



## Modul 8: Learning



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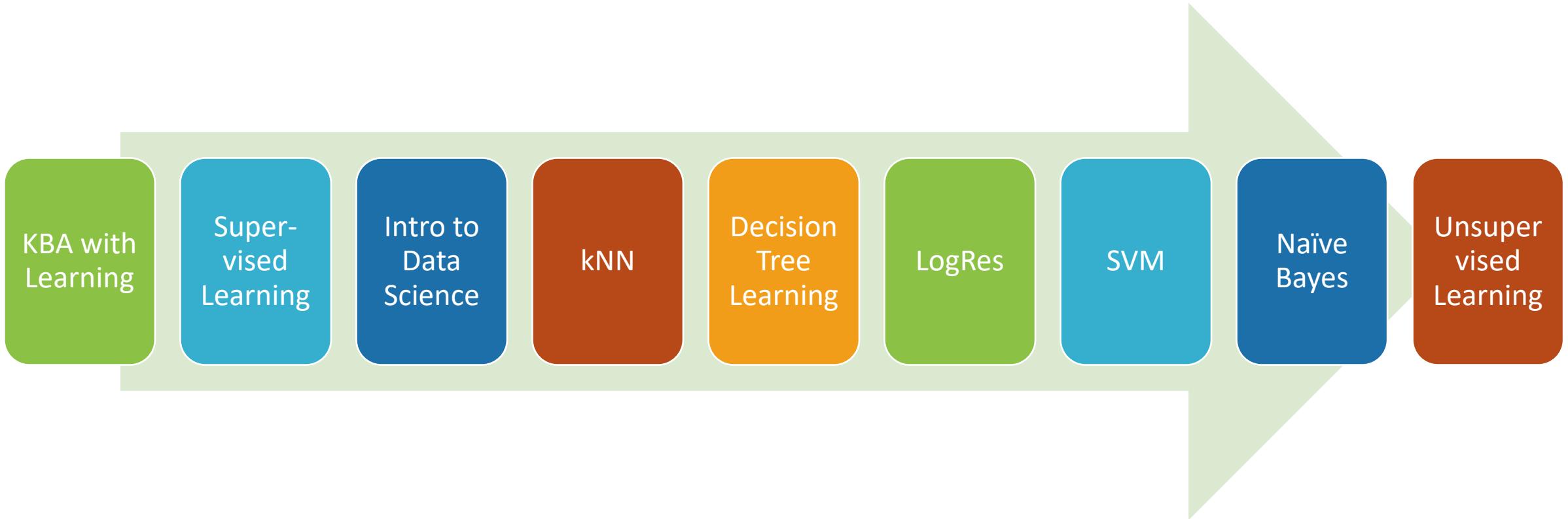
### 01 Knowledge-based Agent with Learning

KK IF – Teknik Informatika – STEI ITB

Inteligensi Buatan  
(*Artificial Intelligence*)



# Learning



# Knowledge-based Agent with Learning

Starting with an empty knowledge-base

**Agent designer** can TELL sentences one by one

agent knows how to operate in its environment

Learning allows agent to operate in initially unknown environments

Learning improves its performance on future tasks after making observation about the world



# Why Need Learning?

Learning is essential for unknown environments,

- i.e., when designer lacks omniscience, agent doesn't know world dynamics

Learning is useful as a system construction method,

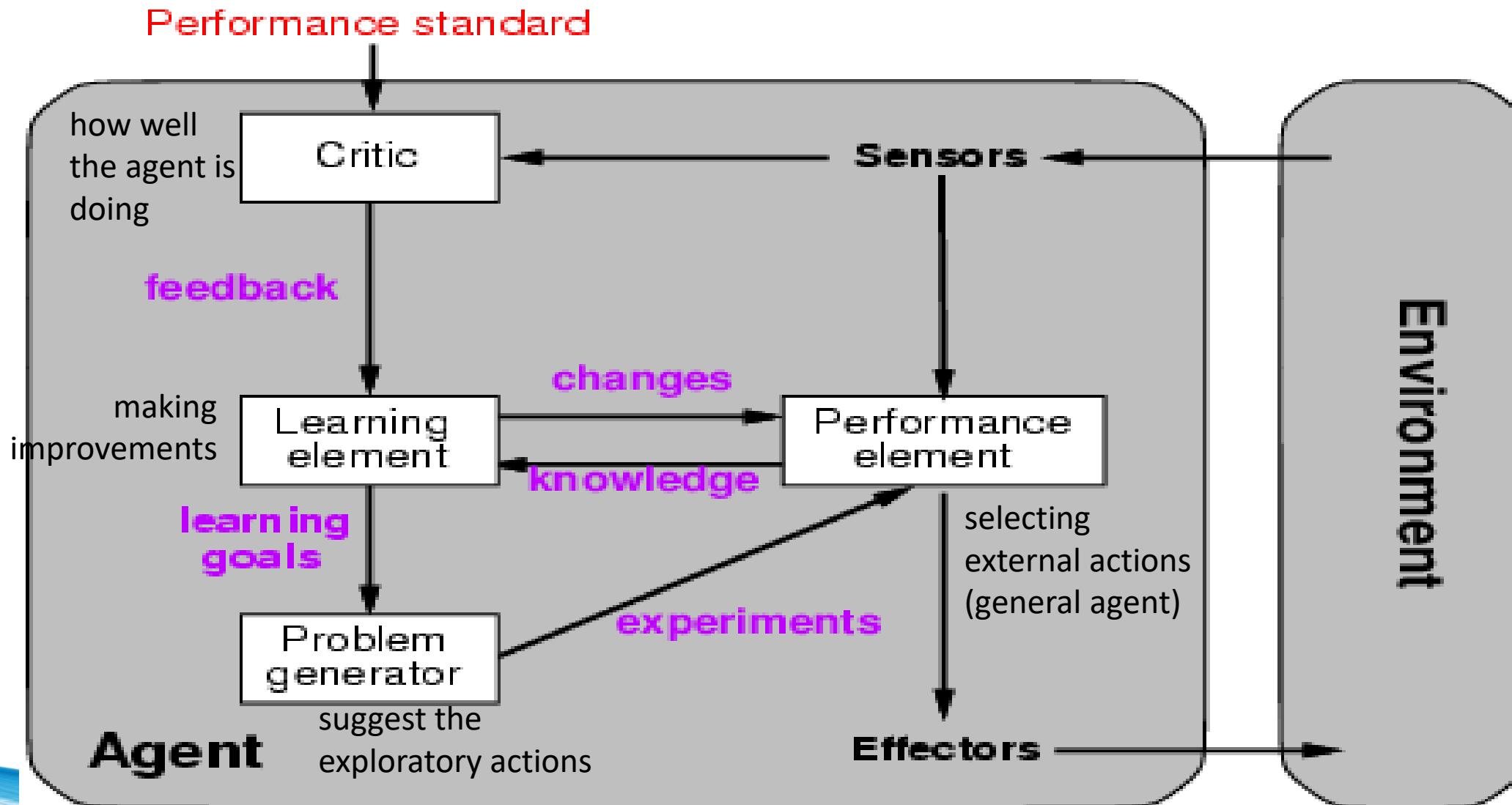
- i.e., expose the agent to reality rather than trying to write it down

Learning modifies the agent's decision mechanisms to improve performance

- Learning from observations, Feedback for improving the agent's ability to act in the future



# KBA with Learning = Learning Agent



Russell, S. J., & Norvig, P. (2010). Artificial Intelligence - A Modern Approach, Third International Edition.



# Design of A Learning Element

Learning: **changes** in the system that are **adaptive** in the sense that they enable the system to do the task or tasks drawn from the same population **more efficiently** and **more effectively** the next time.

Which component of performance element are to be learned

Availability of prior knowledge

What feedback is available to learn these components

What representation is used for the components



# Taxi Driver Agent: PE & Feedback



<http://www.gettyimages.com/detail/83988175/Stone>

<http://www.stahle.com/>



- Brake decision:
  - f: states → boolean (brake or not)
  - Feedback: instructor shouts
- Buses recognition:
  - f: images → boolean
  - Feedback: labeling bus images
- Good/bad traffic day recognition
  - Develop own concepts
  - No feedback
- Desirable/undesirable behavior recognition from tip indication
  - Feedback: tip from customer at the end of journey

# Learning Type based on Feedback

## Unsupervised Learning (no feedback)

- Given set of examples without label, detect potentially useful clusters of input examples. E.g. good/bad traffic day recognition.

## Supervised Learning

- Given set of examples (input-output pairs), learns a function that maps from input to output. E.g. brake decision

## Reinforcement Learning

- Agent learns from a series of reinforcements (rewards or punishments). It is up to agent to decide which of the actions prior to the reinforcement were most responsible for it.



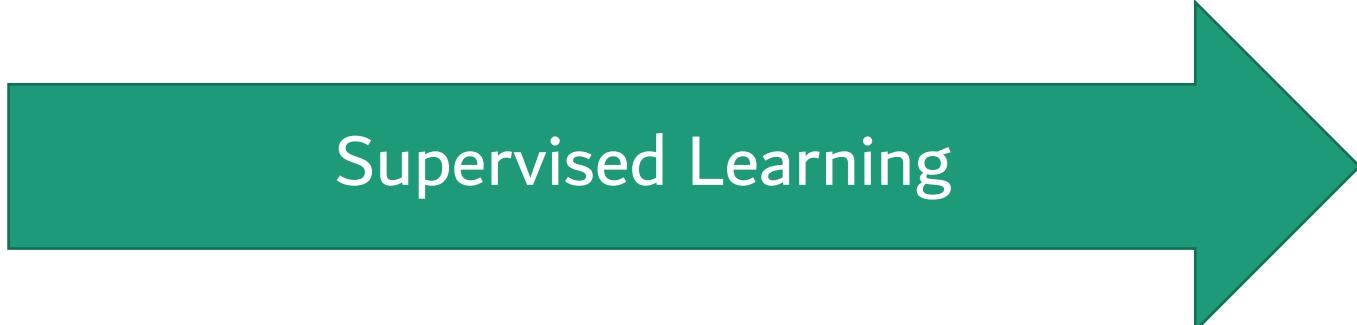
# Summary

KBA with learning = learning agent

Why: unknown environment, system construction method, improve performance

Design learning element: which PE, prior knowl, feedback, representation

Learning type: supervised, unsupervised, reinforcement



Supervised Learning



