

IF5181 Pengenalan Pola

# Pendahuluan

Masayu Leylia Khodra

# Outline

- Pengantar kuliah IF5181
- Pengenalan Pola:
  - Definisi pola, kategori pola, pengenalan pola
  - Aplikasi pengenalan pola
  - Pendekatan pengenalan pola

# Pengantar Kuliah IF5181 (3 sks)

- Pengajar:
  - Mgg1 sd UTS - Masayu Leylia K (masayu@informatika.org)
  - Mgg9 sd UAS - Nugraha Utama (utama@informatika.org)
- Tatap muka: Selasa 10.00-12.00; Rabu 10.00-11.00
- Mailing-list: [if5181@students.if.itb.ac.id](mailto:if5181@students.if.itb.ac.id)
- Situs Kuliah: TBD
- Materi: <https://bit.ly/2ZhiC10>  
<https://www.dropbox.com/sh/fa0ahdosyjtify/AADH3hwWrG6ILc5uc-jmZBL8a?dl=0>

# Luaran Kuliah

1. Mahasiswa mampu mendeskripsikan dan membangun modul untuk membangun suatu sistem pengenalan pola.
2. Mahasiswa mampu mendefinisikan metode/ teknik pengenalan pola yang sesuai untuk kasus tertentu.
3. Mahasiswa mampu membangun secara utuh suatu sistem pengenalan pola untuk suatu kasus.
4. Mahasiswa mampu mengevaluasi kinerja suatu sistem pengenalan pola.

# Materi Kuliah Mgg1-7

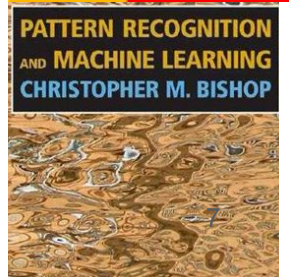
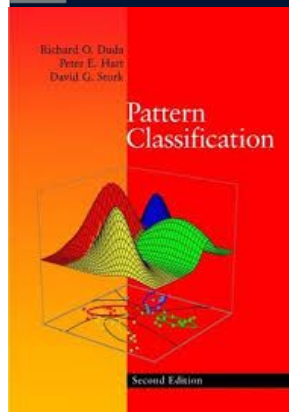
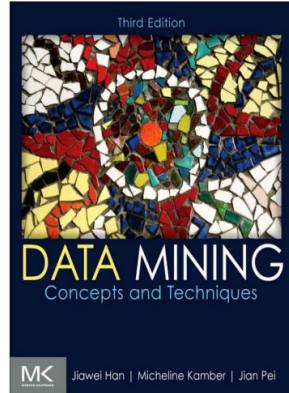
1. Pendahuluan
2. Classification
3. Clustering
4. Outlier Detection
5. Mining Frequent Patterns, Associations, and Correlations
6. Mining Stream, Time-Series, and Sequence Data
7. Pengenalan Pola pada Teks

# Penilaian

- Komponen: UTS, UAS, Kuis, PR & latihan, Tugas
- Syarat lulus IF5181: nilai setiap komponen  $> 0$
- Segala bentuk kecurangan akan mengakibatkan nilai E
- Susulan UTS UAS hanya untuk mahasiswa yang dirawat di rumah sakit atau terkena musibah. Susulan hanya untuk UTS atau UAS (tidak keduanya)

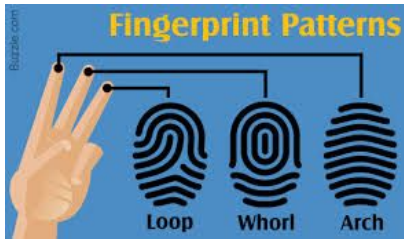
# Referensi

- Han, J., Pei, J., & Kamber, M. (2011). Data mining: concepts and techniques. Elsevier.
- R. Duda, P. Hart, and D. Stork, Pattern Classification, 2nd ed. John Wiley & Sons, 2001
- C. Bishop, Pattern Recognition and Machine Learning. Springer, 2006
- Digital library / <http://scholar.google.com/>



# Pola / Pattern

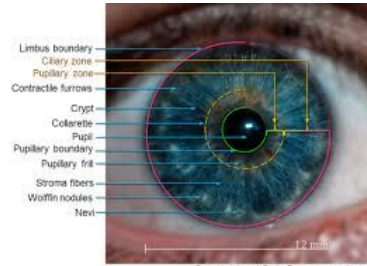
## Pola biometrik



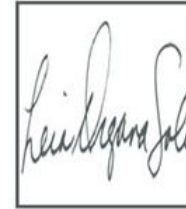
<https://sciencestruck.com/identifying-types-of-fingerprints-patterns>



Palmprint



[https://indranilsinharoy.com/2014/12/05/dissertation\\_series/](https://indranilsinharoy.com/2014/12/05/dissertation_series/)  
<https://www.bayometric.com/biometric-system-architecture/>



Signature

## Pola pada teks

```
import re
email = re.compile('\w+@\w+\. [a-z]{3}')
text = "To email Guido, try guido@python.org or the older address guido@google.com."
email.findall(text)
```

```
['guido@python.org', 'guido@google.com']
```

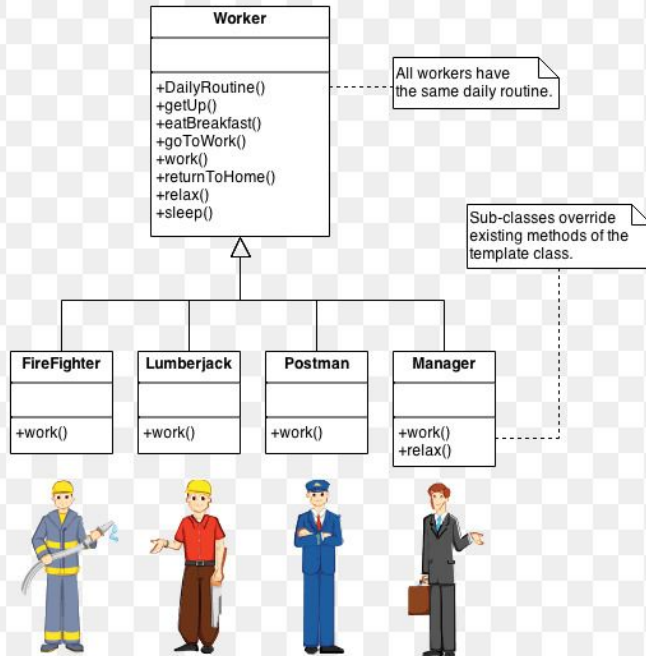


# Pola: Definisi





- Gabungan fitur yang merupakan karakteristik dari suatu individu
- Pasangan kumpulan observasi (features) and konsepnya (labelnya).
  - Feature: any distinctive aspect, quality or characteristic which, may be symbolic (i.e., color) or numeric (i.e., height).
  - feature vector: combination of  $d$  features, that is represented as a  $d$ -dimensional column vector.
  - feature space:  $d$ -dimensional space defined by the feature vector

# Kategori / Kelas Pola

- Kumpulan objek yang “mirip” (tidak harus identik)

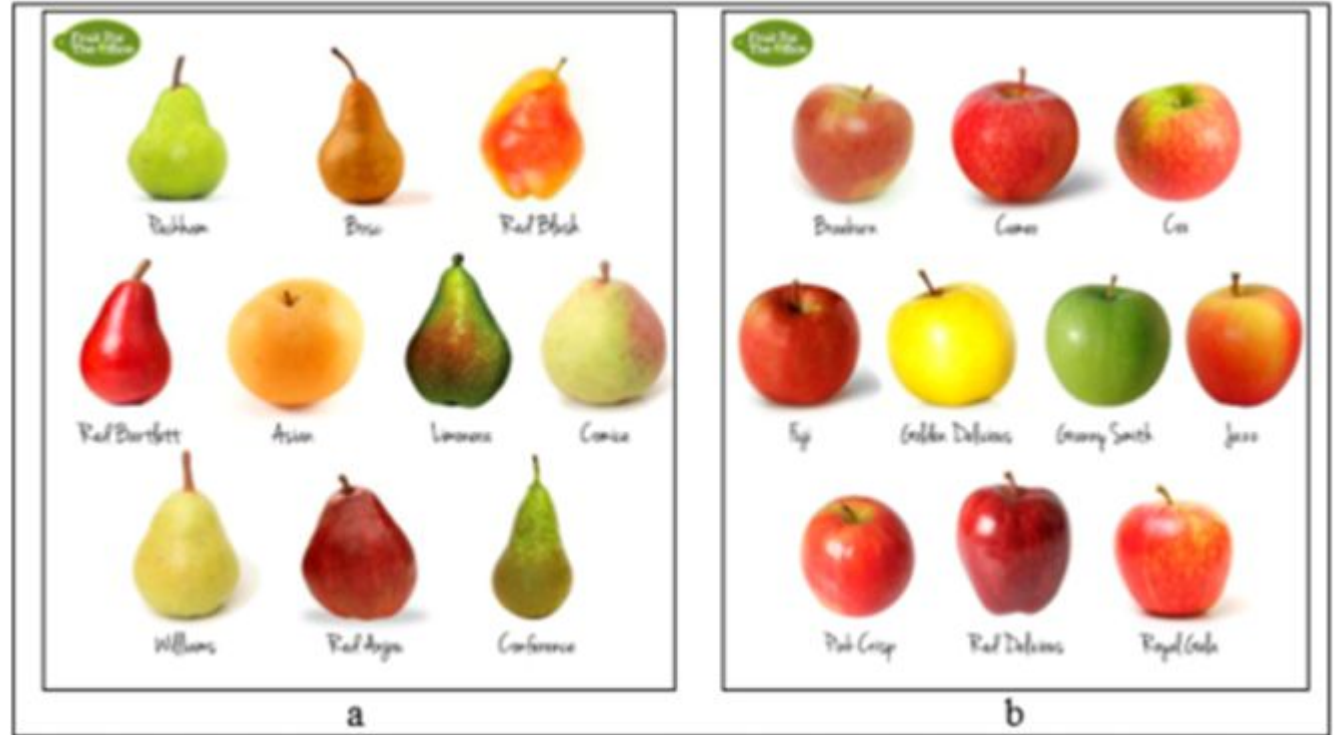


# Manusia: Konsep Semantik Tingkat Tinggi

Citra	Label	Deskripsi label
	Apel	<i>a round fruit with firm, white flesh and a green, red, or yellow skin</i>
	Lemon	<i>a yellow, oval citrus fruit with thick skin and fragrant, acidic juice</i>
	Pisang	<i>a long curved fruit that grows in clusters and has soft pulpy flesh and yellow skin when rip</i>
	Belimbing	<i>a golden-yellow juicy fruit with a star-shaped cross section</i>

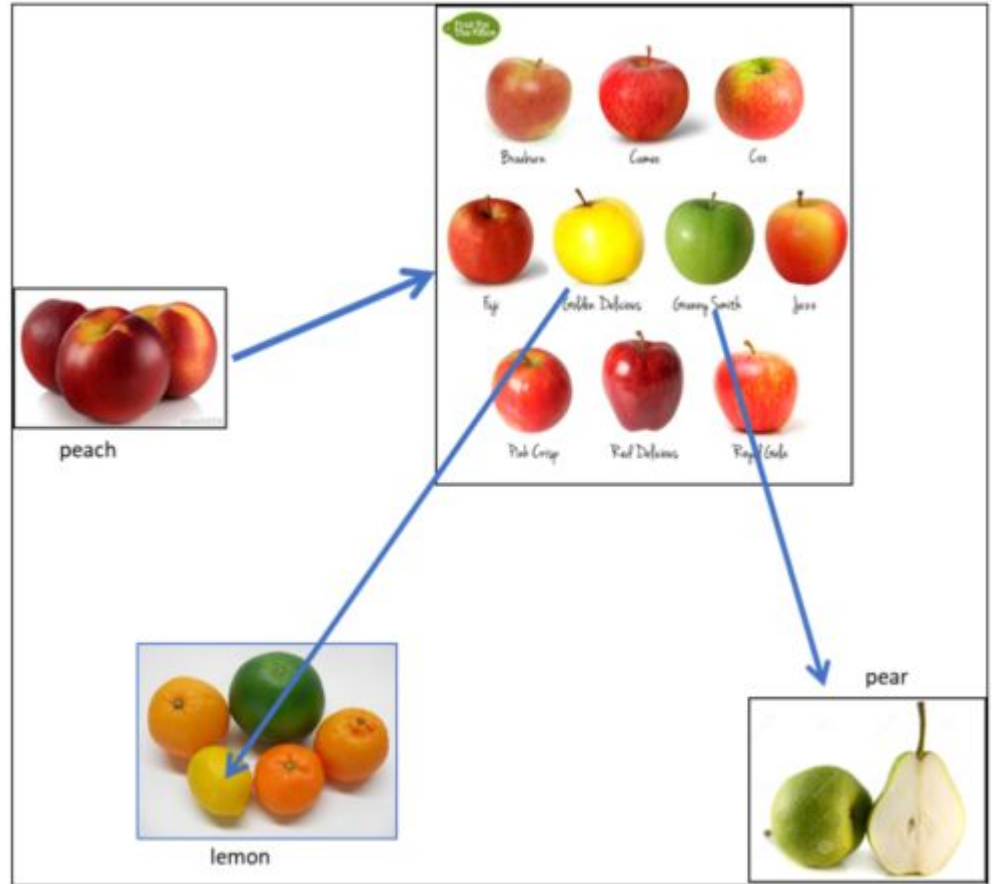
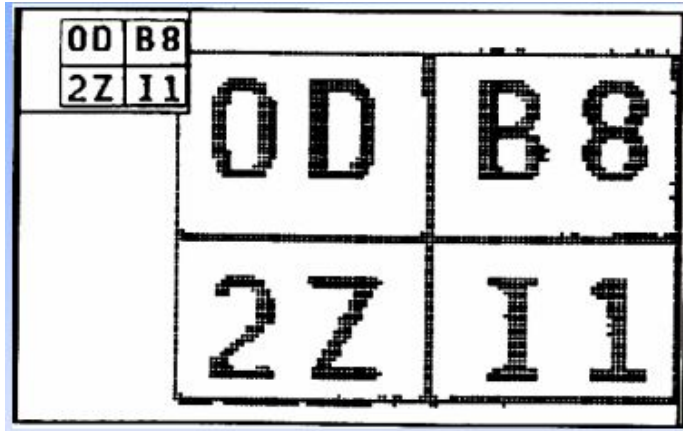
# Variasi Intra Class

Penampakan  
yang berbeda  
dari sejumlah  
objek berbeda  
dari kategori  
yang sama



# Variasi Inter Class

Penampakan yang mirip  
pada objek yang berbeda  
kategori



# Pengenalan Pola: Definisi

- Penemuan keteraturan dalam data secara otomatis (Bishop, 2006)
- Aksi mengambil data mentah dan melakukan aksi berdasarkan kategori polanya (Duda et al., 2001)
- Persoalan menemukan properti penting dari suatu kategori (Duda et al., 2001)

## Pengenalan Pola: Definisi (2)

- Bidang yang mempelajari bagaimana mesin mengobservasi lingkungannya, belajar untuk membedakan pola yang menarik, dan menentukan kategori pola tersebut (Jain, 1999).
- Generalisasi dari sejumlah contoh (CSE 802 MSU, 2008)

# Pengenalan Pola: Mengapa ?

- AI: komputer berperilaku seperti manusia (acting humanly)
  - “The real power of human thinking is based on recognizing patterns. The better computers get at pattern recognition, the more human-like they will become”. Ray Kurzweil, NY Times, Nov 24, 2003
-



# What is AI? 8 Definitions, 4 Approaches

Thinking  
humanly

## Thinking Humanly

“The exciting new effort to make computers think ... *machines with minds*, in the full and literal sense.” (Haugeland, 1985)

“[The automation of] activities that we associate with human thinking, activities such as decision-making, problem solving, learning ...” (Bellman, 1978)

## Acting Humanly

“The art of creating machines that perform functions that require intelligence when performed by people.” (Kurzweil, 1990)

“The study of how to make computers do things at which, at the moment, people are better.” (Rich and Knight, 1991)

## Thinking Rationally

“The study of mental faculties through the use of computational models.” (Charniak and McDermott, 1985)

“The study of the computations that make it possible to perceive, reason, and act.” (Winston, 1992)

## Acting Rationally

“Computational Intelligence is the study of the design of intelligent agents.” (Poole *et al.*, 1998)

“AI ... is concerned with intelligent behavior in artifacts.” (Nilsson, 1998)

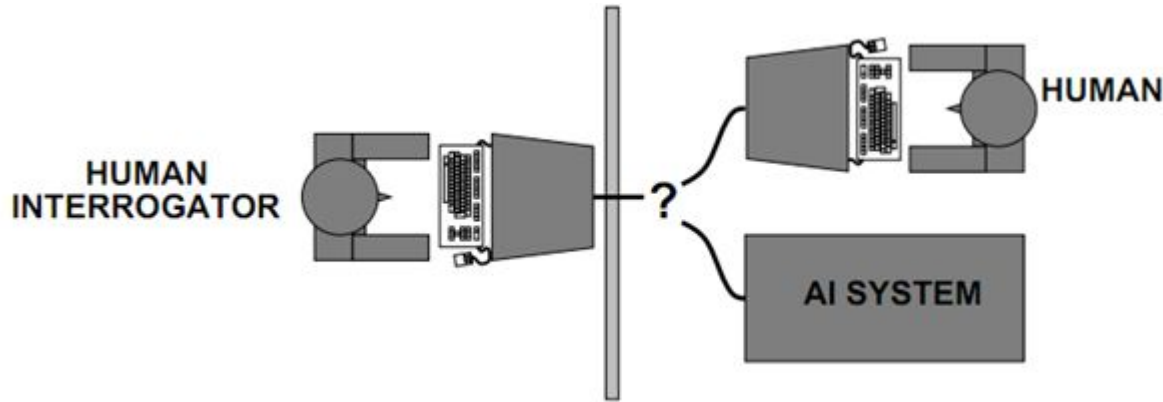
Thinking  
rationally

Acting  
humanly

Acting  
rationally

**Figure 1.1** Some definitions of artificial intelligence, organized into four categories.

# Acting humanly: Turing Test Approach



- A satisfactory operational definition of intelligence
- Pass: human interrogator cannot tell whether the responses come from a person or from a computer

# Human inside Computer



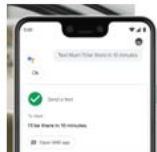
Putting a human inside a computer is not Artificial Intelligence

<http://www.computervisionblog.com/2015/03/deep-learning-vs-machine-learning-vs.html>

# Aplikasi Pengenalan Pola: Speech Recognition



A word cloud featuring various personal assistant brands. The word 'Assistant' is the largest and most prominent at the bottom left. Other significant words include 'Personal' (above it), 'Siri', 'Google', 'Mycroft', 'Intelligent', 'MD.com', 'Lucida', 'Maluuba', 'Automated', 'BlackBerry', 'Vlingo', 'Echo', 'Nina', 'Cortana', 'Braina', 'SILVIA', 'Amazon', 'now', 'Ubi', 'Hound', 'Aido', 'top', 'Jibo', 'Cubic', and 'Siri'. The words are in various colors (green, brown, black) and orientations (horizontal, vertical).



“Hey Google, text Mum I’ll be there in 10 minutes”

## Debat Capres #5

Ekonomi dan Kesejahteraan Sosial, Keuangan dan Investasi,  
serta Perdagangan dan Industri

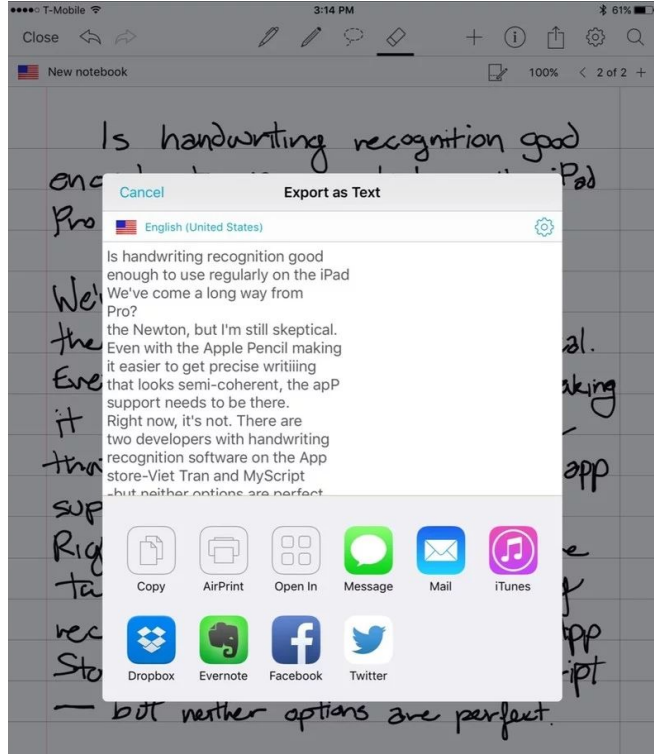
13 April 2019 | Status Pengolahan Data : Selesai

## Transkrip Lengkap

Search

No	Pembicara	Waktu (WIB)	Transkrip
1	Balques Manisang	20:04	baik kami meminta hadirin baik kami meminta hadirin berdiri karena kita akan bersama sama menyanyikan lagu kebangsaan Indonesia raya
2	pembicara	20:04	(Lagu Kebangsaan Indonesia Raya)
3	Balques Manisang	20:06	pak Maruf Amin untuk bersalaman juga dengan Prabowo Subianto dan bapak Salahudin iya silakan baik tidak sabar rasanya Pak silakan Pak monggo ditempati tempatnya satu-satu
4	Balques	20:07	baik sebelum memulai acara karena sudah siap semua tapi ada yang juga sangat penting untuk memulai acara yang besar ini kita akan membacakan doa menundukan sejenak kepala kita dan yang akan memimpin doa adalah Profesor Kiai Haji Nasaruddin Umar MA PhD Imam Besar Masjid Istiqlal

# Aplikasi Pengenalan Pola: Handwriting Recognition



my alarm clock did not  
my alarm code soil rout  
circle raid hot  
shute risk riot  
clock visit not  
did must

Wake me up this morning  
wake me up thai moving  
taxi having  
this tier running  
morning loving



My alarm clock did not wake me up this morning



# Aplikasi Pengenalan Pola: Text Recognition



Google's Word Lens

<https://mashable.com/2017/01/26/word-lens-japanese/>

<https://apps.apple.com/us/app/scan-translate-text-grabber/id845139175>

# Aplikasi Pengenalan Pola: Face Recognition



[https://www.nec.com/en/global/solutions/safety/face\\_recognition/NeoFaceWatch.html](https://www.nec.com/en/global/solutions/safety/face_recognition/NeoFaceWatch.html)

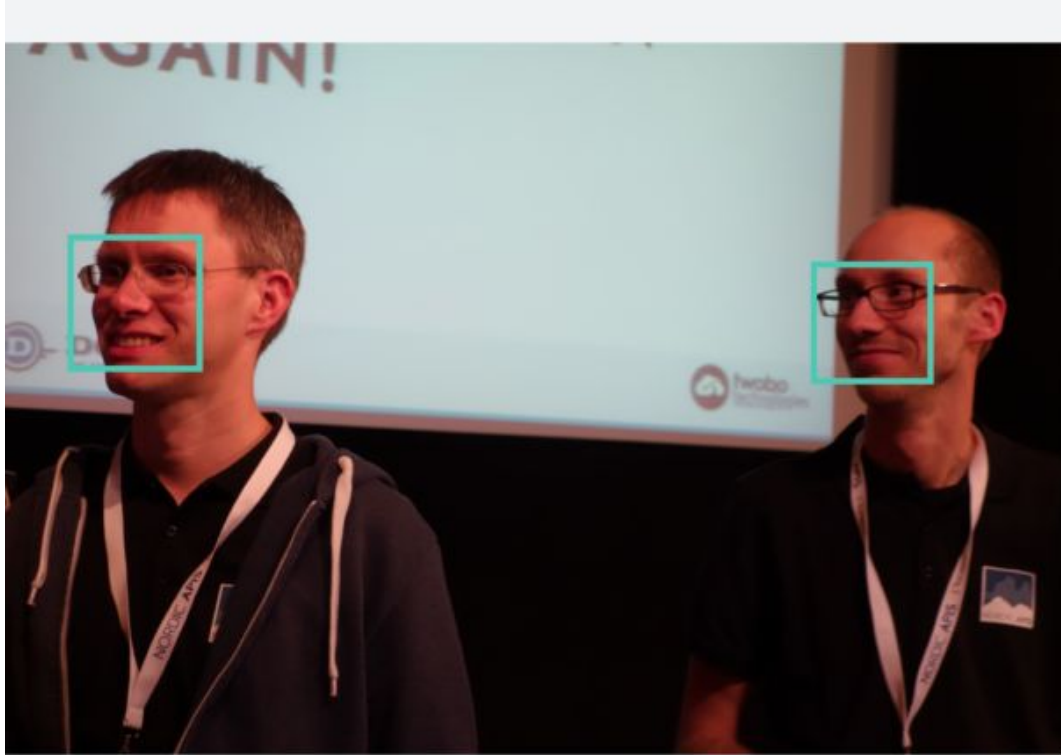


<https://www.grab.com/sg/driver-2/selfieverification/>



<http://www.vvip.co/news/facebook-accused-of-using-10-year-challenge-meme-to-improve-facial-recognition/>

# Aplikasi Pengenalan Pola: Pengenalan Emosi



Detection Result:

2 faces detected

JSON:

```
[
  {
    "faceRectangle": {
      "left": 120,
      "top": 362,
      "width": 255,
      "height": 255
    },
    "scores": {
      "anger": 6.506412e-7,
      "contempt": 0.00000107357334,
      "disgust": 0.0000137053685,
      "fear": 2.51182275e-9,
      "happiness": 0.9994379,
      "neutral": 0.000546224066,
      "sadness": 1.46409562e-7,
      "surprise": 2.88747827e-7
    }
  }
]
```



# Aplikasi Pengenalan Pola: Analisis Teks

In fact, the **Chinese** **NORP** market has the **three** **CARDINAL** most influential names of the retail and tech space – **Alibaba** **GPE**, **Baidu** **ORG**, and **Tencent** **PERSON** (collectively touted as **BAT** **ORG**), and is betting big in the global **AI** **GPE** in retail industry space. The **three** **CARDINAL** giants which are claimed to have a cut-throat competition with the **U.S.** **GPE** (in terms of resources and capital) are positioning themselves to become the 'future **AI** **PERSON** platforms'. The trio is also expanding in other **Asian** **NORP** countries and investing heavily in the **U.S.** **GPE** based **AI** **GPE** startups to leverage the power of **AI** **GPE**. Backed by such powerful initiatives and presence of these conglomerates, the market in APAC AI is forecast to be the fastest-growing **one** **CARDINAL**, with an anticipated **CAGR** **PERSON** of **45%** **PERCENT** over

To further elaborate on the geographical trends, **North America** **LOC** has procured in **2017** **DATE** and has been leading the regional landscape of **AI** **GPE** in the retail credit in the regional trends with **over 65%** **PERCENT** of investments (including M&A) artificial intelligence technology. Additionally, the region is a huge hub for startups in such as **Google** **ORG**, **IBM** **ORG**, and **Microsoft** **ORG**.

<https://www.depends-on-the-definition.com/text-analysis-with-named-entities/>

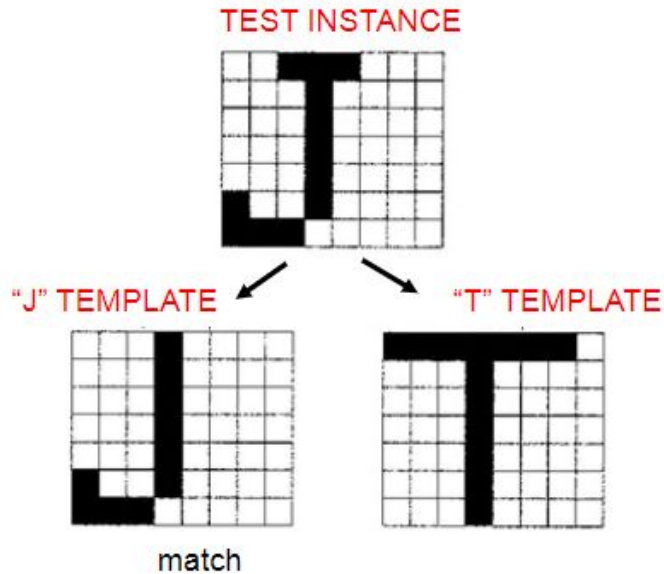
Polaritas	Aspek	Ekspresi
Keterangan warna: <b>Positif</b> <b>Negatif</b> <b>Netral</b>		
<b>Tempatnya bagus banget</b> <b>terlebih ada view kota bandungnya</b> .		
<b>Cuma sayang banget kemaren</b> <b>pesen makanan di restoran</b>		
<b>cave nya lama banget datengnya ampe setengah jam baru</b>		
<b>dateng</b> , <b>rasanya lumayan</b> , <b>penyajianya lumayan</b> , <b>harga rata</b>		
<b>rata di atas 30</b> . <b>Porsi makanannya besar</b> , <b>cukup untuk dua</b>		
<b>orang</b> . <b>Lokasi strategis dekat Lembang</b> .		

<http://nlp.yuliadi.pro/>

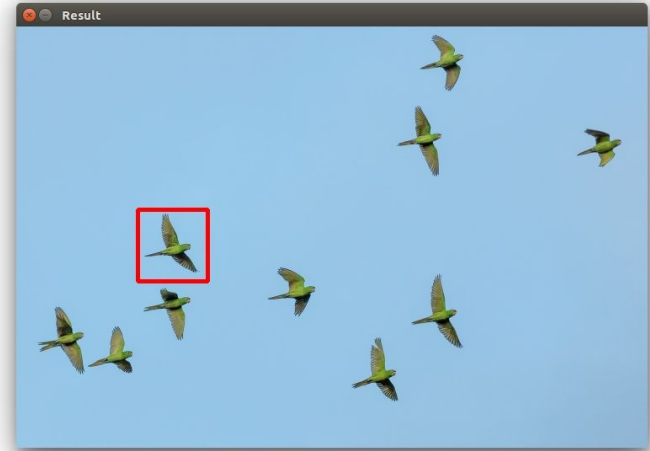
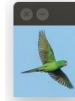
# Pengenalan Pola: Pendekatan (Jain, 1999)

- Template matching
  - Matching: operator untuk menentukan kemiripan antar entitas dengan tipe yang sama
- Statistical decision theoretic
  - Quantitative features, and decision boundaries (classifier)
- Structural/syntactic
  - Morphological features, and parsing relational graphs

# Pendekatan Template Matching



Template matching  
with OpenCV and  
Python.  
Template (left), result  
image (right)



<https://pythonspot.com/object-detection-with-templates/>

# Pendekatan Template Matching untuk Teks

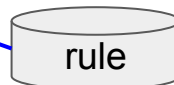
```
import re
email = re.compile('\w+@\w+\.[a-z]{3}')
text = "To email Guido, try guido@python.org or the older address guido@google.com."
email.findall(text)
```

```
['guido@python.org', 'guido@google.com']
```

<https://www.nzini.com/lessons/NLP2+-+Template+Matching.html>

Got input: How cold is it in the kitchen?  
cleanedInput: how cold is it in the kitchen  
We found a match!  
    Regex: how.\*cold.\*kitchen.\*  
    Logical Form: ['kitchen', 'temperature']  
The temperature in the kitchen is 81

```
EXPRESSIONS = [
    ("what.*temp.*kitchen.*", ["kitchen", "temperature"]),
    ("how.*hot.*kitchen.*", ["kitchen", "temperature"]),
    ("how.*cold.*kitchen.*", ["kitchen", "temperature"]),
    ("what.*temp.*bath.*", ["bathroom", "temperature"]),
    ("how.*hot.*bath.*", ["bathroom", "temperature"]),
    ("how.*cold.*bath.*", ["bathroom", "temperature"]),
    ("what.*temp.*living.*", ["livingroom", "temperature"]),
    ("how.*hot.*living.*", ["livingroom", "temperature"]),
    ("how.*cold.*living.*", ["livingroom", "temperature"]),
    ("what.*temp.*family.*", ["livingroom", "temperature"]),
    ("how.*hot.*family.*", ["livingroom", "temperature"]),
    ("how.*cold.*family.*", ["livingroom", "temperature"]),
    ("what.*temp.*bed.*", ["bedroom", "temperature"]),
    ("how.*hot.*bed.*", ["bedroom", "temperature"]),
    ("how.*cold.*bed.*", ["bedroom", "temperature"]),
    ("what.*temp.*dining.*", ["diningroom", "temperature"]),
    ("how.*hot.*dining.*", ["diningroom", "temperature"]),
    ("how.*cold.*dining.*", ["diningroom", "temperature"])
]
```

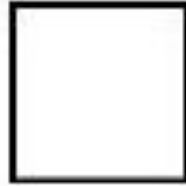


# Pendekatan Statistical Decision Theoretic

- Pola direpresentasikan sebagai  $d$ -features, dan dapat dilihat sebagai titik pada ruang  $d$ -dimensi
- Tujuan: memilih pola sehingga vektor pola milik kategori yang berbeda berada pada wilayah yang disjoint dalam ruang  $d$ -dimensi
- Efektifitas representasi (set fitur) diukur dengan seberapa baik pola dari kategori yang berbeda dipisahkan
- Decision boundaries ditentukan oleh distribusi peluang setiap pola milik setiap kategori

# Example: Differentiate between square and triangle

Number of segments: 4  
Number of horizontal segments: 2  
Number of vertical segments: 2  
Number of diagonal segments: 0



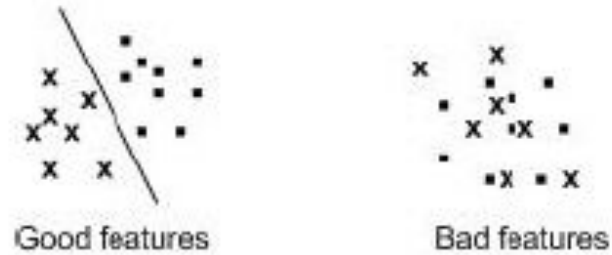
Number of segments: 3  
Number of horizontal segments: 1  
Number of vertical segments: 0  
Number of diagonal segments: 2



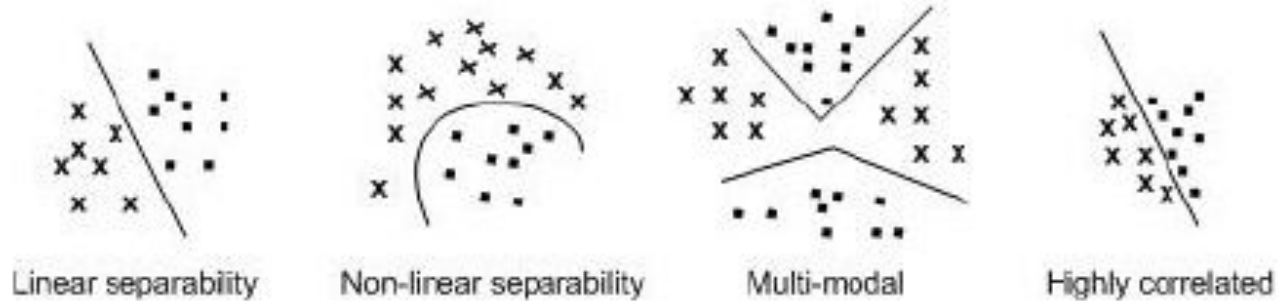
A statistical approach extracts **quantitative features** such as the number of horizontal, vertical, and diagonal segments which are then **passed to a decision-theoretic classifier**.

[https://www.byclb.com/TR/Tutorials/neural\\_networks/ch1\\_1.htm](https://www.byclb.com/TR/Tutorials/neural_networks/ch1_1.htm)

# Good vs Bad Features



(a)



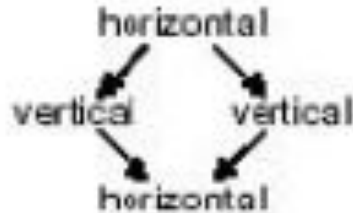
(b)

# Pendekatan Structural/Syntactic

- Pola  $\sim$  sentence in formal language theory
- Structural / syntactic features  $\sim$  primitives
- Feature vectors  $\sim$  morphological features
- Classification is performed by parsing the relational graphs with syntactic grammars or by rules.



# Example: Differentiate between square and triangle

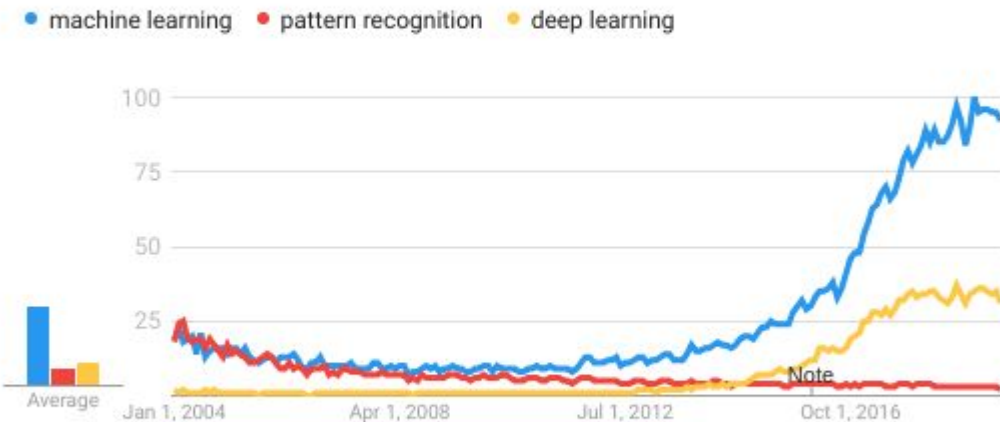


A structural approach extracts **morphological features** and their interrelationships, encoding them in relational graphs; classification is performed by **parsing** the relational graphs with syntactic grammars.

# Learning Buzz Words: PR - ML - DL

Interest over time

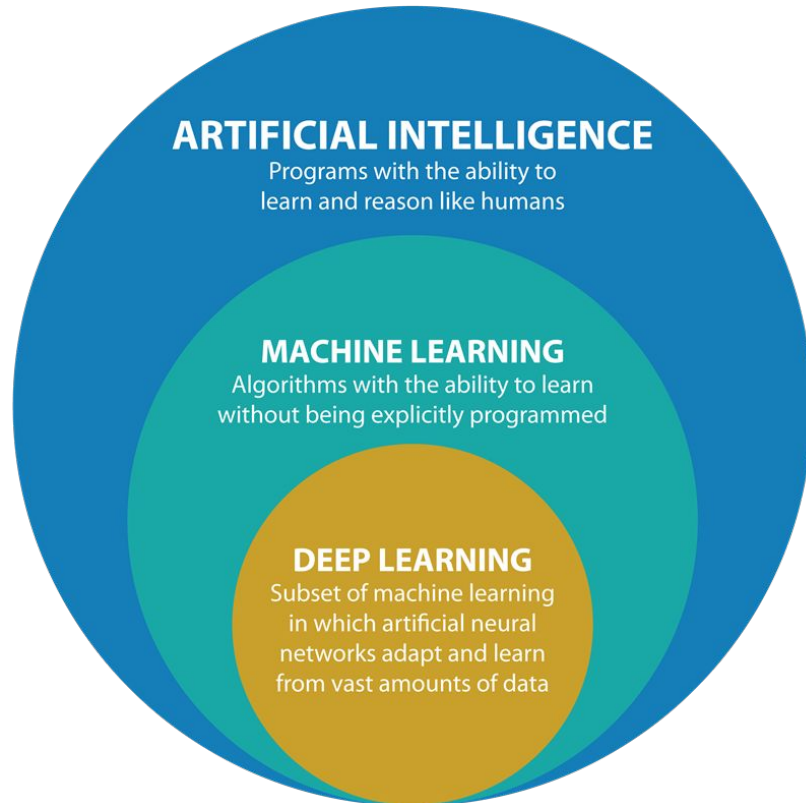
Worldwide. 2004 - present. Web Search.



Google Trends

- a) **Machine Learning** is rising like a true champion,
- b) **Pattern Recognition** started as synonymous with Machine Learning,
- c) **Pattern Recognition** is dying,
- d) **Deep Learning** is new and rising fast.

# AI - ML - DL

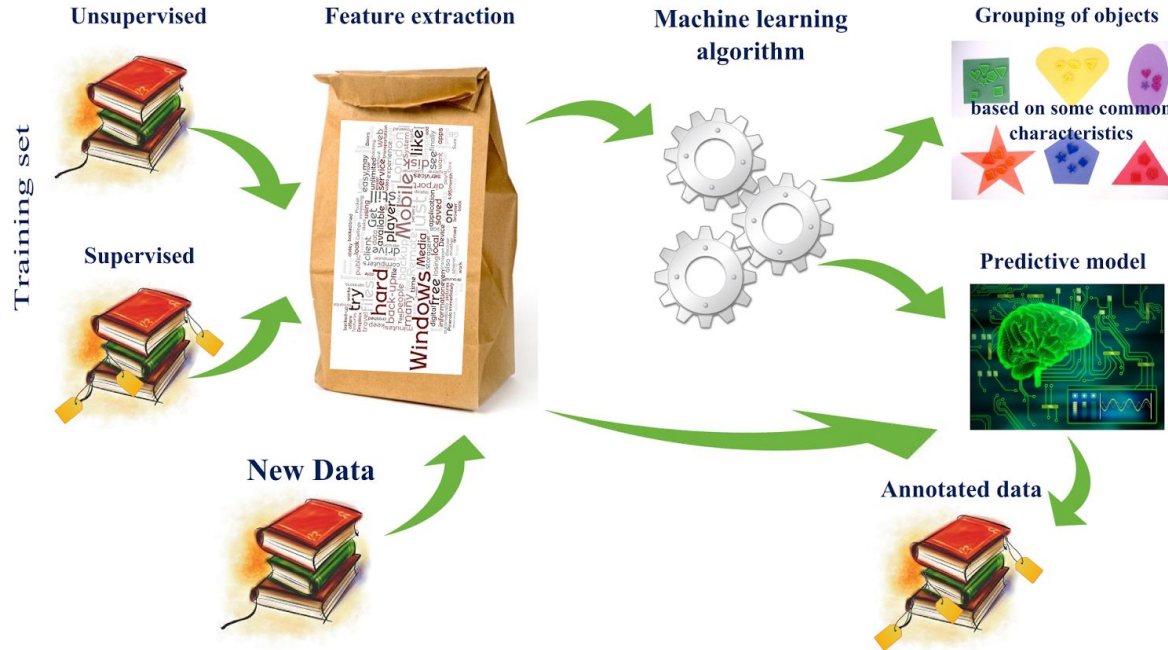


# Machine Learning: Definition

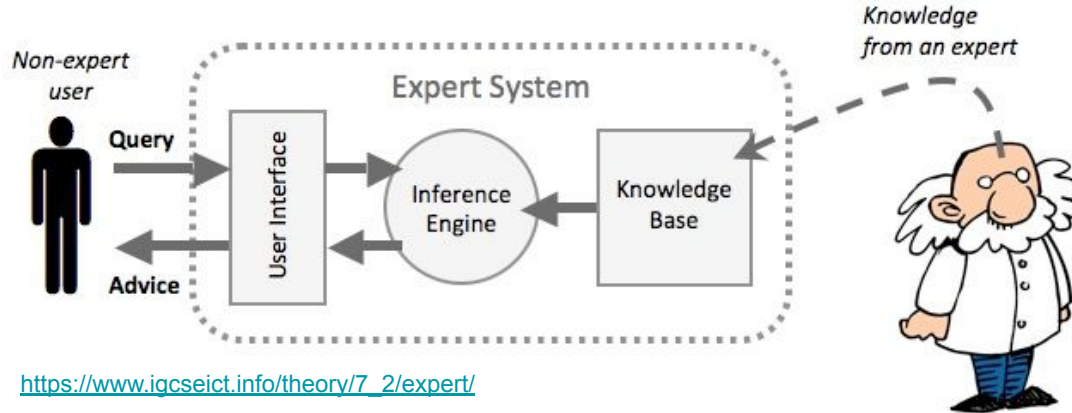
Arthur Samuel (1959): Machine Learning is the field of study that gives the computer the ability to learn **without being explicitly programmed**. <http://citeseerx.ist.psu.edu/viewdoc/download?doi=10.1.1.368.2254&rep=rep1&type=pdf>

Tom Mitchell (1998): a computer program is said to learn from experience  $E$  with respect to some class of tasks  $T$  and performance measure  $P$ , **if its performance at tasks in  $T$ , as measured by  $P$ , improves with experience  $E$ .**

# Machine Learning Workflow



# Machine Learning: Why



[https://www.igcseict.info/theory/7\\_2/expert/](https://www.igcseict.info/theory/7_2/expert/)

Dalam sistem berbasis pengetahuan, sebagai teknik akuisisi pengetahuan otomatis untuk menangani knowledge acquisition bottleneck

Develop software applications that we can't program by hand (poorly understood domains). Humans might not have the knowledge to develop effective algorithms

## face recognition



[https://www.nec.com/en/global/solutions/safety/face\\_recognition/NeoFaceWatch.html](https://www.nec.com/en/global/solutions/safety/face_recognition/NeoFaceWatch.html)

## self driving car



<https://www.thestar.com.my/tech/tech-news/2019/07/08/waymo-taxis-on-the-way-california-green-light-test-programme/>

Pertanyaan ?

# PR

- Berikanlah satu contoh persoalan yang diselesaikan dengan 3 pendekatan template matching, statistical, dan sintaksis.