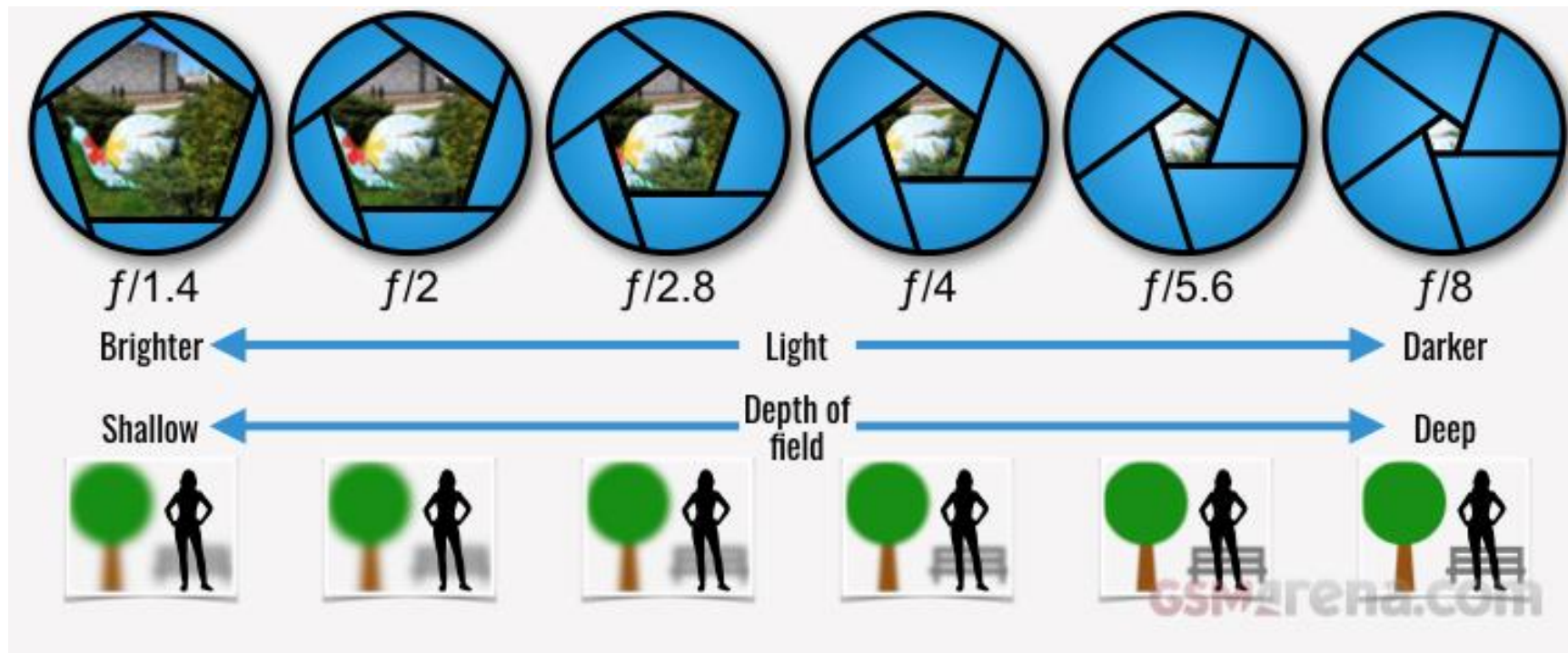
## How to train?



# Aperture

## A hole through which light travels

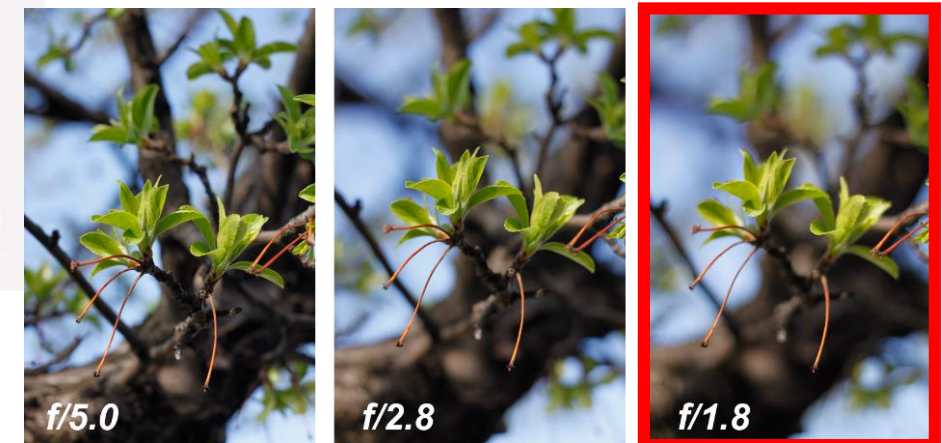
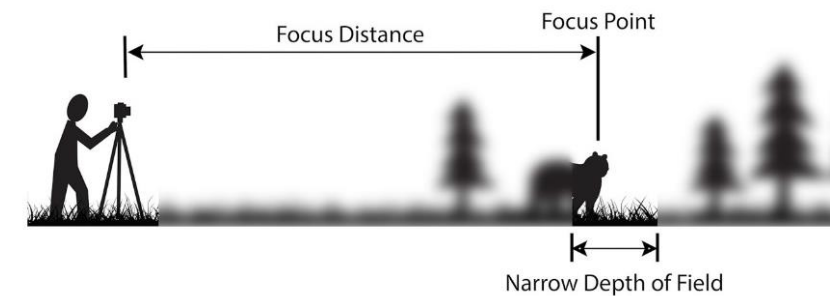
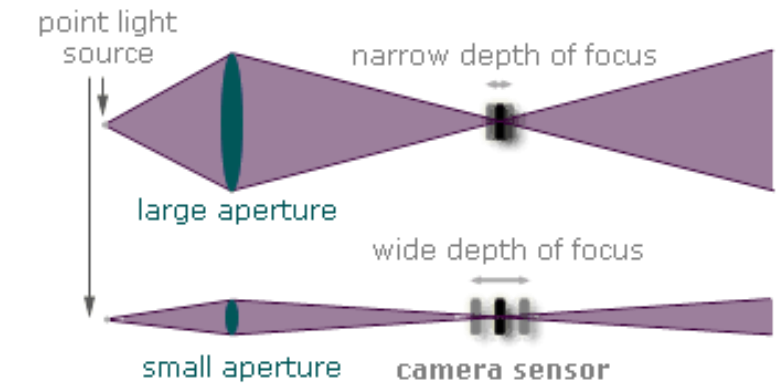
- Controls the amount of the light
- Controls depth-of-field (DoF)



Out focus

= **shallow** depth of field

→ Helps concentrate on the subject!

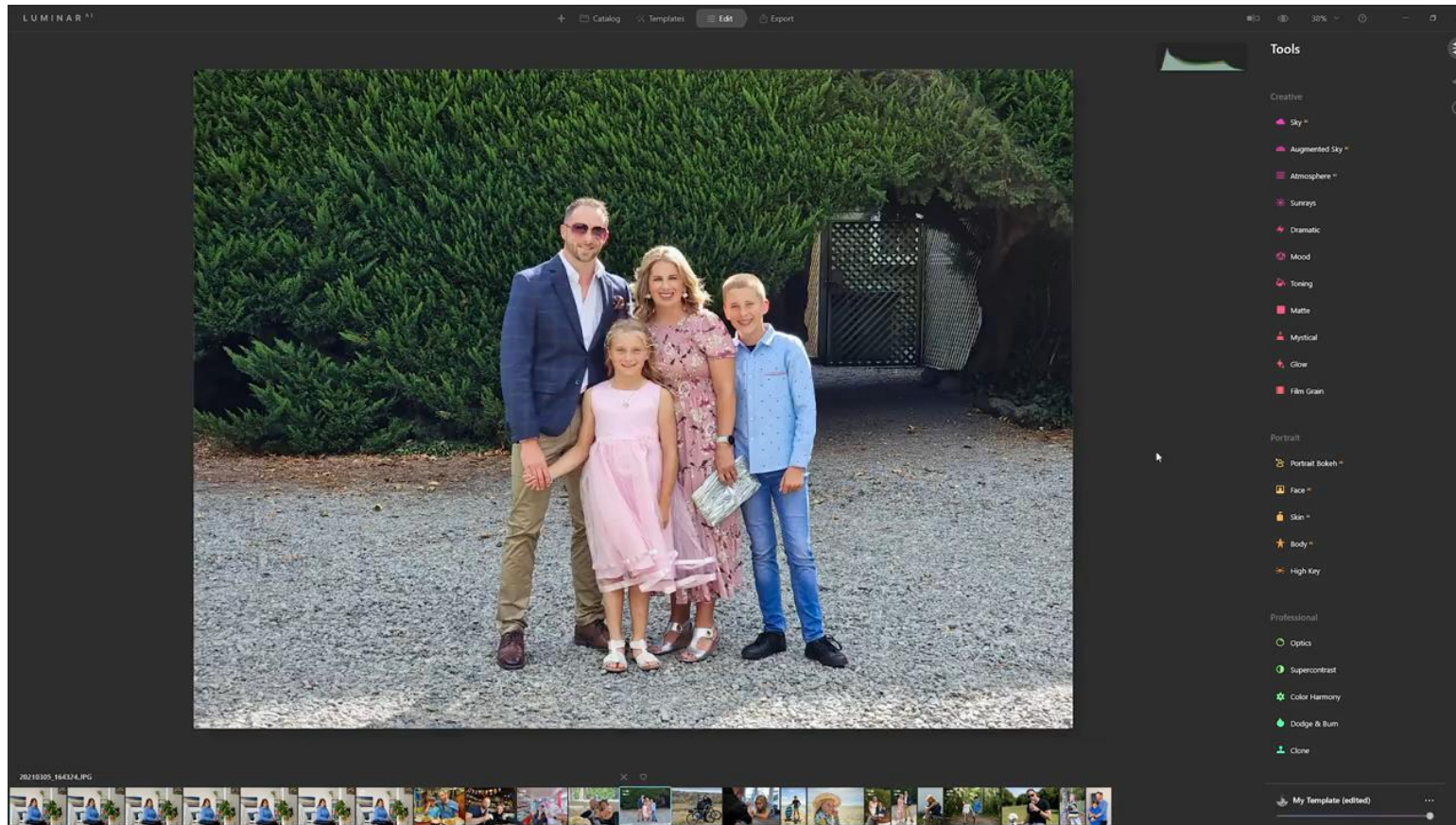
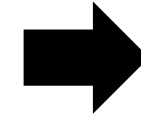




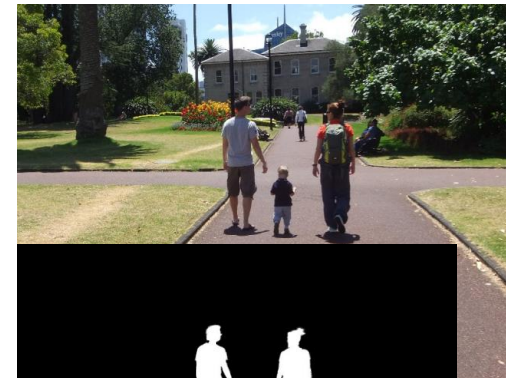
# Out Focusing

Technically difficult for smartphone cameras 🤖

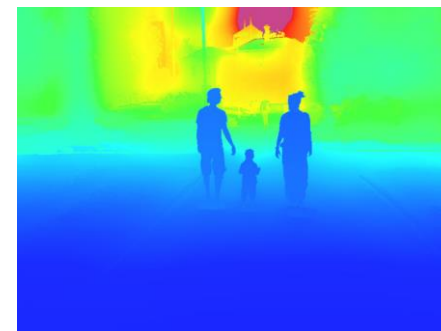
→ Computer vision & AI make this possible!



Automatic bokeh by Luminar AI (2021)



→ AI model for binary **segmentation**



→ All we need is just a **depth!**

# Summary of a Basic Camera Model

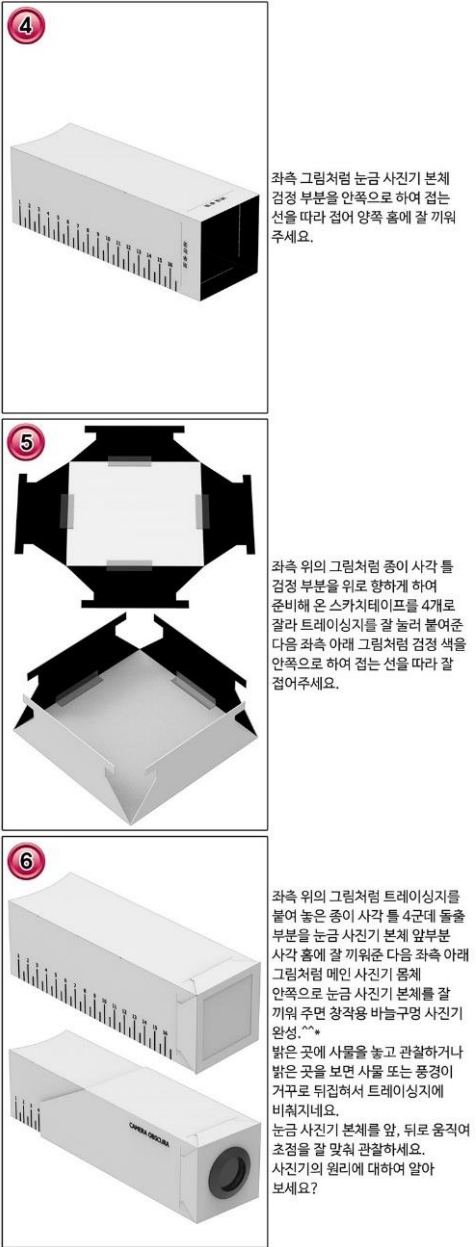
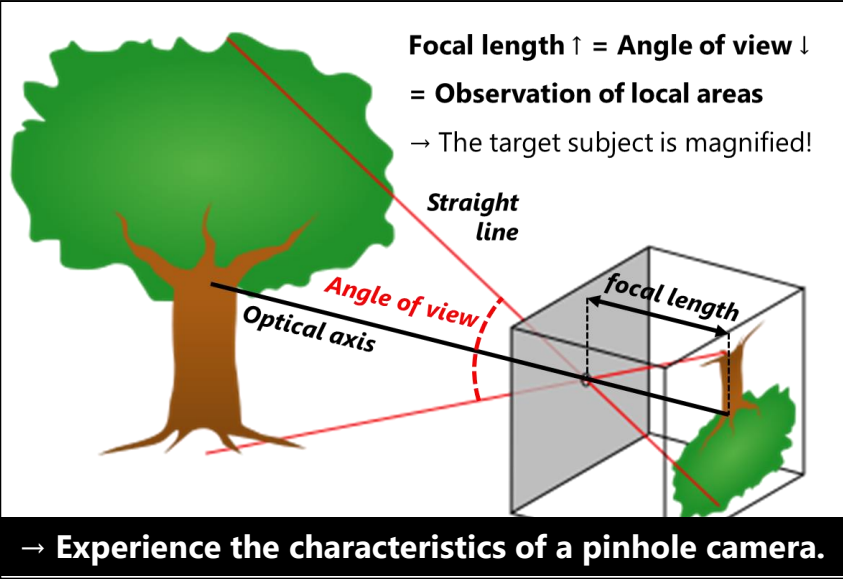
## Characteristics of a pinhole camera

- Camera obscura
- Focal length
- Aperture & depth of field
- Shutter speed & exposure time

## What AI can enhance images and videos

- Self-supervised learning
  - Image super resolution
  - Video frame interpolation
  - Motion deblurring
- Segmentation and depth
- 3D photography

# Let's Make a Pinhole Camera





# Discussion

## <Pinhole Camera Quiz>

### True or False?

- Q1. Decreasing the focal length makes the object smaller. [True / False]
- Q2. Increasing the focal length makes the field-of-view smaller. [True / False]
- Q3. Increasing the size of aperture makes the photo darker. [True / False]
- Q4. Increasing the size of aperture makes the depth-of-field shallower. [True / False]
- Q5. Decreasing the shutter speed makes the photo sharper. [True / False]
- Q6. Increasing the exposure time makes the photo brighter. [True / False]