
Pattern Recognition

Yukyung Choi

yk.choi@rcv.sejong.ac.kr

1.Recognition

- Person has good perception ability. (Robustness)
- How about a computer? Is it has better perception ability than a person?

1.1 Why human focus on pattern recognition

- Why researchers want to increase machine awareness?
 - "Human >> Machine"
 - Recognition is easy to human.
 - Recognition is hard to machine.
- Scientific Approach
 - Desire for a machine that mimics the human brain
 - Example) Neural Network Research

1.1 Why human focus on pattern recognition

- Engineering Approach
 - Make life easier and more comfortably
 - For example)

Robot Vacuum Cleaner



Finger Print Recognition



Car Plate Recognition



Recycle Machine



1.1 Why human focus on pattern “recognition”

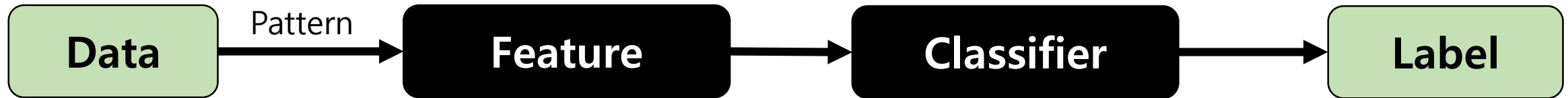
- Anything Else?



<https://www.youtube.com/watch?v=RB UdE-wJxtc>

1.2 How to recognize something?

- Concept of Pattern Recognition



- Example

- Feature

- Face length(x1), Shape of nose(x2), size of eye(x3)

- Classification

- If (x1=short, x2=sharp, x3 = small), this person is
 - Classification is this kind of decision making



1.2 How to recognize something?

- Collect database (DB)
 - Definition
 - Sample
 - Train Set, Test Set
 - Requirement
 - We should collect **high-quality data** for making a high-quality recognition system.
 - We should collect **large-scale data** to cover general cases.

- Example



[MNIST Dataset]

training set of 60,000 examples, and a test set of 10,000 examples.

1.2 How to recognize something?

- Feature

- If we consider overall pixel in each image (8x8),
 - 64 features
 - 64 dimensions' feature vector $X=(X_1,\dots,X_{64})$
 - **Does this feature has discriminative power?**

- Definition: Feature

- the ratio of black pixel

$$\begin{array}{r} x_2=14/10 \\ \hline 14 \quad 10 \\ \hline 00001100 \\ 00010000 \\ 00100000 \\ 01100000 \\ 11000110 \\ 11000011 \\ 11000001 \\ 11111110 \\ \hline \end{array} \left. \begin{array}{l} 6 \\ 18 \end{array} \right\} x_1=6/18$$

$$\mathbf{x}=(6/18,14/10)^T$$

- Important problem

- Discriminative power
- Curse of dimensionality

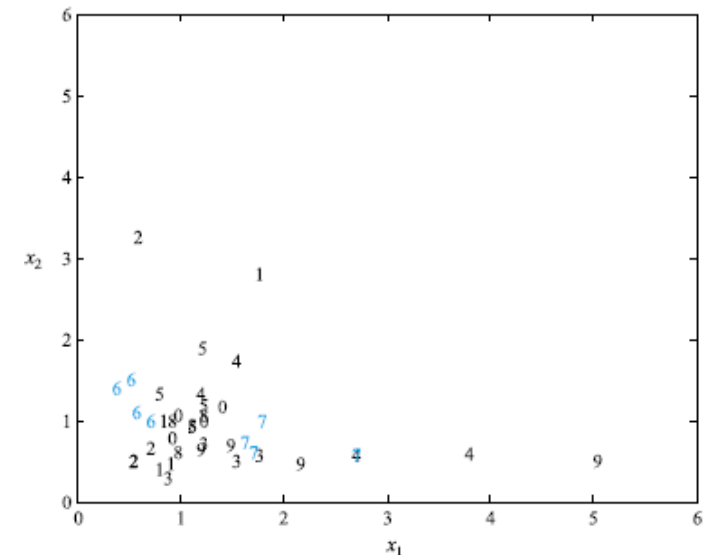
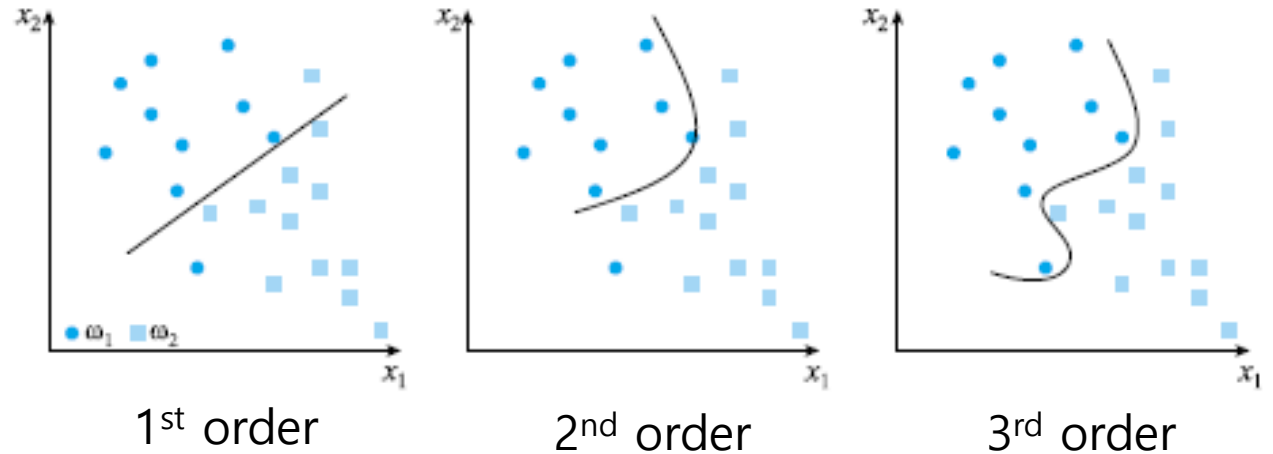


Fig. Distribution of input data

1.2 How to recognize something?

- Classification

- Two stage approach
 - First stage: model selection
 - Second stage: learning



- Linear classification and nonlinear classification

- Linear classification: decision **line**, decision **plane**, decision **hyperplane**
- Nonlinear classification: decision **curve**, decision **surface**, decision **hypersurface**

1.2 How to recognize something?

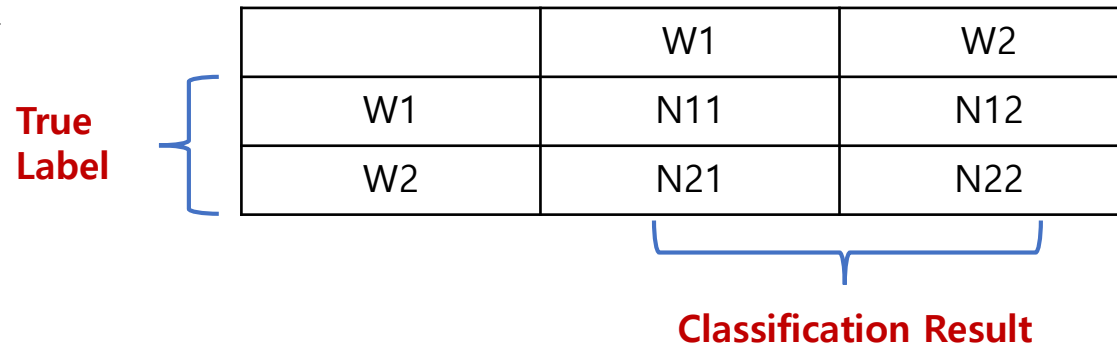
- Evaluation

- In terms of miss-rate

- Correct Recognition Rate = C/N
 - Rejection Rate = R/N
 - Error Rate = E/N

where, c = the number of correct answer, r = the number of reject answer,
 e = the number of wrong answer, $N = C+R+E$

- Confusion Matrix



The diagram shows a confusion matrix table. To the left of the table, the text 'True Label' is written in red, with a blue bracket grouping the two rows of the table. Below the table, the text 'Classification Result' is written in red, with a blue bracket grouping the two columns of the table.

	W1	W2
W1	N11	N12
W2	N21	N22

- In terms of risk

- Misclassifying a cancer patient as normal is more dangerous than misclassifying a normal person as a cancer patient.

1.2 How to recognize something?

- Evaluation

- Detection Metric

$$\text{FPR(False Positive Rate)} = n_{21}/(n_{21}+n_{22})$$

$$\text{FNR(False Negative Rate)} = n_{12}/(n_{12}+n_{11})$$

- Indexing Metric

$$\text{Precision} = n_{11}/(n_{11}+n_{21})$$

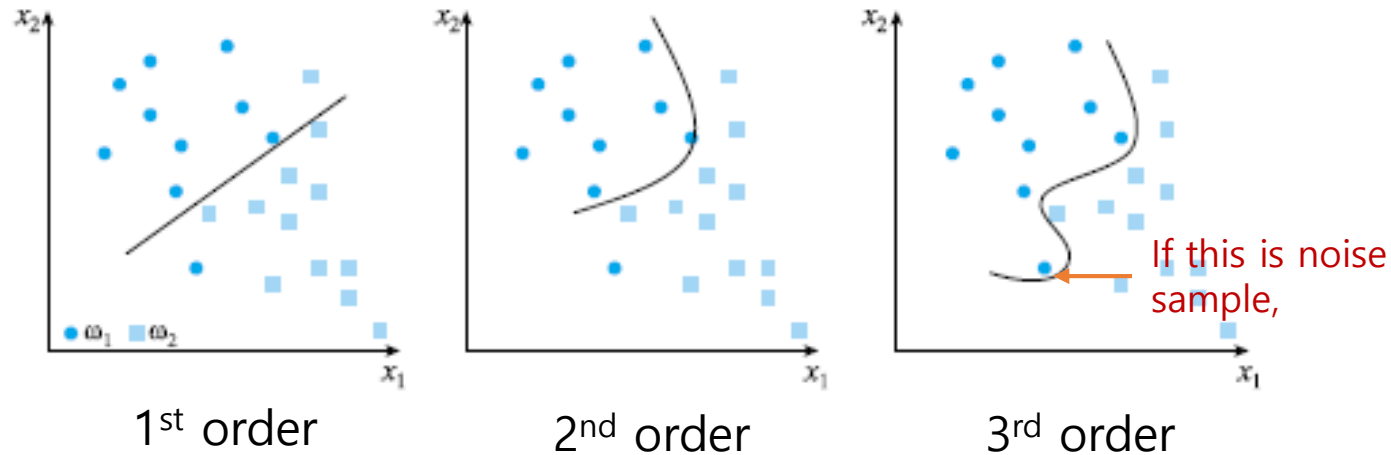
$$\text{Recall} = n_{11}/(n_{11}+n_{22})$$

1.2 How to recognize something?

- Evaluation

- Generalization

- Measuring the performance using test set
 - Test set: new sample (this sample never used in training)
 - Avoiding overfitting
 - **[Question] 3rd order decision curve is optimal?**

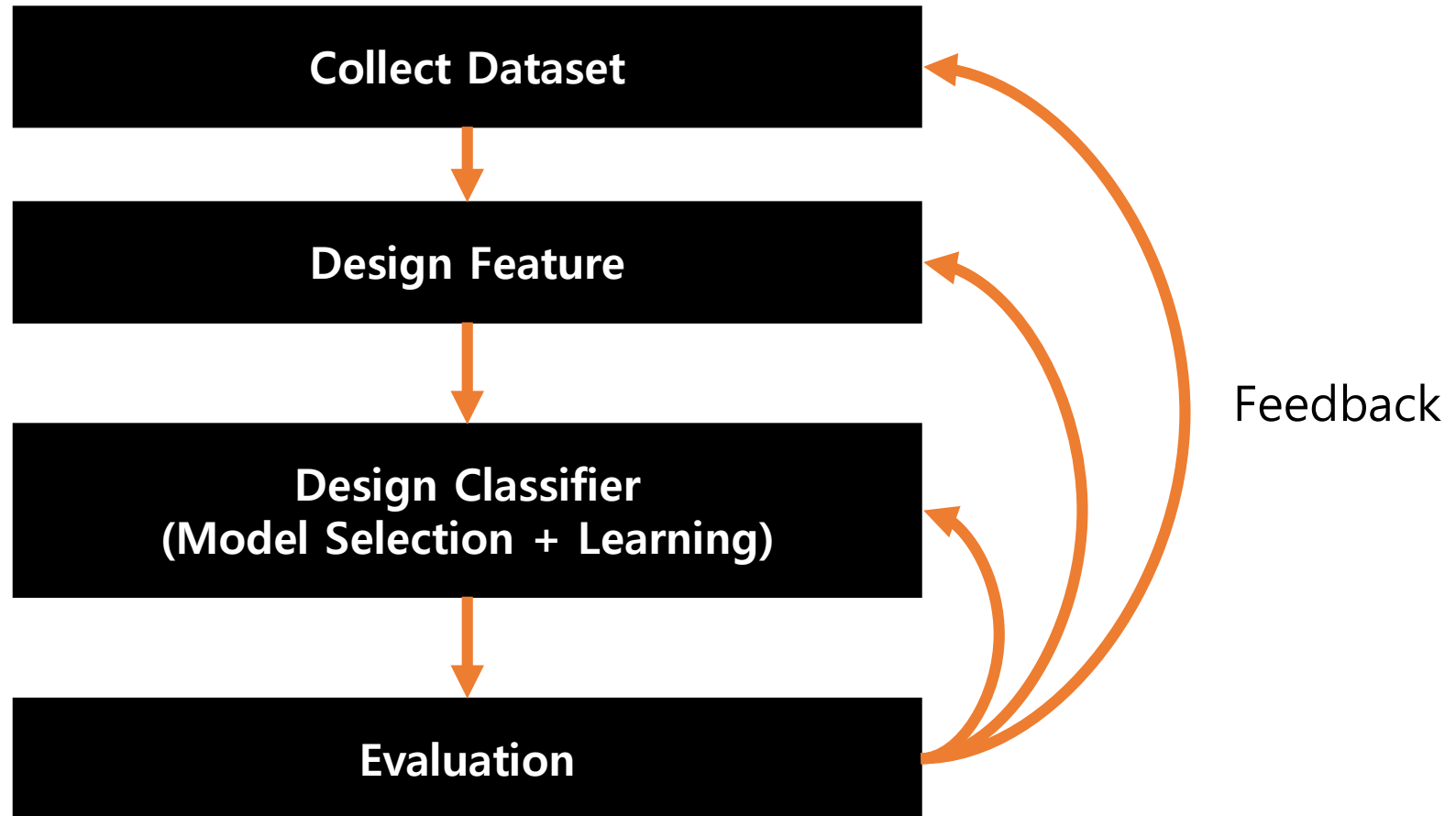


1.2 How to recognize something?

- For Model selection
 - There is enough dataset
 - We can split the dataset as follow: Train set/Test set/ **Validation set**
 - From the validation accuracy, we predict the general performance.
 - There is no enough dataset,
 - We can use "Resampling" (CH.12)
 - K-Cross validation
 - Bootstrap

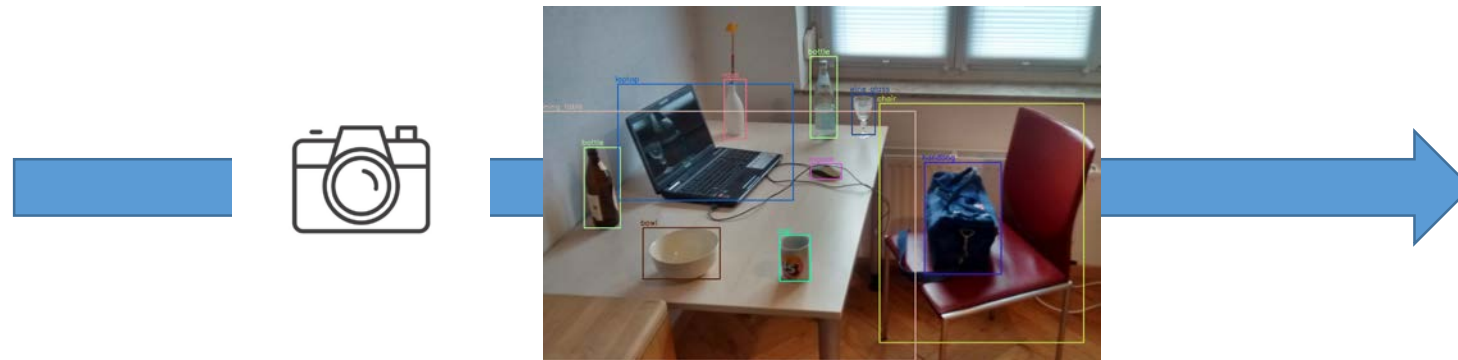
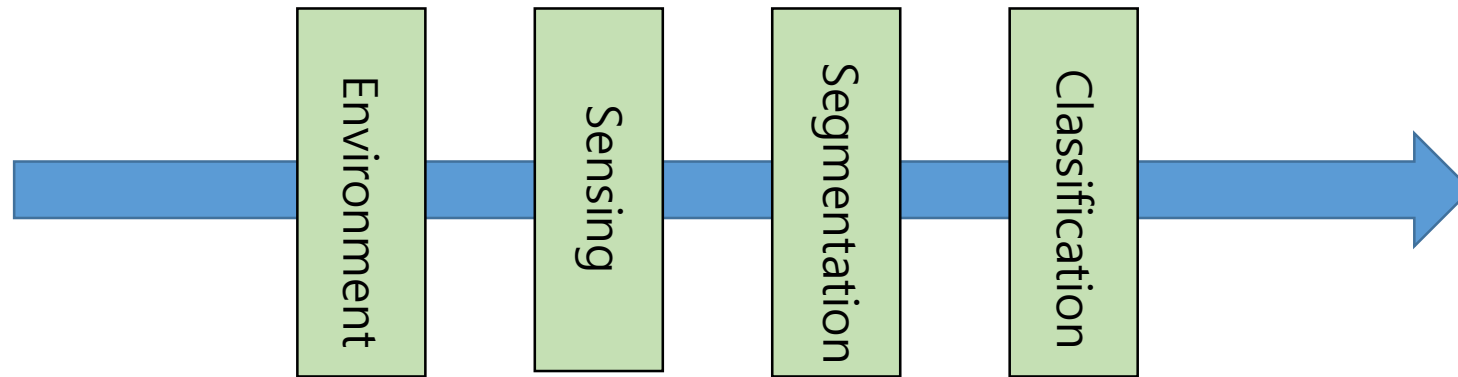
1.3 System Architecture for Pattern Recognition

- Development Cycles



1.3 System Architecture for Pattern Recognition

- Process of Pattern Recognition System
 - Need to Detection/Segmentation module
 - Can be choose multiple classifier



1.4 Mathematics

- Pattern Recognition meets mathematics
 - Probability & statistics
 - Linear algebra
 - Information theory
 - Optimization
- Traditional solution in Pattern Recognition

Formulate Equation



Find a Optimal Solution

1.5 Resource

- About Computer Vision
 - Conference: CVPR, ICCV, ECCV, BMVC
 - Journal: TPAMI, IJCV
- **Arxiv.org**
 - <https://arxiv.org/list/cs.CV/recent>