LECTURER: Nghia Duong-Trung

# **ARTIFICIAL INTELLIGENCE**

# **History of Al Modern AI Systems Reinforcement Learning Natural Language Processing - Part 1 Natural Language Processing - Part 2 Computer Vision**

### INTRODUCTION TO ARTIFICIAL INTELLIGENCE\_DLBDSEAIS01

- Course book: Artificial Intelligence\_DLBDSEAIS01, provided by IU, myStudies
- Reading list provided by IU, myStudies
- The amount of slides content is based on the course book.
- Additional teaching materials:

https://github.com/duongtrung/IU-ArtificialIntelligenceCourse

### **DISCLAIMER**

- This is the modified version of the IU slides.
- I used it for my lectures at IU only.



### **UNIT 6**

# **COMPUTER VISION**

### **STUDY GOALS**



On completion of this unit, you will be able to ...

... define computer vision.

... explain how to represent images as pixels.

... distinguish between detection, description, and matching of features.

... correct distortion with calibration methods.



1. What are the typical computer vision tasks?

2. How are filters used in computer vision?

3. How does camera calibration work?

### **HISTORICAL DEVELOPMENTS**

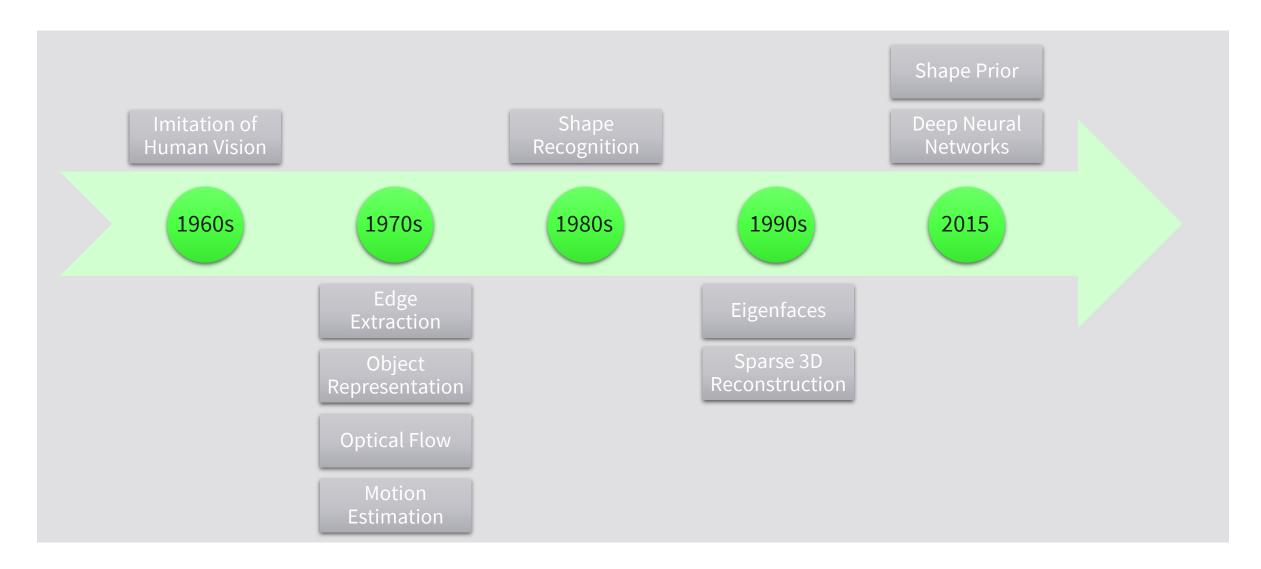
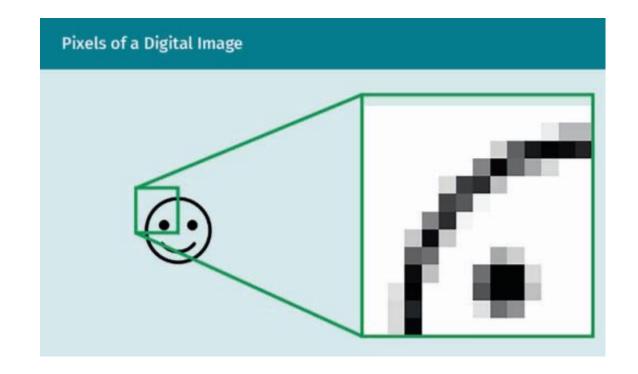
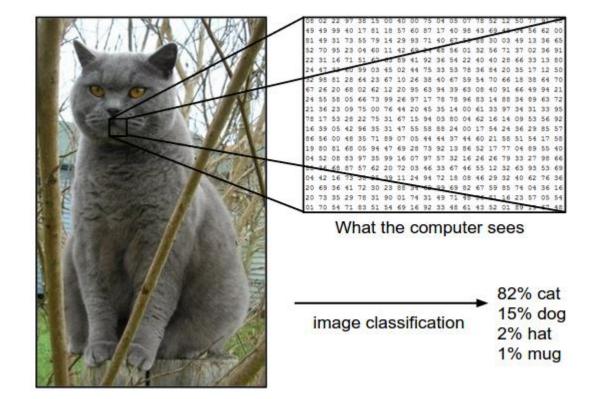


Image Source: Custom Depiction

### **HUMAN VS MACHINE**

Term: pixel
 color representations
 monochrome
 real, high, true, deep color



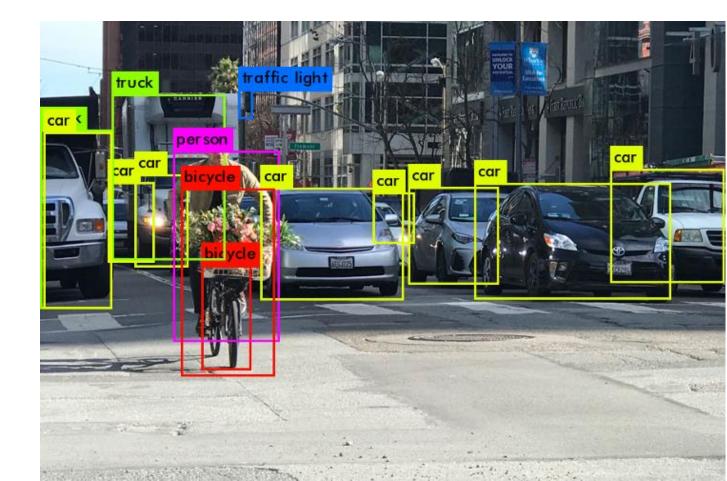


### **TYPICAL COMPUTER VISION TASKS**

#### Computer vision tasks Motion Geometry Image Recognition analysis restoration reconstruction Detect and Detect and Filter and Estimation of classify track motion a 3D model of remove noise of objects, from images different a real-world objects or persons or and videos object or persons in the camera scene images

### 10 INTERESTING COMPUTER VISION TASKS: OBJECT DETECTION

- identify and locate an object of particular interest from still image or video data.

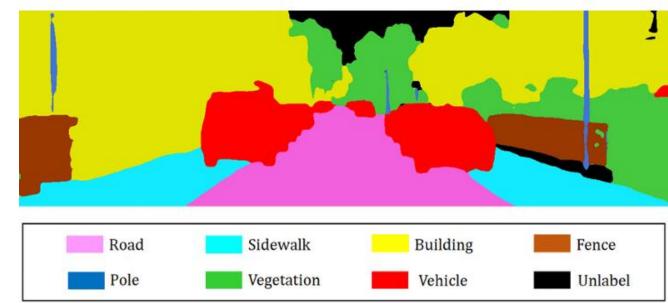


#### 10 INTERESTING COMPUTER VISION TASKS: IMAGE SEGMENTATION

- The process of partitioning an image into multiple segments. the aim is to transform the image in a representation that is easier to analyze, there are many flavors of image

segmentation





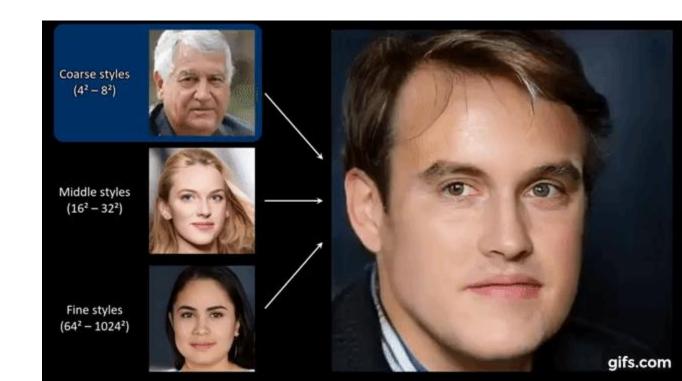
### 10 INTERESTING COMPUTER VISION TASKS: POSE ESTIMATION

Estimating the position and the orientation of the joints of a human body. this has a wide range of applications in AR/VR (augmented and virtual reality)

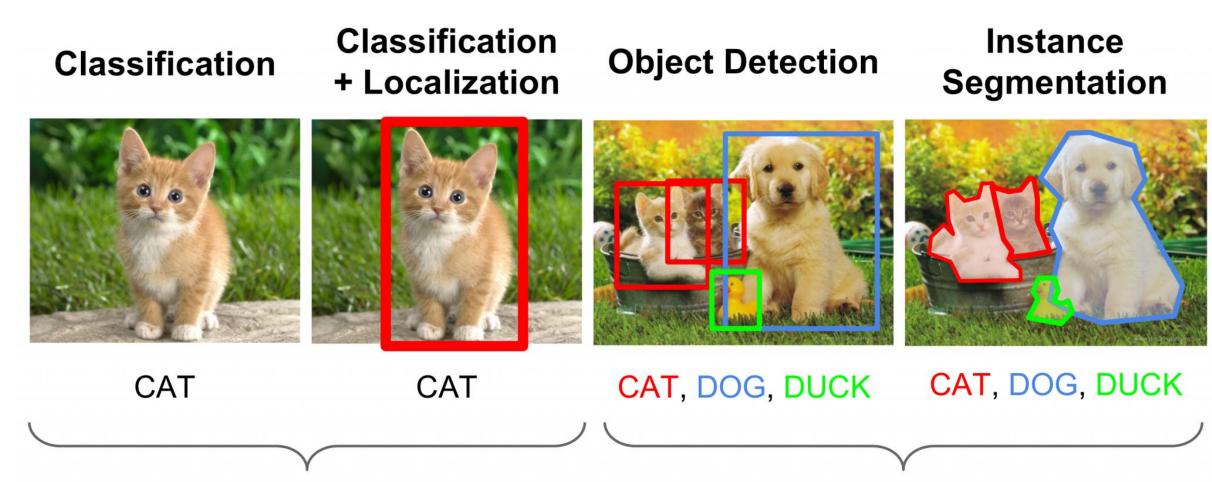


#### 10 INTERESTING COMPUTER VISION TASKS: IMAGE GENERATION

Generating new images from an existing data set, this task has been made popular by the use Generative adversarial networks (GANs) to generate seemingly real images or videos which were actually fake.



Identifying classes of objects within the image

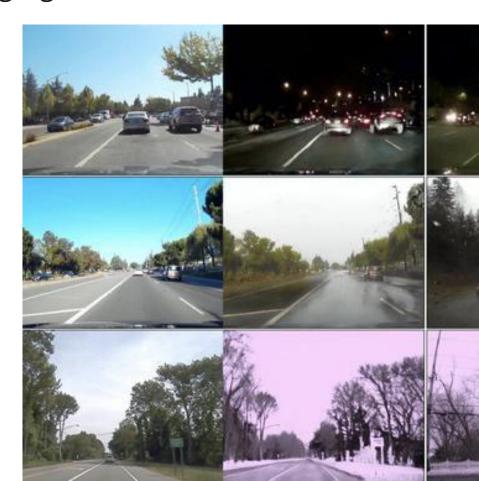


Single object

Multiple objects

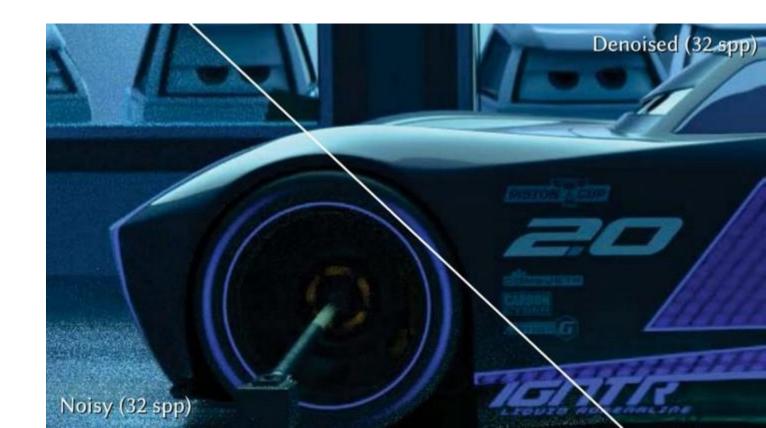
#### 10 INTERESTING COMPUTER VISION TASKS: DOMAIN ADAPTATION

maintaining a predictive model performance even if the data distribution the model was trained on has changed. domain adaptation uses labeled data in one or more data distribution and tries to solve a new task with data belonging to a different distribution



### 10 INTERESTING COMPUTER VISION TASKS: DE-NOISING

predicting the original image by removing noise from a noise-contaminated image



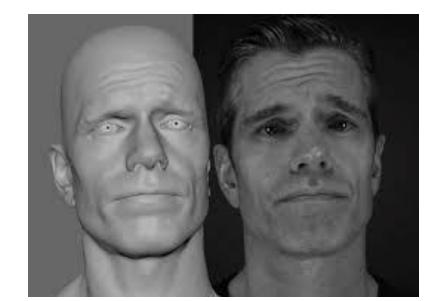
#### 10 INTERESTING COMPUTER VISION TASKS: SUPER-RESOLUTION

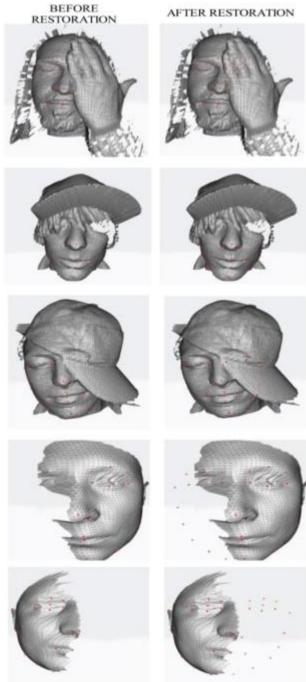
taking an input from a low resolution image and up-scaling it to a higher resolution



### 10 INTERESTING COMPUTER VISION TASKS: 3D FACE ANIMATION

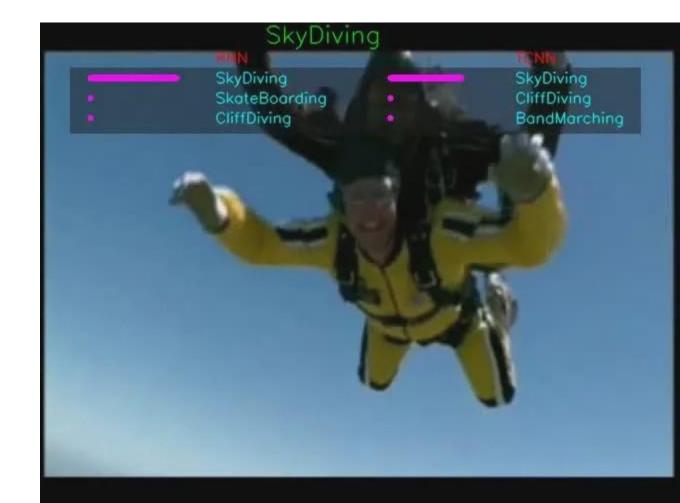
### reconstructing an animated 3D human face from a still image





#### 10 INTERESTING COMPUTER VISION TASKS: ACTION CLASSIFICATION IN VIDEO

predicting the movement of an object from observations made in a video stream



### **IMAGES AS FUNCTIONS**

A function that can map a two-dimensional coordinate (x,y) to a specific color value.

On the x-axis we begin on the left with a value of 0 and continue to the right until the maximum width of an image is reached.

On the y-axis, we begin with 0 at the top and reach the height of an image at the bottom.

f(42,100)

### Filter:

Function which receives an image as an input, applies modifications, and returns the filtered image as an output.

# Example: 2D image convolution

Convolution of an image I with a kernel k with a size of n and a center coordinate  $\alpha$ :

$$I \cdot (x, y) = \sum_{i=1}^{n} \sum_{i=j}^{n} I(x - 1 + a, y - j + a) k(i, j)$$

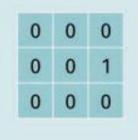
I · (x, y): value of the resulting image I · at position (x, y), I is the original image.

### **FILTERS**

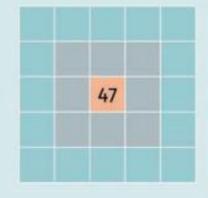
### **2D Image Convolution**

Step 1

63	80	90	62
41	26	86	41
27	42	47	93
44	88	41	24
71	58	80	4
	41 27 44	41 26 27 42 44 88	63 80 90 41 26 86 27 42 47 44 88 41 71 58 80

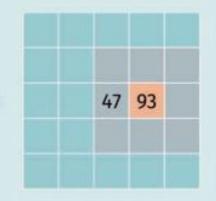


Х



Step 2

82	63	80	90	62
73	41	26	86	41
89	27	42	47	93
55	44	88	41	24
86	71	58	80	4



Final result

63	80	90	62	0
41	26	86	41	0
27	42	47	93	0
44	88	41	24	0
71	58	80	4	0

### **PADDING TECHNIQUES**

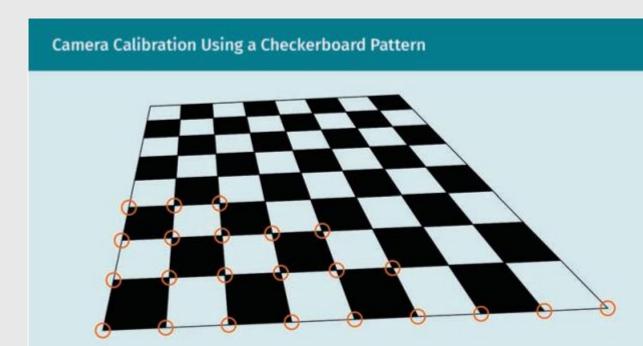
### **Different Padding Techniques**



### **CAMERA CALIBRATION**

The calibration makes it possible to extract distortion from the images





### **Feature Detection**

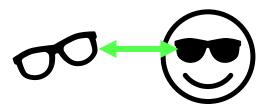


- Blobs (blue)
- Edges (red)
- Corners (yellow)

# Feature Description

Semantic information

- Common algorithms:
  - BRIEF
  - ORB
  - SIFT
  - SURF



Feature Matching

 Identification of similar features in different images

https://medium.com/data-breach/introduction-to-surf-speeded-up-robust-features-c7396d6e7c4e https://docs.opencv.org/3.4/df/dd2/tutorial\_py\_surf\_intro.html

### **IMPORTANT CHARACTERISTICS OF FEATURE DETECTION ALGORITHMS**



### **SEMANTIC SEGMENTATION**

Original image Segmentation map Segmentation overlay Background **Chair** Coffee table



On completion of this unit, you will be able to ...

... define computer vision.

... explain how to represent images as pixels.

... distinguish between detection, description, and matching of features.

... correct distortion with calibration methods.

SESSION 6

# TRANSFER TASK

1.

a) Given the following image matrix *I* and the kernel matrix *k*, compute the values of the resulting image after the convolution. What does the kernel matrix do?

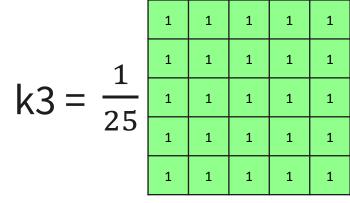
=	82	63	80	90	62
	73	41	26	86	41
	89	27	42	47	93
	55	44	88	41	24
	86	71	58	80	4

$$k = \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$$

1.

- b) What type of filter would the kernel matrix k2 apply to an image?
- c) How would the filtered image change if you applied kernel matrix k3 instead?

$$k2 = \frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$



### **TRANSFER TASK**

2. For camera calibration, it is important to identify the external and internal parameters.

Which extrinsic and intrinsic parameters do you know?

3. Think about possible use cases for semantic image segmentation. Where could it be used?

TRANSFER TASK
PRESENTATION OF THE RESULTS

Please present your results.

The results will be discussed in plenary.



# 1. a) Image convolution

82	63	80	90	62			_			63	80	90	62	0
73	41	26	86	41		0	1	0		41	26	86	41	0
89	27	42	47	93	Χ	0	0	0	=	27	42	47	93	0
55	44	88	41	24		0	0	0		44	88	41	24	0
86	71	58	80	4					•	71	58	80	4	0

The kernel matrix shifts the image matrix to the left.

- 1.
- b) Matrix k2 will apply a smoothing to an image.
- c) When using the kernel matrix k3, the image will be smoothed even more.

https://www.codingame.com/playgrounds/2524/basic-image-manipulation/filtering

https://www.ni.com/de-de/innovations/white-papers/06/image-filtering-overview.html

https://ai.stanford.edu/~syyeung/cvweb/tutorial1.html

https://en.wikipedia.org/wiki/Kernel\_(image\_processing)

#### TRANSFER TASKS - SAMPLE SOLUTION

### 2. Camera calibration

## External parameters:

- Orientation of real world coordinates
- Position of the camera

## Internal parameters:

- Optical center
- Focal length
- Lens distortion parameters

https://docs.opencv.org/4.x/dc/dbb/tutorial\_py\_calibration.html

https://www.youtube.com/watch?v=3h7wgR5fYik

#### TRANSFER TASKS - SAMPLE SOLUTION

- 3. Possible use cases for semantic image segmentation:
- Autonomous driving: detection of other vehicles, road lanes, pedestrians, or sidewalks
- GeoSensing: analyze information about land usage, such as agricultural areas, forests, or areas of water from satellite images
- Pose estimation/motion capture: identifying and tracking of body parts, such as legs, arms, head, or eyes
- Medicine: detection of affected brain areas by tumors



1. What are the typical tasks in computer vision?

2. What is the purpose of camera calibration?

3. What are the most commonly used types of features in computer vision?

4. What is the purpose of semantic segmentation?



### Solutions

- 1. Recognition, motion analysis, image restoration, geometry reconstruction
- 2. To estimate extrinsic and intrinsic parameters of a camera
- 3. Blobs, corners, and edges
- 4. Cluster parts of the image that belong to the same object class

# How did you like the course?

**HOW DID YOU** LIKE THE COURSE?







