

What is  
Machine Learning?

# 人工智慧 目標

Human Intelligence Exhibited by Machines

## ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



## MACHINE LEARNING

Machine learning begins to flourish.



# 機器學習 方法

Approach to Achieve Artificial Intelligence

## DEEP LEARNING

### 深度學習

Deep learning breakthroughs drive AI boom.

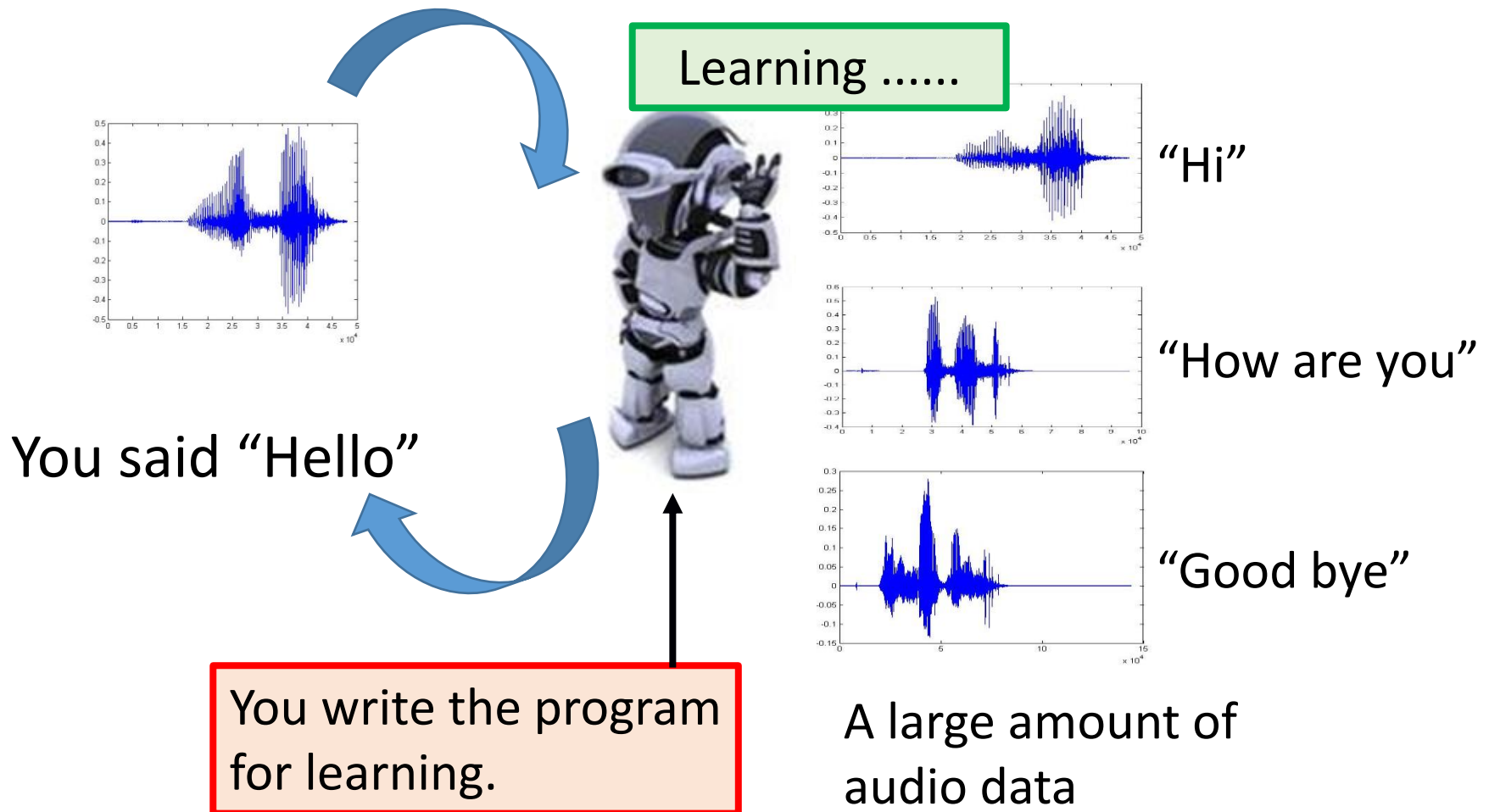


Technique for Implementing Machine Learning

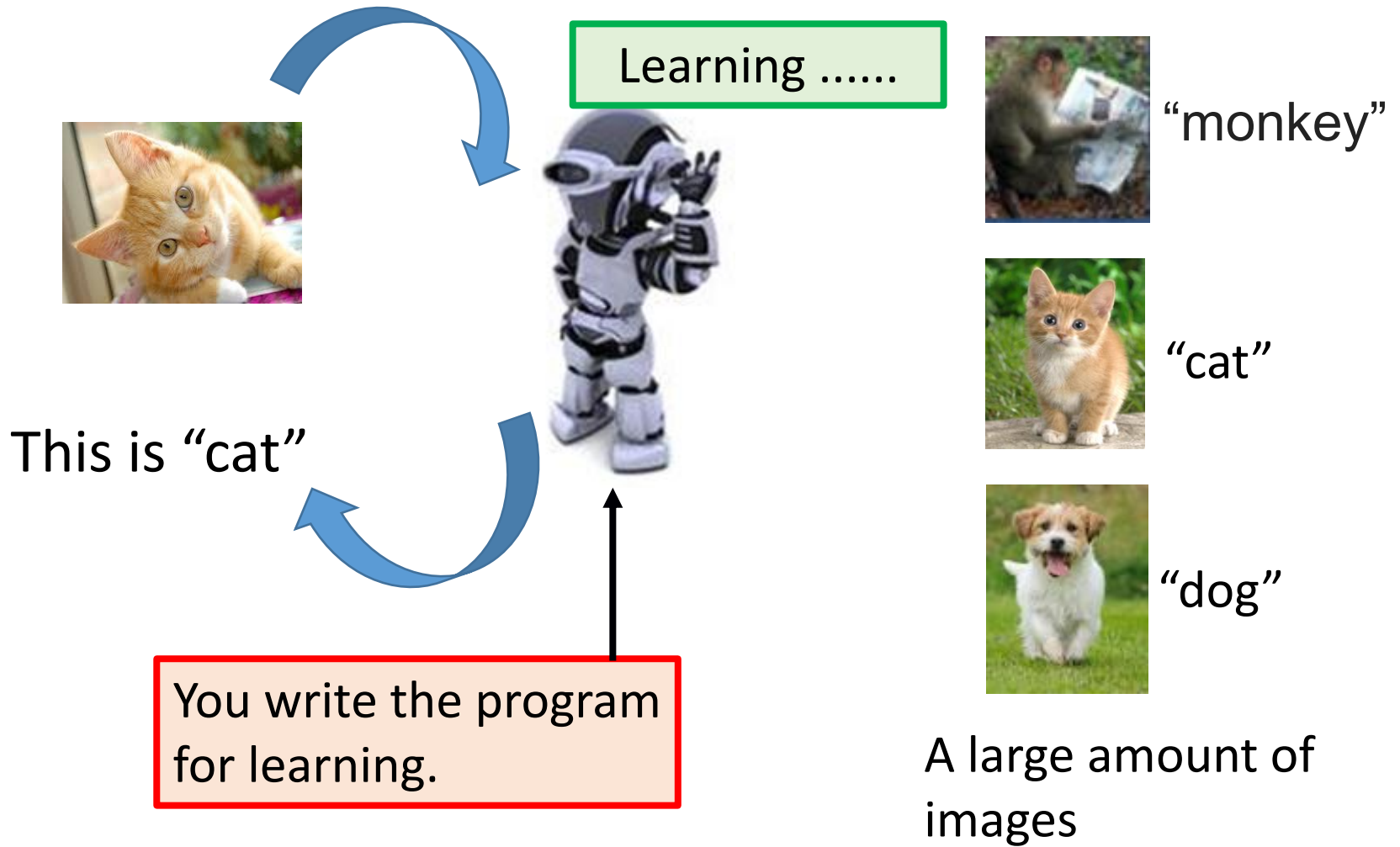


Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then deep learning, a subset of machine learning – have created ever larger disruptions.

# What is Machine Learning?



# What is Machine Learning?



# Machine Learning ≈ Looking for a Function

- **Speech Recognition**

$$f(\text{[audio waveform]}) = \text{"How are you"}$$

- **Image Recognition**

$$f(\text{[cat image]}) = \text{"Cat"}$$

- **Playing Go**

$$f(\text{[go board image]}) = \text{"5-5"} \text{ (next move)}$$

- **Dialogue System**

$$f(\text{"Hi"} \text{ (what the user said)}) = \text{"Hello"} \text{ (system response)}$$

# Framework

## Image Recognition:

$$f\left(\text{img of cat}\right) = \text{"cat"}$$



$$f_1\left(\text{img of cat}\right) = \text{"cat"}$$

$$f_2\left(\text{img of cat}\right) = \text{"money"}$$

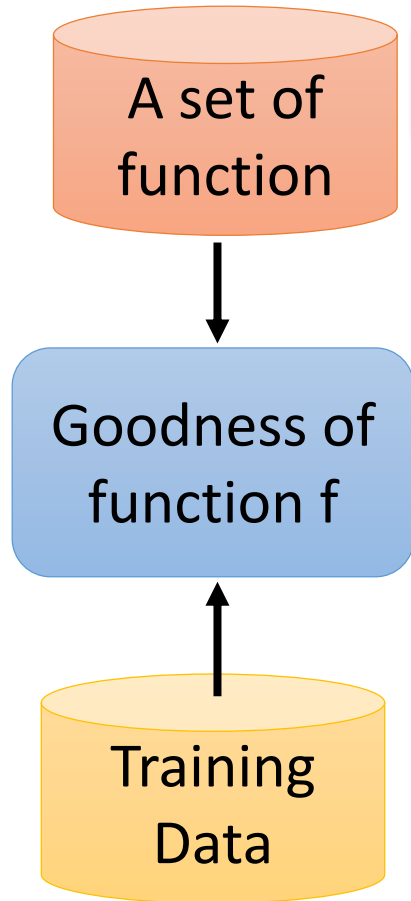
$$f_1\left(\text{img of dog}\right) = \text{"dog"}$$

$$f_2\left(\text{img of dog}\right) = \text{"snake"}$$

# Framework

## Image Recognition:

$$f(\text{img\_cat}) = \text{"cat"}$$



**Model**  
 $f_1, f_2 \dots$

$f_1(\text{img\_cat}) = \text{"cat"}$	$f_2(\text{img\_cat}) = \text{"money"}$
$f_1(\text{img\_dog}) = \text{"dog"}$	$f_2(\text{img\_dog}) = \text{"snake"}$

**Better!**

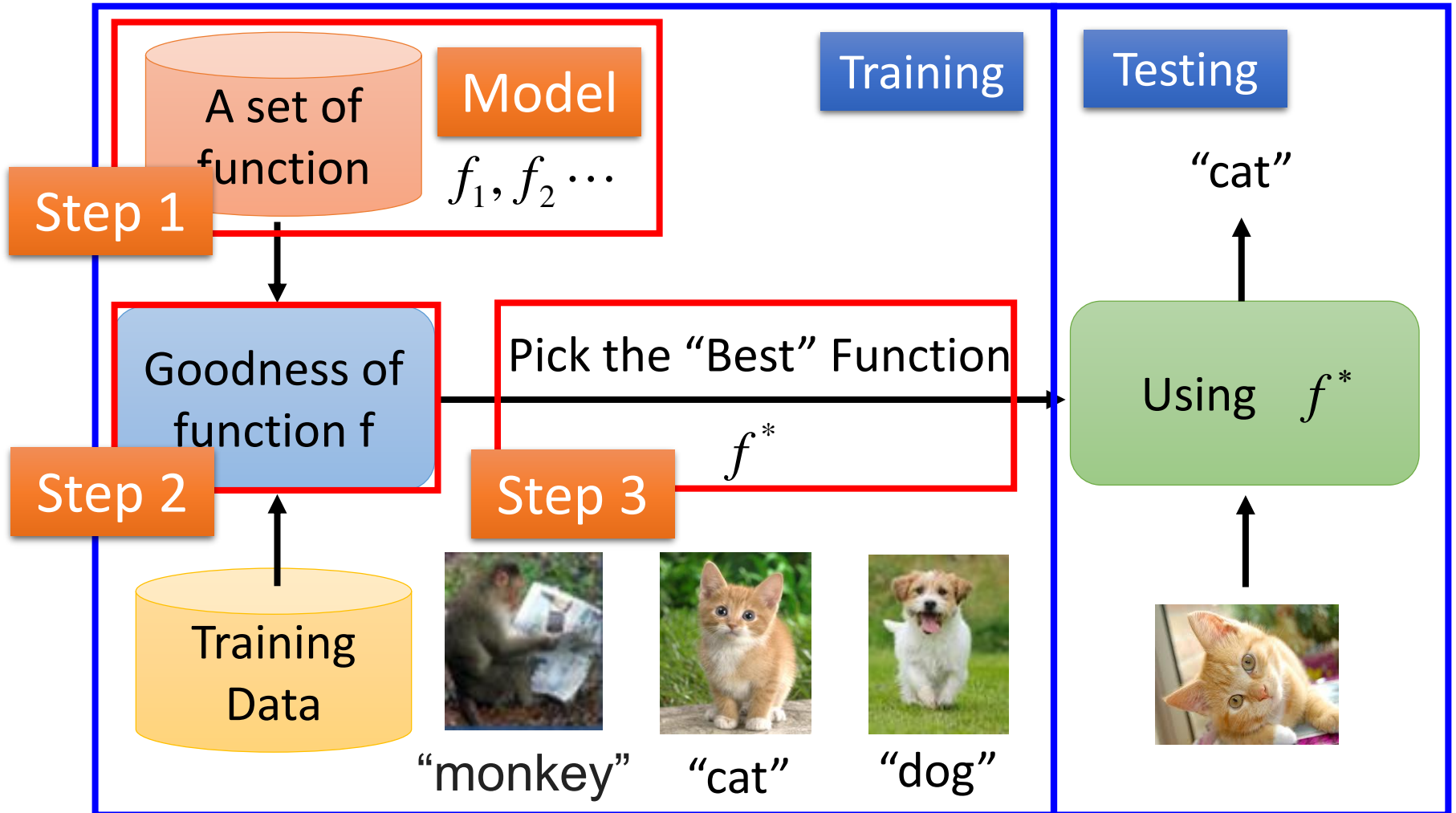
function input:   

function output: "monkey" "cat" "dog"

# Image Recognition:

## Framework

$$f(\text{Image of a cat}) = \text{"cat"}$$

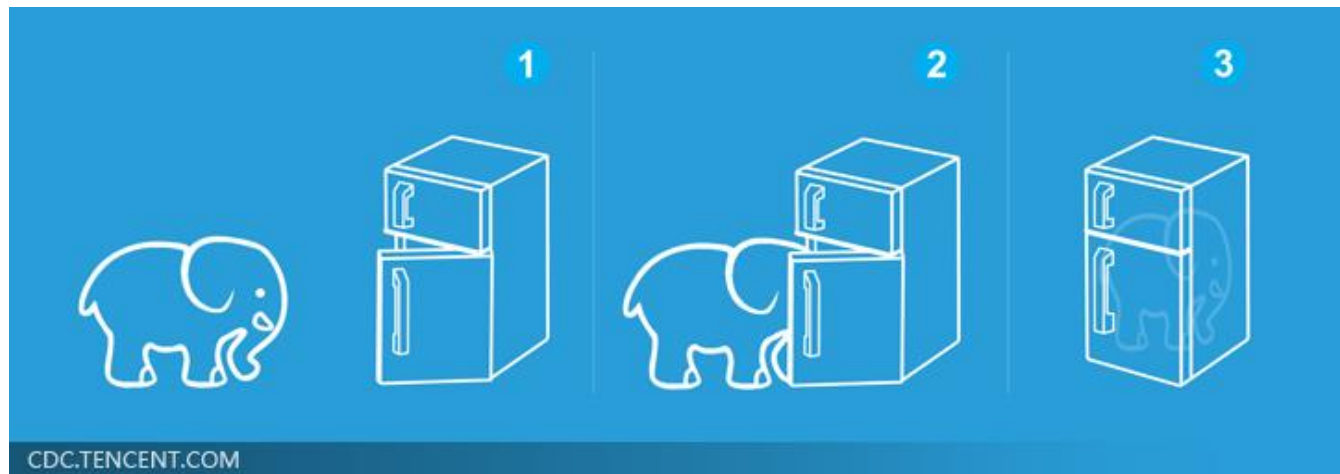




# Machine Learning is so simple .....

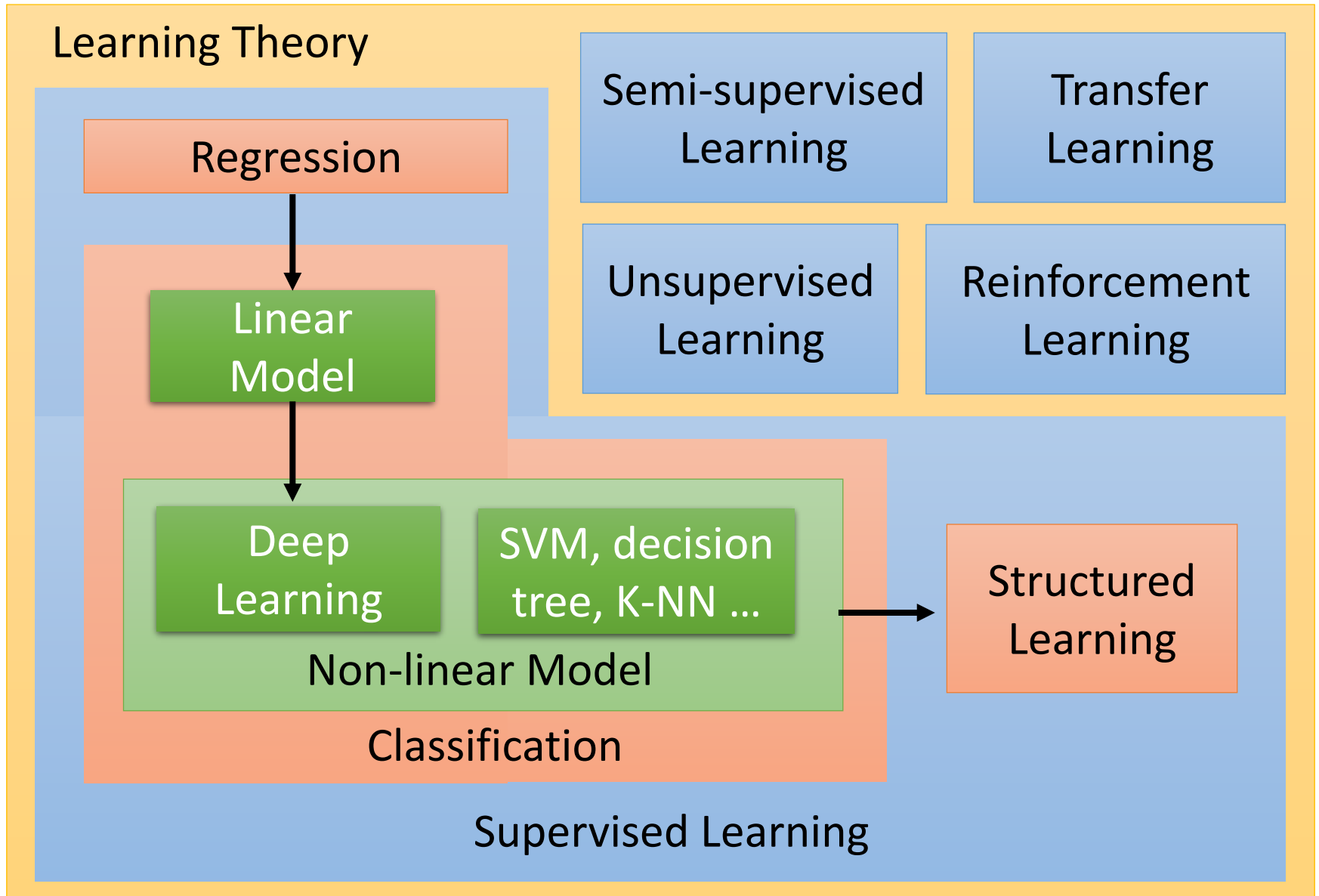


就好像把大象放進冰箱 .....



# Learning Map

# Learning Map



# Learning Map

Regression

The output of the target function  $f$  is “scalar”.

預測  
PM2.5

今天上午 PM2.5  
昨天上午 PM2.5  
.....



明天上午 PM2.5  
(scalar)

## Training Data:

Input:

9/01 上午 PM2.5 = 63    9/02 上午 PM2.5 = 65

Input:

9/12 上午 PM2.5 = 30    9/13 上午 PM2.5 = 25

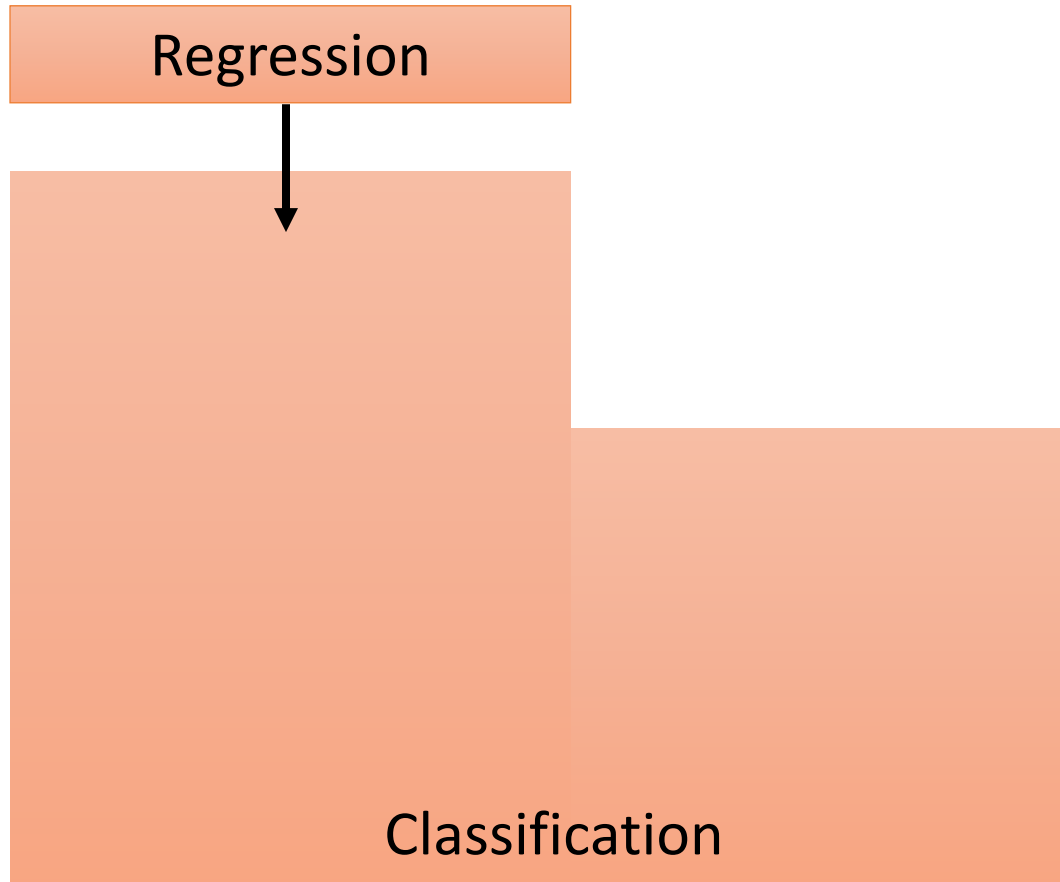
Output:

9/03 上午 PM2.5 = 100

Output:

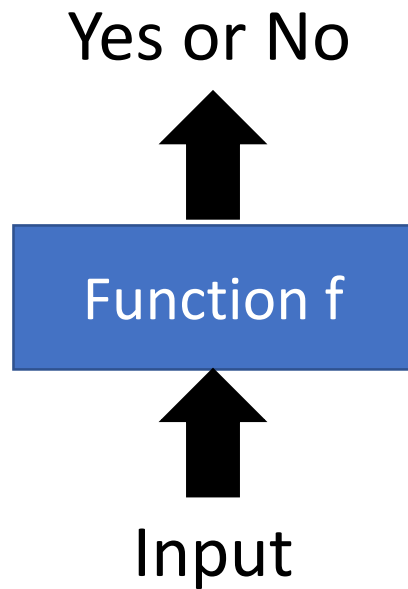
9/14 上午 PM2.5 = 20

# Learning Map

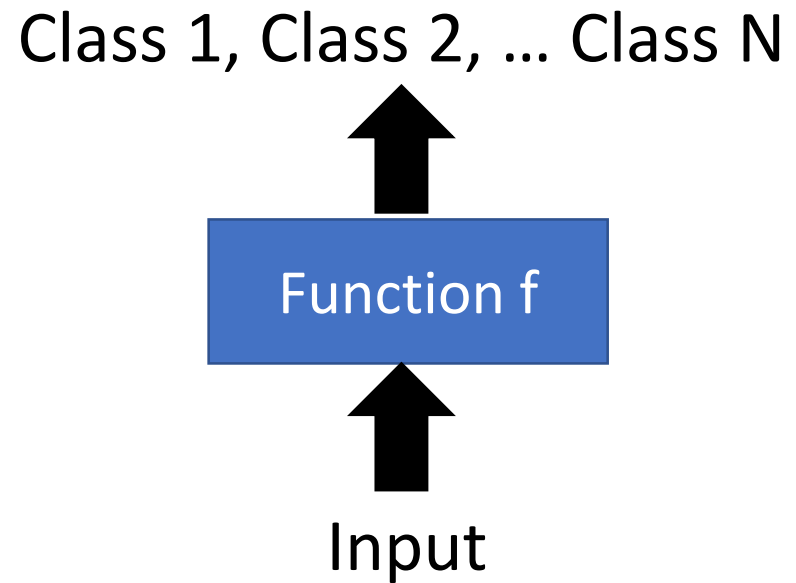


# Classification

- Binary Classification

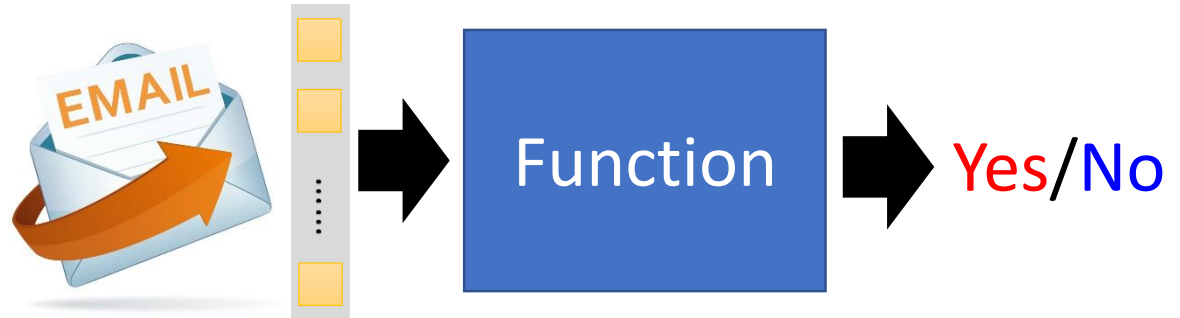


- Multi-class Classification



# Binary Classification

Spam  
filtering



Training  
Data



(<http://spam-filter-review.toptenreviews.com/>)

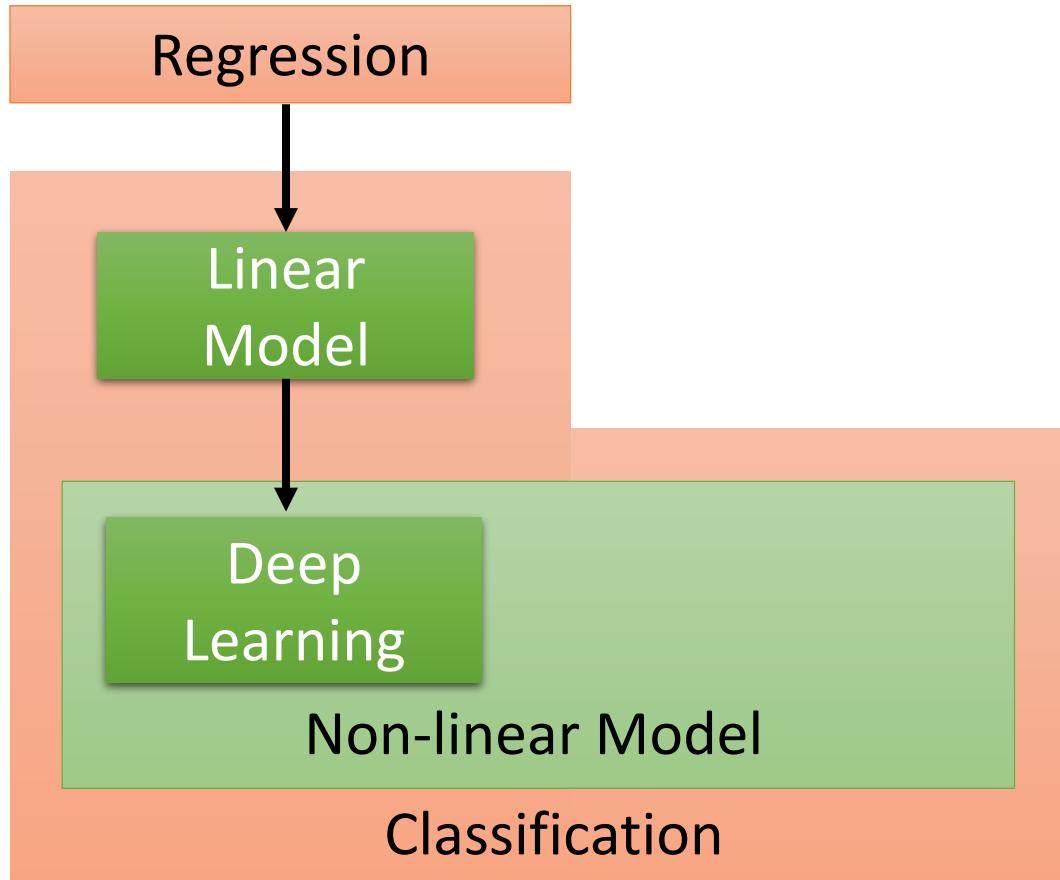
# Multi-class Classification

## Document Classification



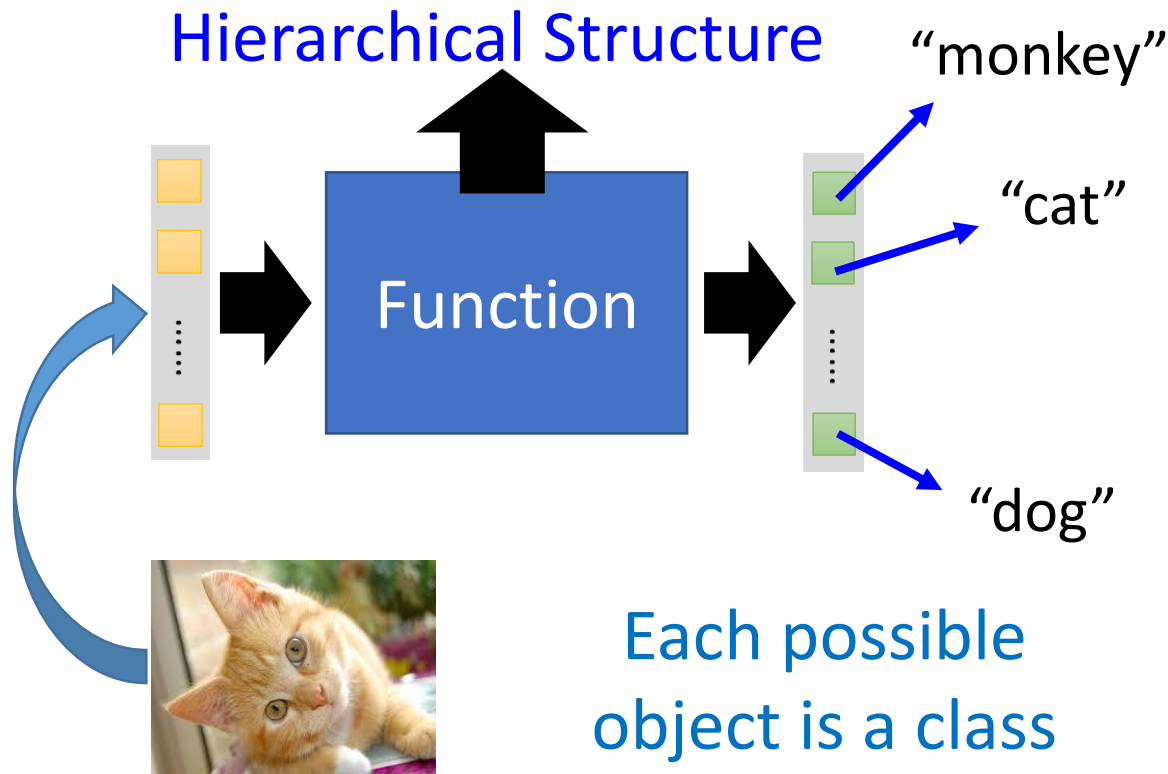


# Learning Map

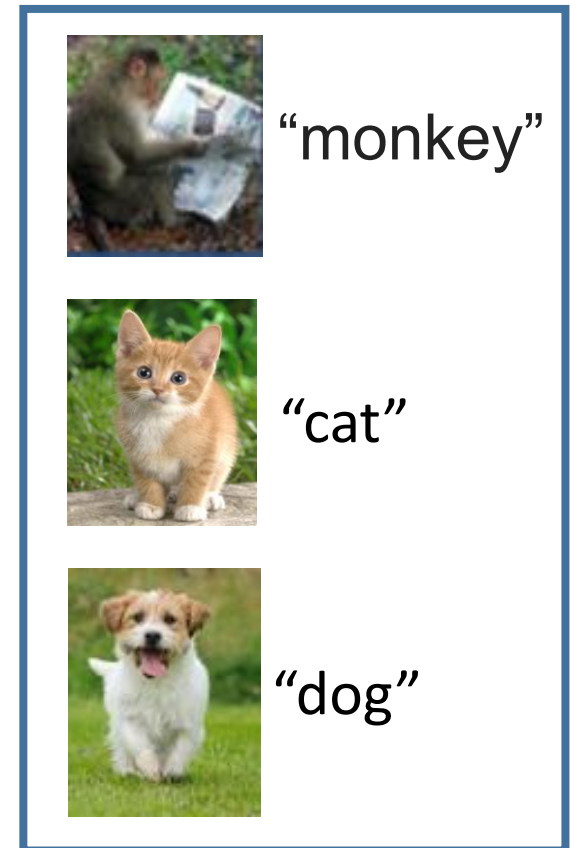


# Classification - Deep Learning

- Image Recognition

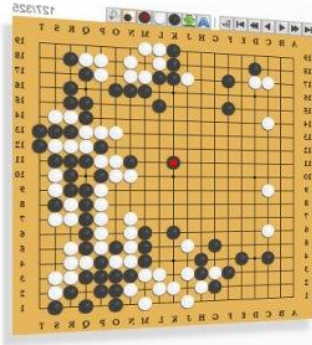


## Training Data



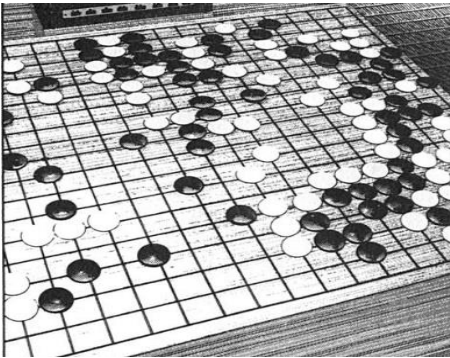
# Classification - Deep Learning

- Playing GO



Next move  
Each position  
is a class  
(19 x 19 classes)

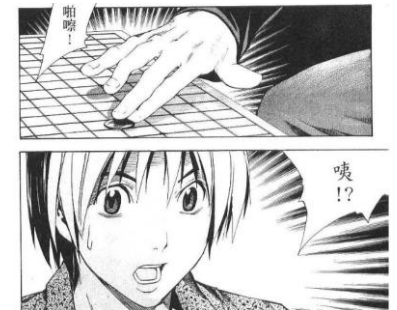
## Training Data



一堆棋譜

進藤光 v.s. 社清春

黑: 5之五 → 白: 天元 → 黑: 五之5



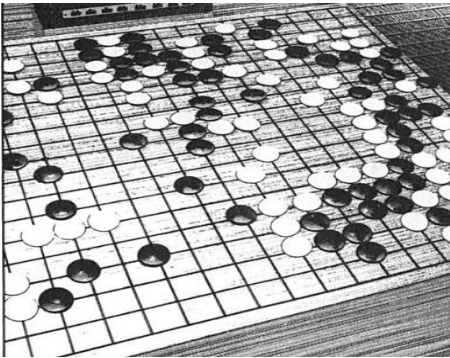
# Classification - Deep Learning

- Playing GO



Next move  
Each position  
is a class  
(19 x 19 classes)

## Training Data



一堆棋譜

進藤光 v.s. 社清春

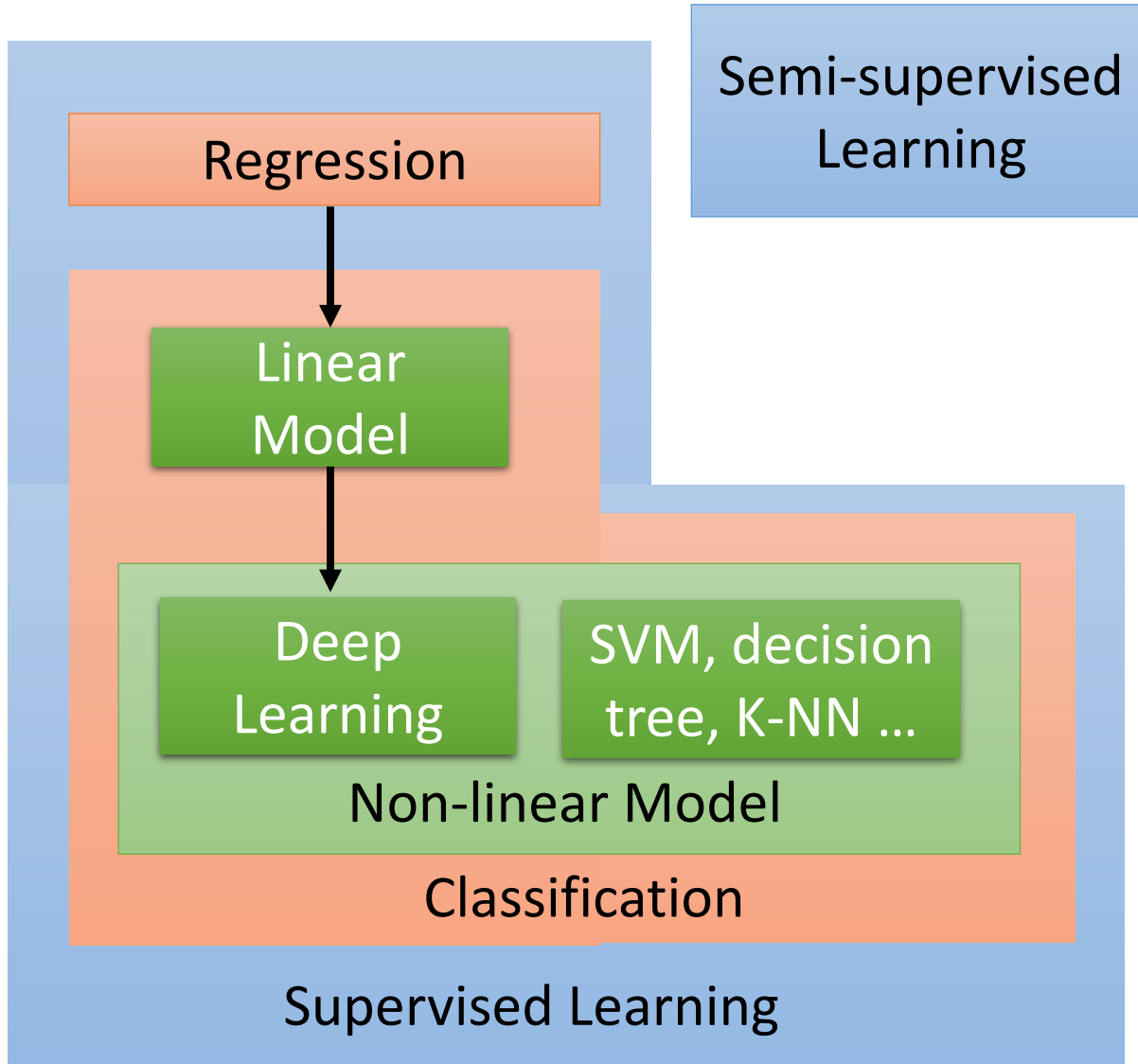
黑: 5之五 → 白: 天元 → 黑: 五之5

Input: 黑: 5之五 → Output: 天元

Input: 黑: 5之五、白: 天元 → Output: 五之5

Hard to collect a large amount of labelled data

# Learning Map



Training Data:

Input/output pair of target function

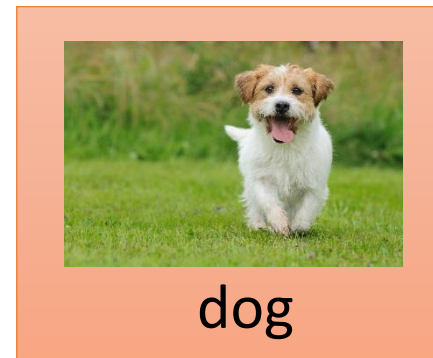
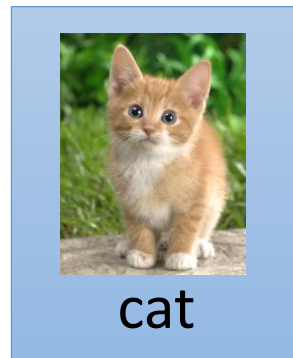
Function

output = label

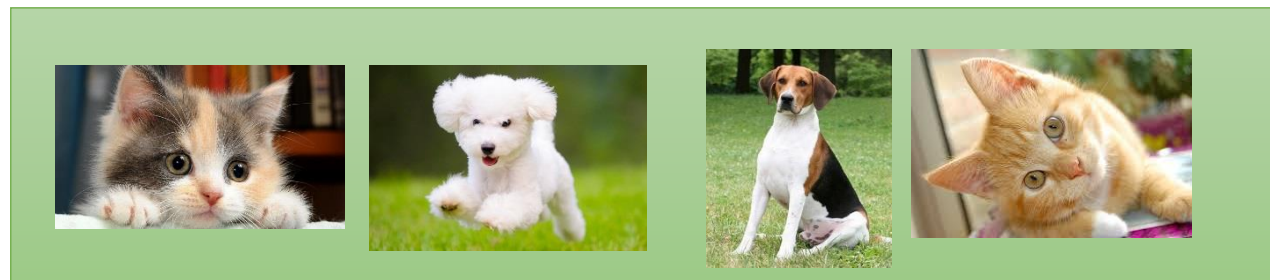
# Semi-supervised Learning

For example, recognizing cats and dogs

Labelled  
data

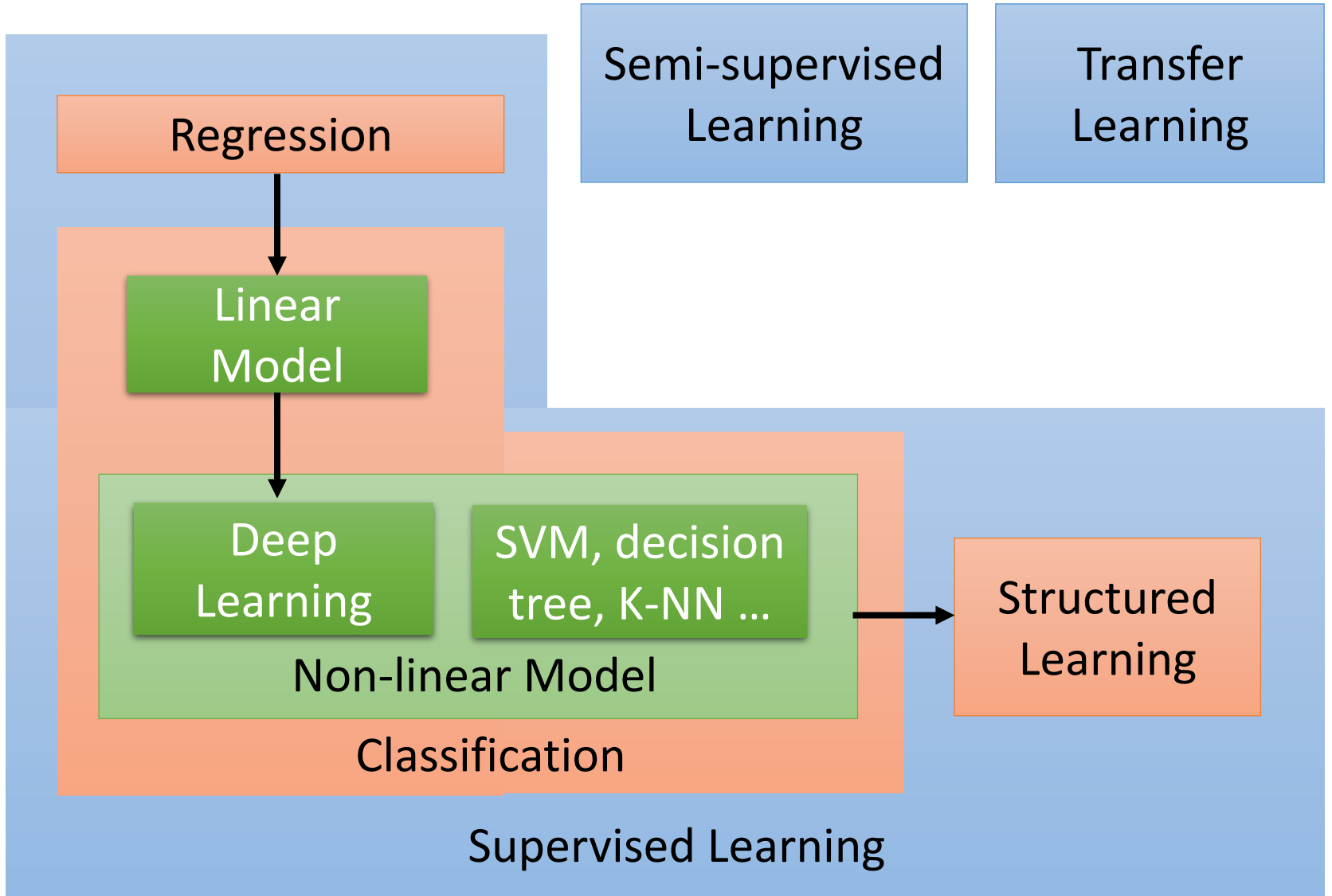


Unlabeled  
data



(Images of cats and dogs)

# Learning Map



# Transfer Learning

For example, recognizing cats and dogs

Labelled  
data



cat



dog



elephant



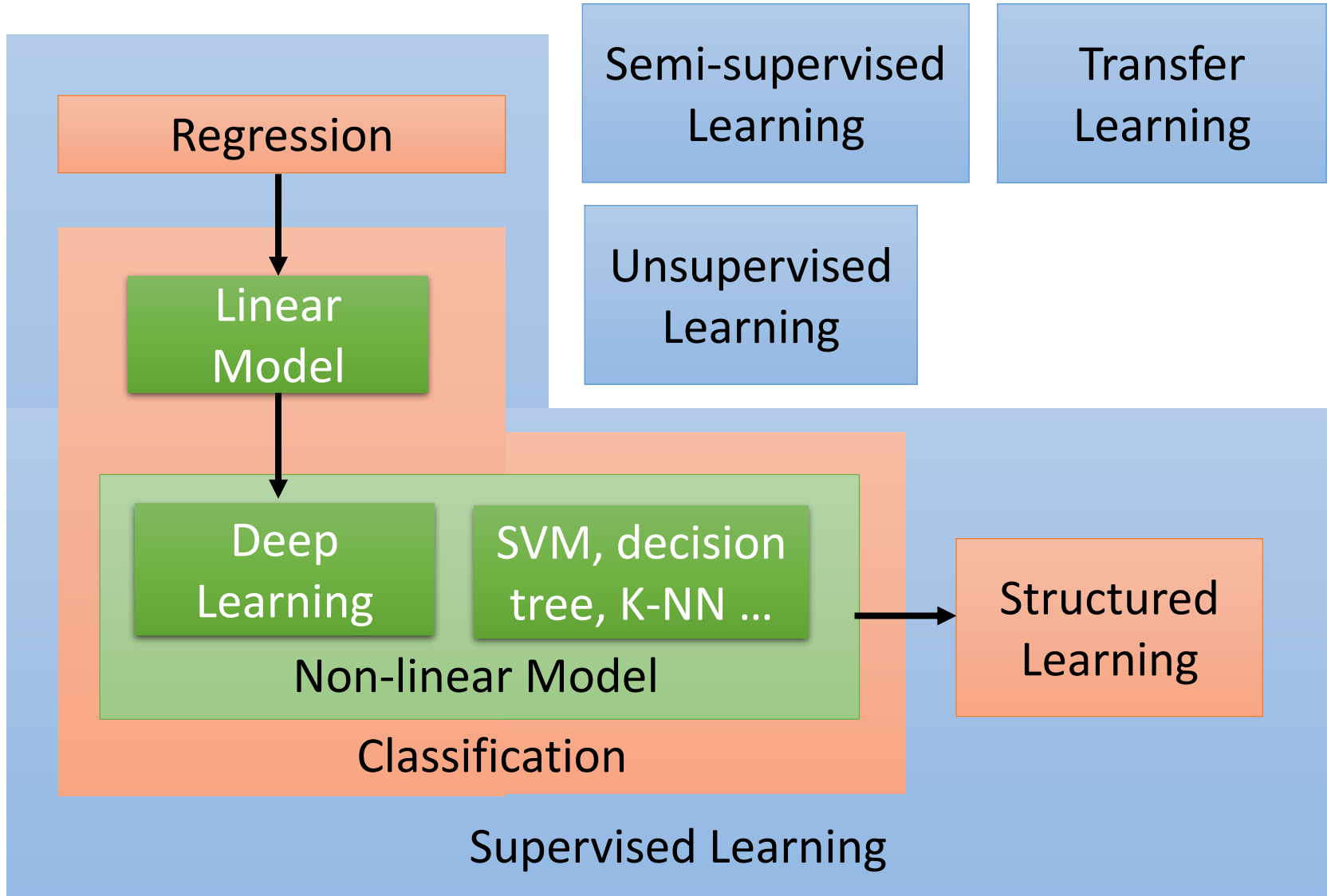
Haruhi



Data not related to the task considered  
(can be either labeled or unlabeled)

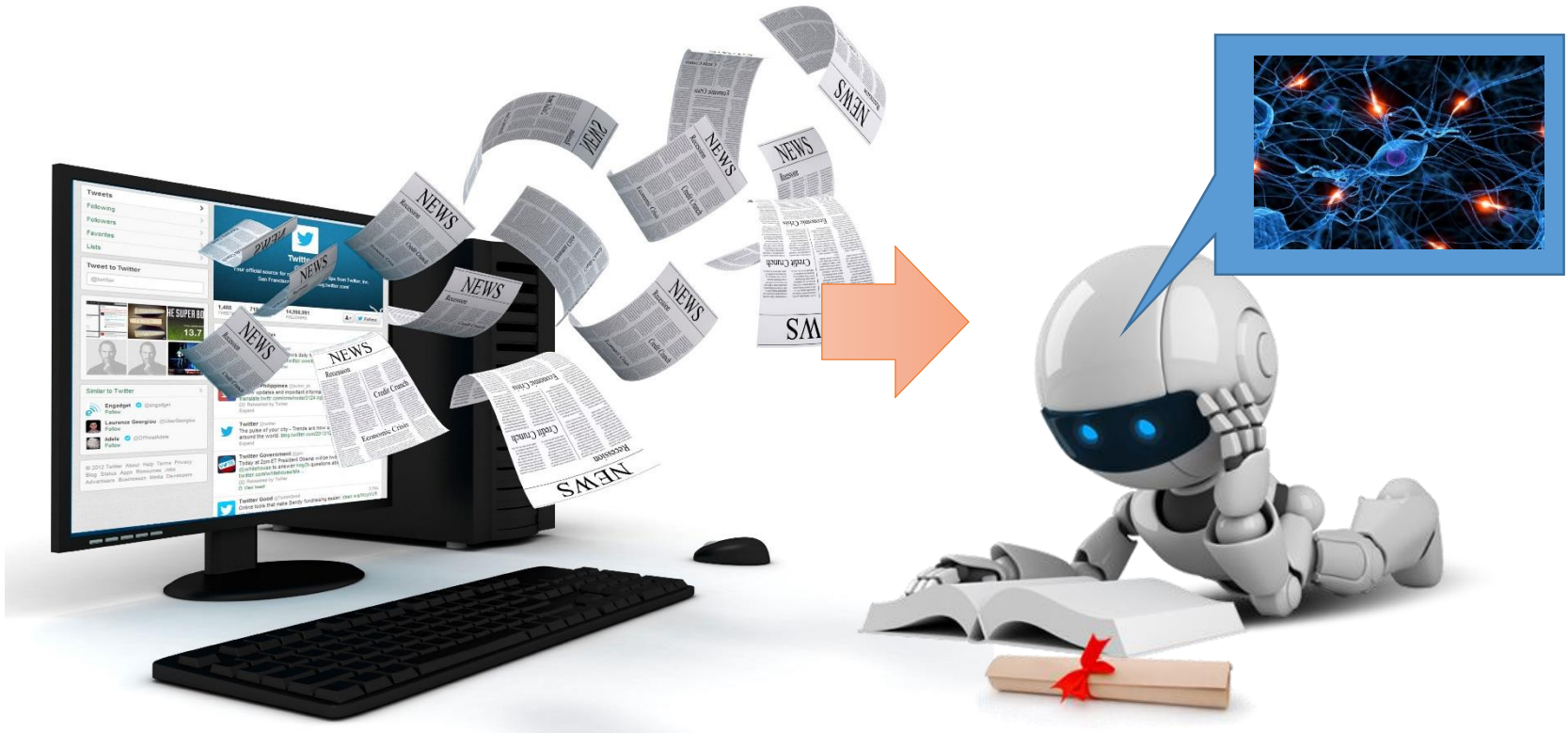


# Learning Map



# Unsupervised Learning

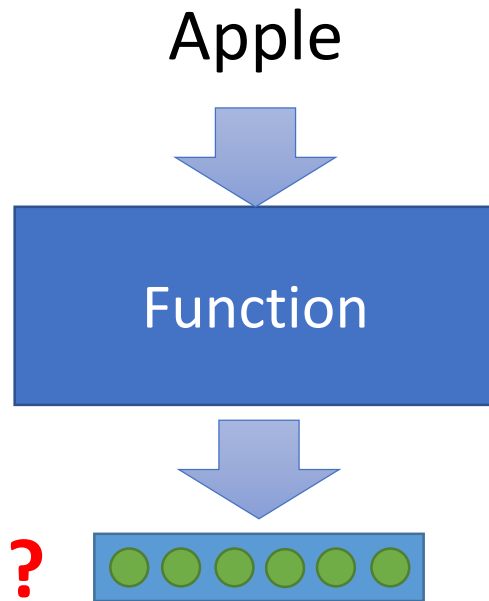
- Machine Reading: Machine learns the meaning of words from reading a lot of documents



<http://top-breaking-news.com/>

# Unsupervised Learning

- Machine Reading: Machine learns the meaning of words from reading a lot of documents

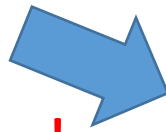
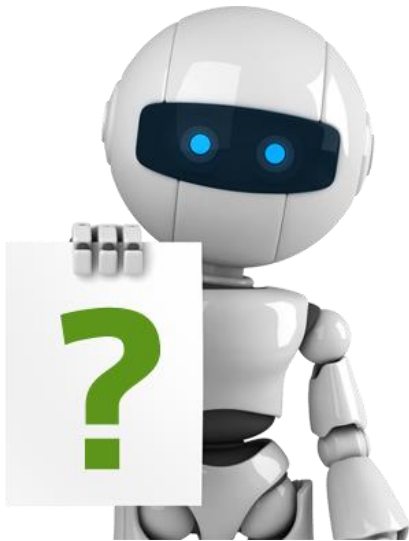


Training data is a lot of text



<https://garavato.files.wordpress.com/2011/11/stacksdocuments.jpg?w=490>

# Unsupervised Learning



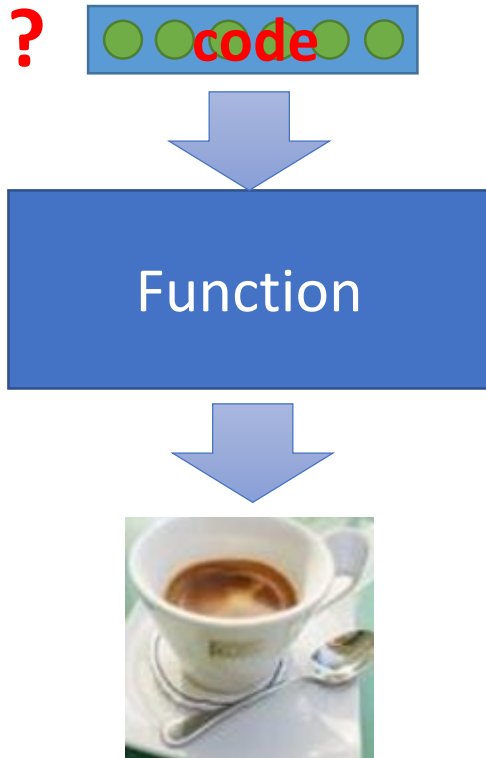
**Draw something!**



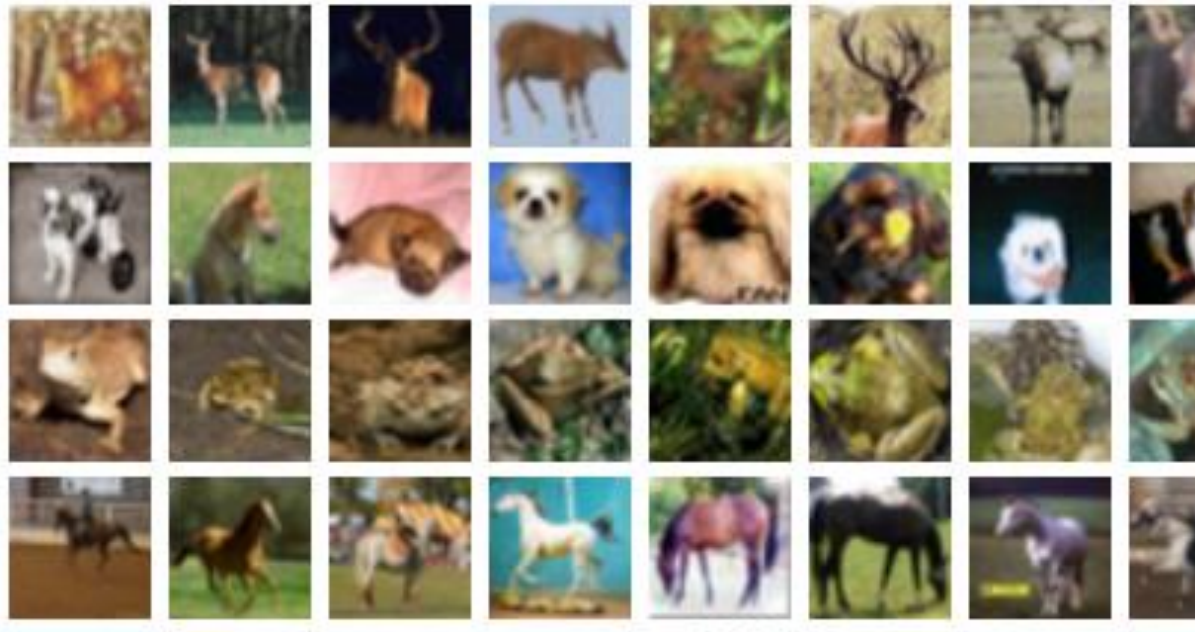
<http://ttic.uchicago.edu/~klivescu/MLSLP2016/>  
(slides of Ian Goodfellow)

# Unsupervised Learning

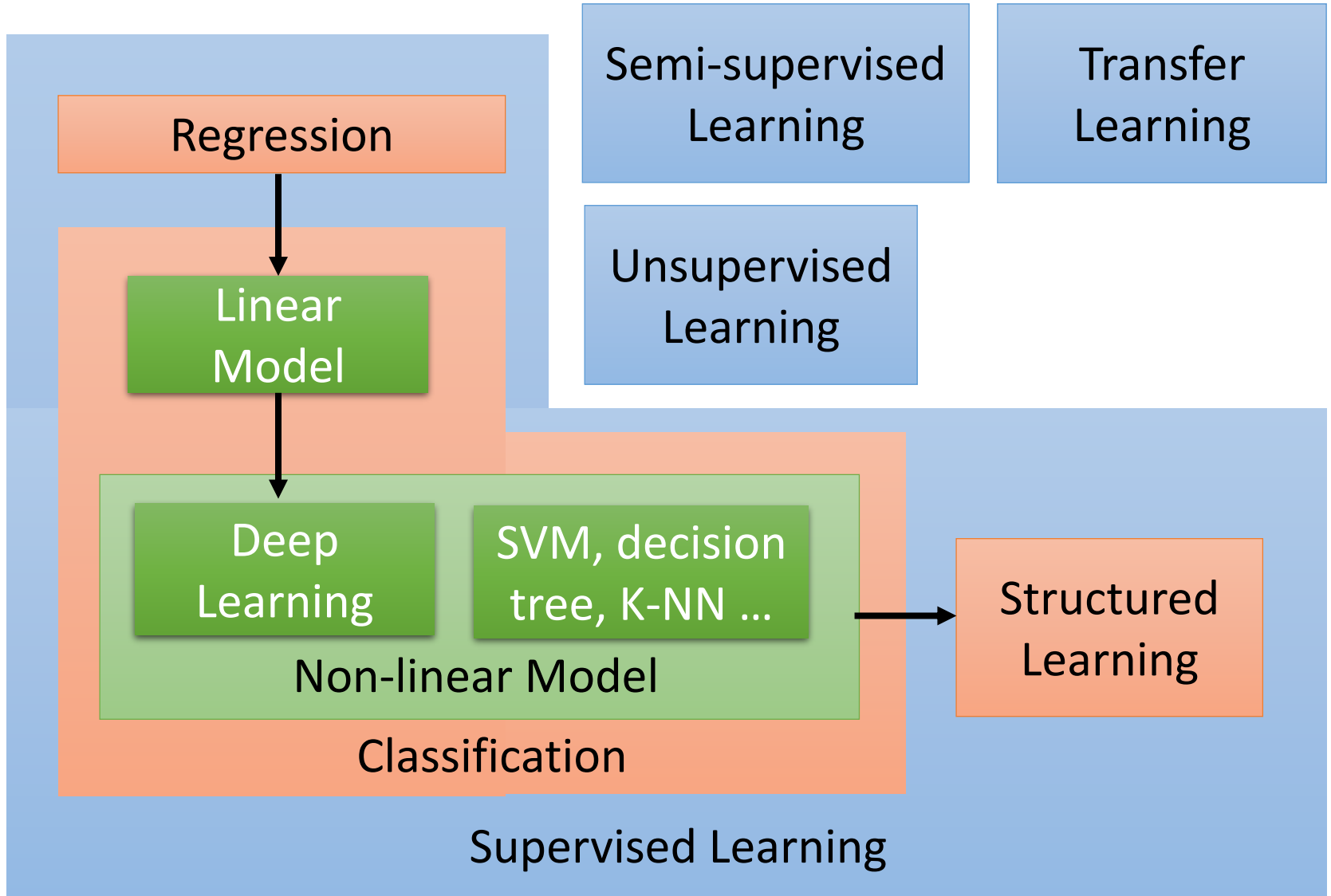
- Machine Drawing



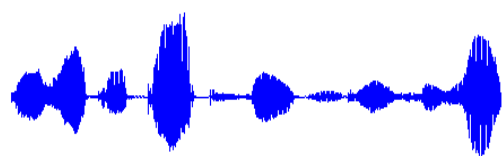
Training data is a lot of images



# Learning Map



# Structured Learning - Beyond Classification



“大家好，歡迎大家來修機器學習”

Speech Recognition

“機器學習”



“Machine Learning”

Machine Translation

人臉辨識

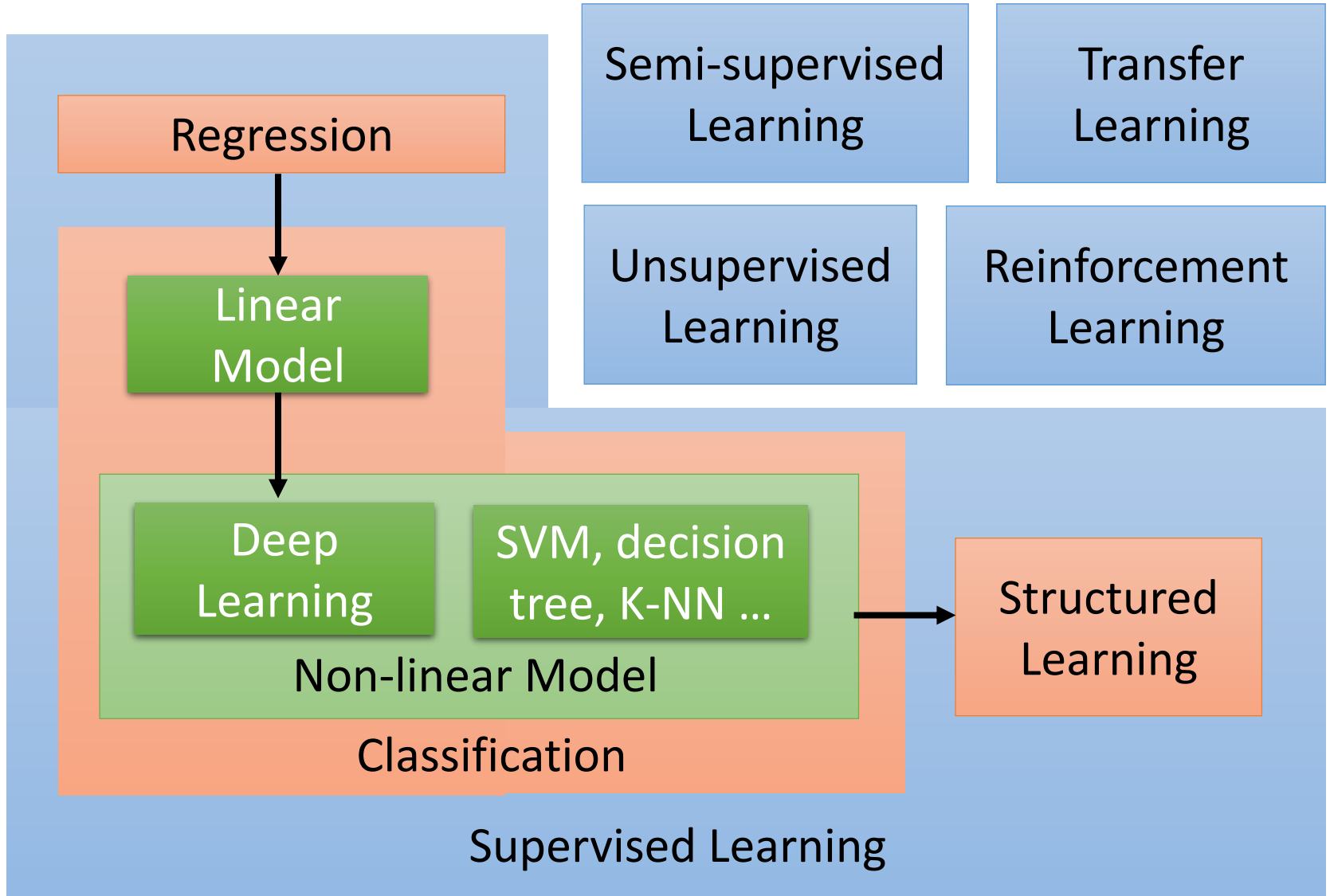


長門

春日

實玖瑠

# Learning Map





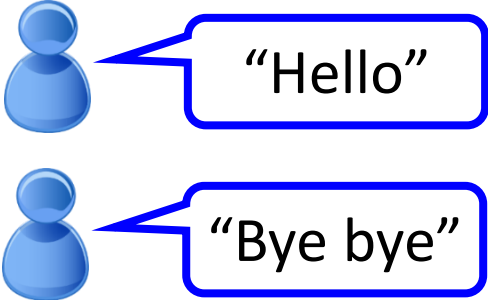
# Reinforcement Learning



# Supervised v.s. Reinforcement

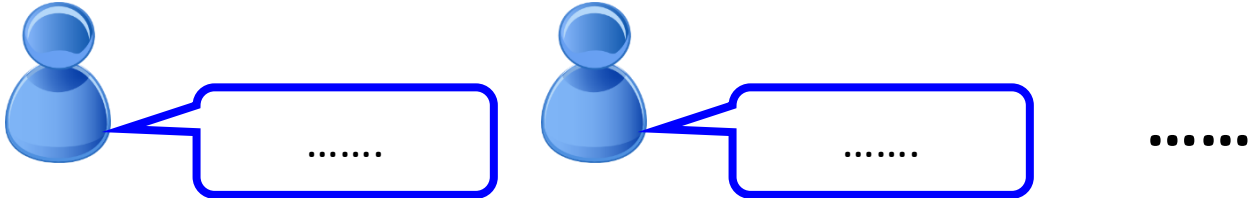
- Supervised

Learning from teacher



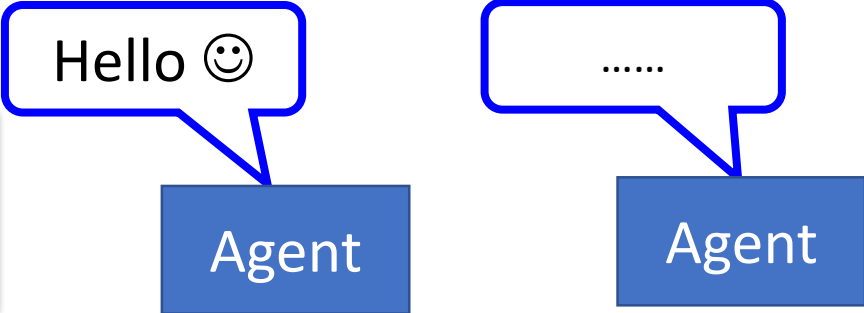
Say "Hi"

Say "Good bye"



Bad

Learning from critics

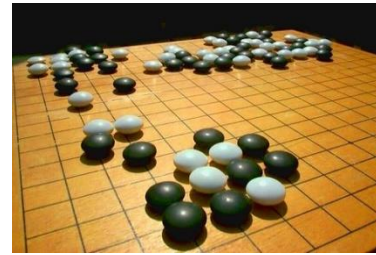


# Supervised v.s. Reinforcement

- Supervised:



Next move:  
"5-5"



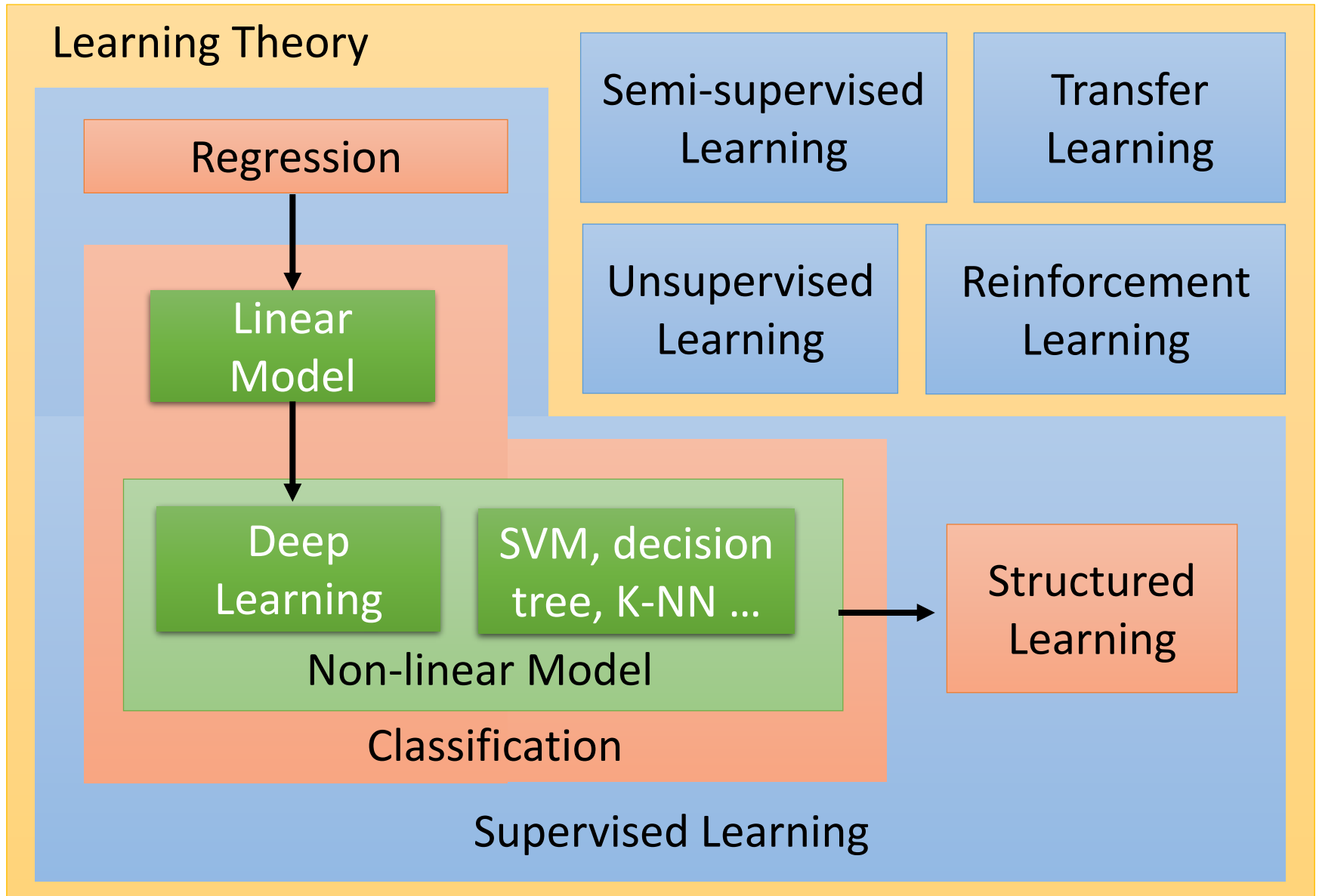
Next move:  
"3-3"

- Reinforcement Learning

First move → ..... many moves ..... → Win!

Alpha Go is supervised learning + reinforcement learning.

# Learning Map





<http://www.express.co.uk/news/science/651202/First-step-towards-The-Terminator-becoming-reality-AI-beats-champ-of-world-s-oldest-game>

# Why we need to learn Machine Learning?

AI 即將取代部分的工作? 新工作: AI 訓練師

# AI 訓練師



機器不是自己會學嗎？  
為什麼需要 AI 訓練師

戰鬥是寶可夢在打，  
為什麼需要寶可夢訓練師？

# 神奇寶貝第5集 尼比市的決鬥



[https://www.youtube.com/watch?v=uUOZZb8eJ\\_k](https://www.youtube.com/watch?v=uUOZZb8eJ_k)

## AI 訓練師



## 寶可夢訓練師

- 寶可夢訓練師要挑選適合的寶可夢來戰鬥
  - 寶可夢有不同的屬性

## AI 訓練師

- AI訓練師要挑選合適的 model, loss function
  - 不同 model, loss function 適合解決不同的問題



# 神奇寶貝第106集 噴火龍·就決定是你了



[https://www.youtube.com/watch?v=4G\\_aoKiCDc4](https://www.youtube.com/watch?v=4G_aoKiCDc4)

# AI 訓練師



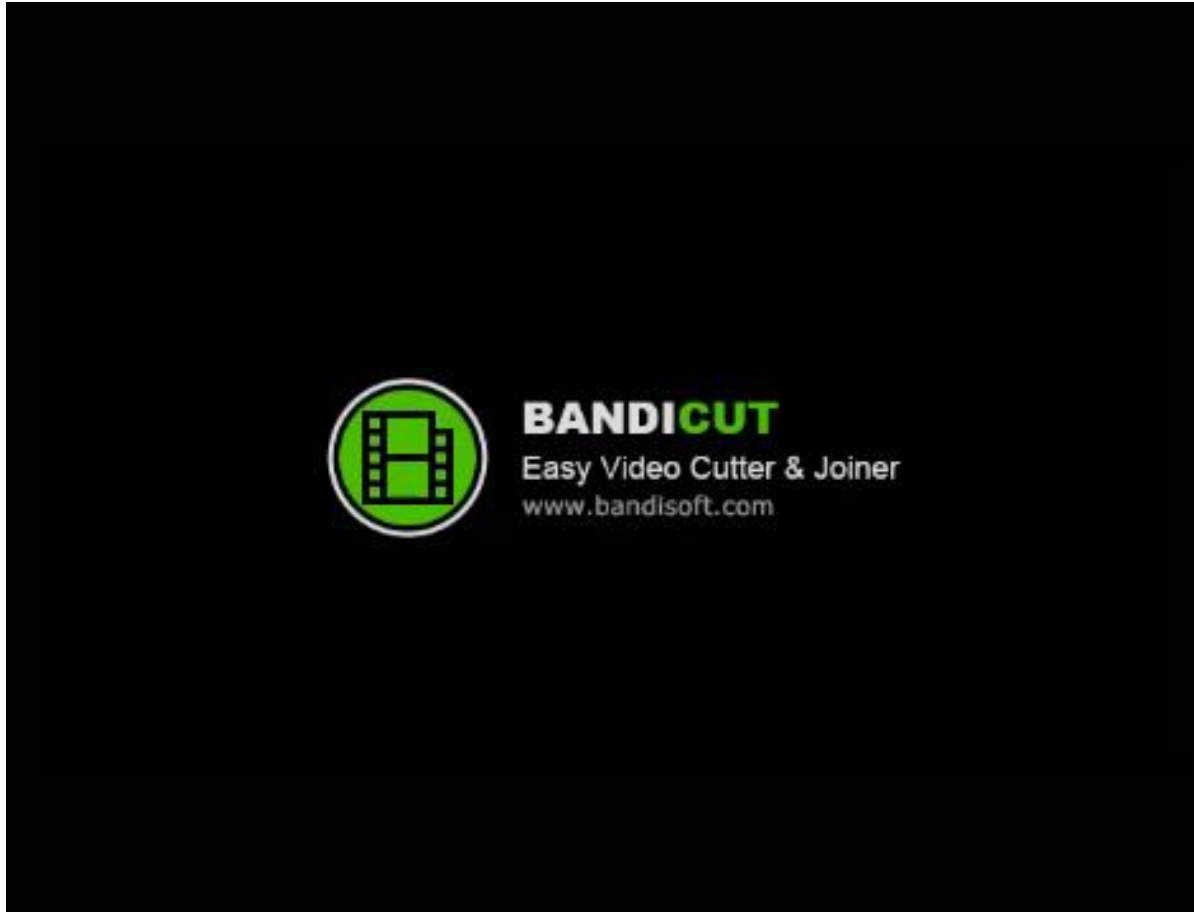
## 寶可夢訓練師

- 寶可夢訓練師要挑選適合的寶可夢來戰鬥
  - 寶可夢有不同的屬性
- 召喚出來的寶可夢不一定聽話
  - E.g. 小智的噴火龍
  - 需要有經驗的寶可夢訓練師

## AI 訓練師

- AI訓練師要挑選合適的 model, loss function
  - 不同 model, loss function 適合解決不同的問題
- 不一定能找出 best function
  - E.g. Deep Learning
  - 需要有經驗的 AI 訓練師

大家還記得寶可夢的開場嗎？



<https://www.youtube.com/watch?v=NyCNkq4ByzY>

# AI 訓練師

- 厲害的 AI ， AI 訓練師功不可沒
- 讓我們一起朝 AI 訓練師之路邁進

