

2019
怪兽
学堂

机器学习



汇报人：虾米

时间：2019年2月



目录

CONTENTS

1 / 机器学习的发展

2 / 机器学习的概念

3 / 机器学习的Learning map

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's

1960's

1970's

1980's

1990's

2000's

2010's

Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then

人工智能

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's

1960's

1970's

1980's

1990's

2000's

2010's

Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then

人工智能

目标

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's

1960's

1970's

1980's

1990's

2000's

2010's

Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then

人工智能

目标

机器学习

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's

1960's

1970's

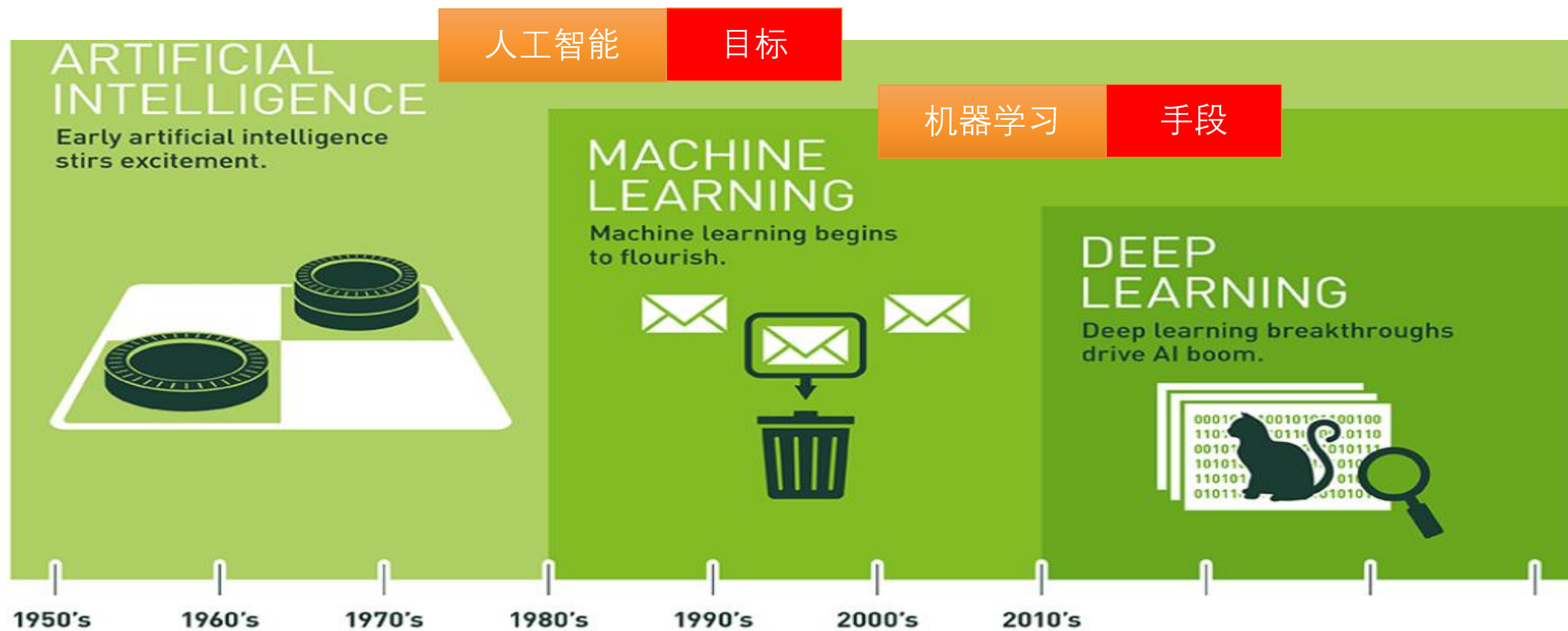
1980's

1990's

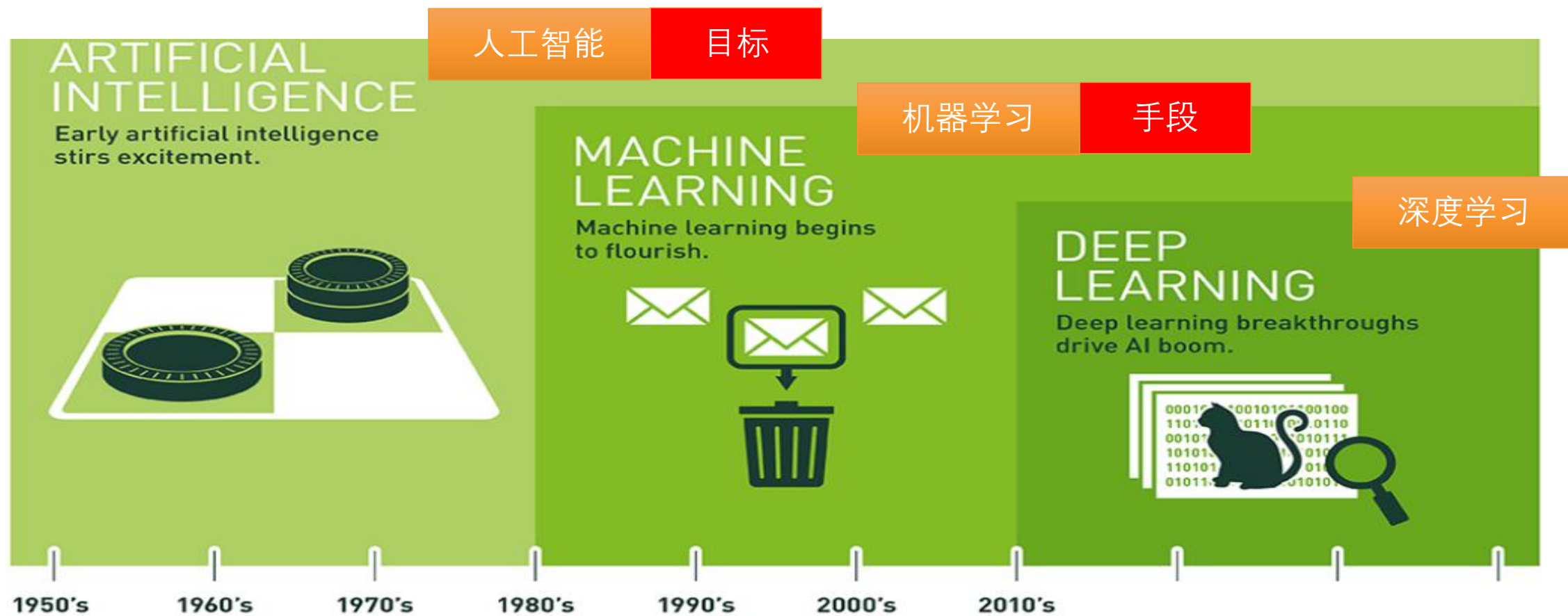
2000's

2010's

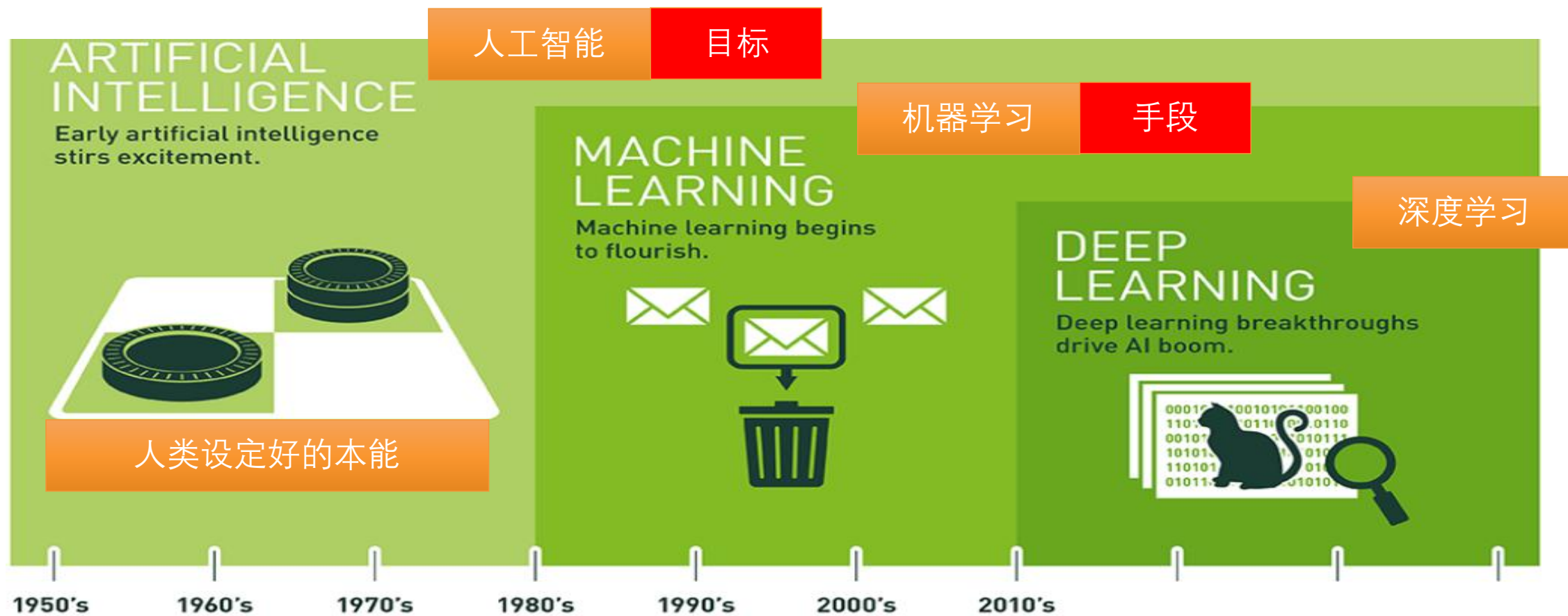
Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then



Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then



Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then

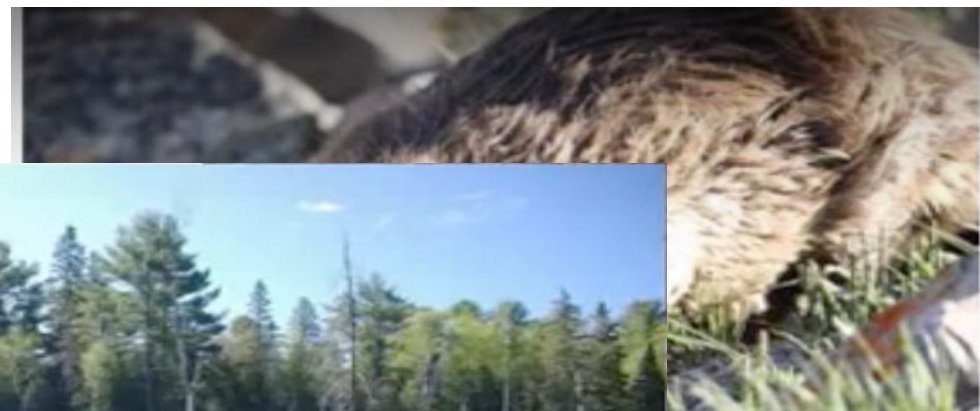


Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then

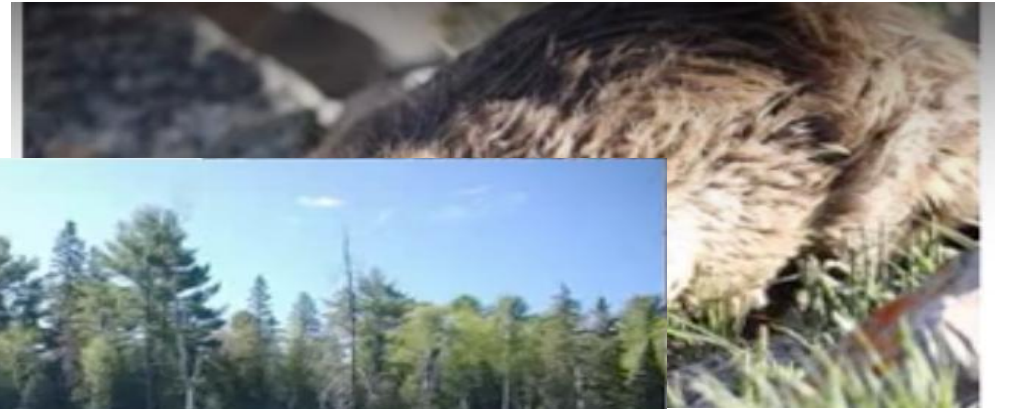
生物的本能



生物的本能

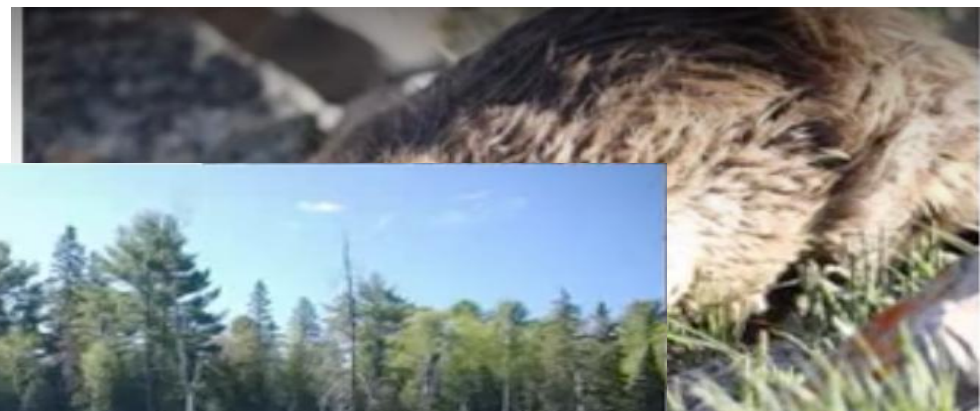


生物的本能



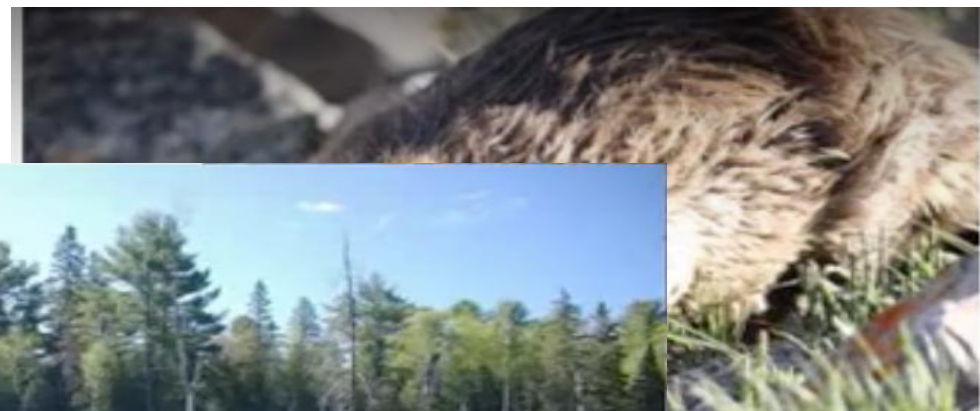
- 河狸筑水坝的能力是天生的
 - If “听到流水声”，筑堤坝直到听不到流水声

生物的本能



- 河狸筑水坝的能力是天生的
 - If “听到流水声”，筑堤坝直到听不到流水声
- 生物学家
 - 用扬声器播放流水声
 - 把扬声器放在墙上，河狸就会用泥巴和树枝把扬声器盖住

生物的本能



- 河狸筑水坝的能力是天生的
 - If “听到流水声”，筑堤坝直到听不到流水声
- 生物学家
 - 用扬声器播放流水声
 - 把扬声器放在墙上，河狸就会用泥巴和树枝把扬声器盖住
 - 如果把扬声器放在地上，河狸就会把他们盖住

人类设定好的本能

- E.g. You want to build a Chat-bot ...

人类设定好的本能

- E.g. You want to build a Chat-bot ...
 - If there is “turn off” in the input, then “turn off the music” (hand-crafted rules)

人类设定好的本能

- E.g. You want to build a Chat-bot ...
 - If there is “turn off” in the input, then “turn off the music” (hand-crafted rules)
 - You can say “Please turn off the music” or “Can you turn off the music?”. Smart?
 - What if someone says “Please don’t turn off the music”

人类设定好的本能

- E.g. You want to build a Chat-bot ...
 - If there is “turn off” in the input, then “turn off the music” (hand-crafted rules)
 - You can say “Please turn off the music” or “Can you turn off the music?”. Smart?
 - What if someone says “Please don’t turn off the music”
- Weakness of hand-crafted rules

人类设定好的本能

- E.g. You want to build a Chat-bot ...
 - If there is “turn off” in the input, then “turn off the music” (hand-crafted rules)
 - You can say “Please turn off the music” or “Can you turn off the music?”. Smart?
 - What if someone says “Please don’t turn off the music”
- Weakness of hand-crafted rules
 - Hard to consider all possibilities

人类设定好的本能

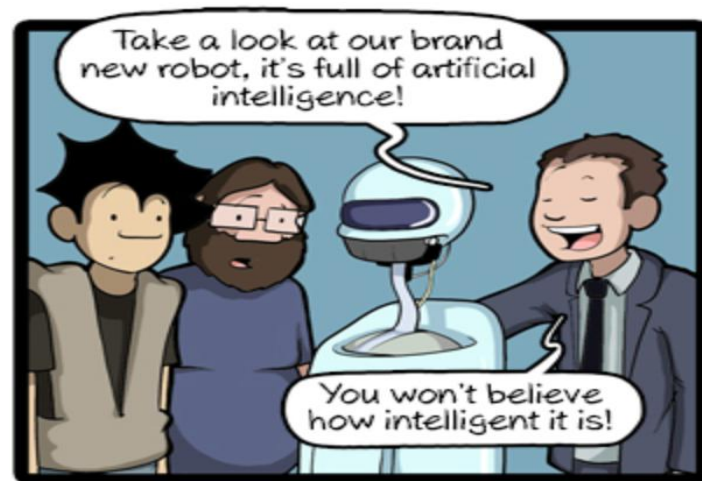
- E.g. You want to build a Chat-bot ...
 - If there is “turn off” in the input, then “turn off the music” (hand-crafted rules)
 - You can say “Please turn off the music” or “Can you turn off the music?”. Smart?
 - What if someone says “Please don’t turn off the music”
- Weakness of hand-crafted rules
 - Hard to consider all possibilities
 - 永远无法超越创造者

人类设定好的本能

- E.g. You want to build a Chat-bot ...
 - If there is “turn off” in the input, then “turn off the music” (hand-crafted rules)
 - You can say “Please turn off the music” or “Can you turn off the music?”. Smart?
 - What if someone says “Please don’t turn off the music”
- Weakness of hand-crafted rules
 - Hard to consider all possibilities
 - 永远无法超越创造者
 - Lots of human efforts (not suitable for small industry)

人类设定好的本能

- AI?

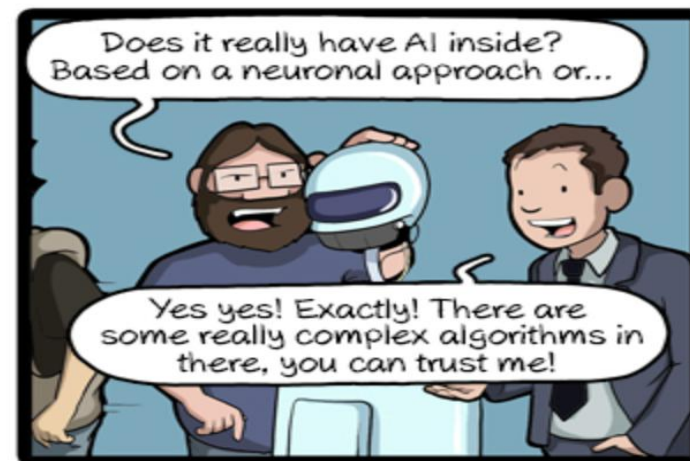
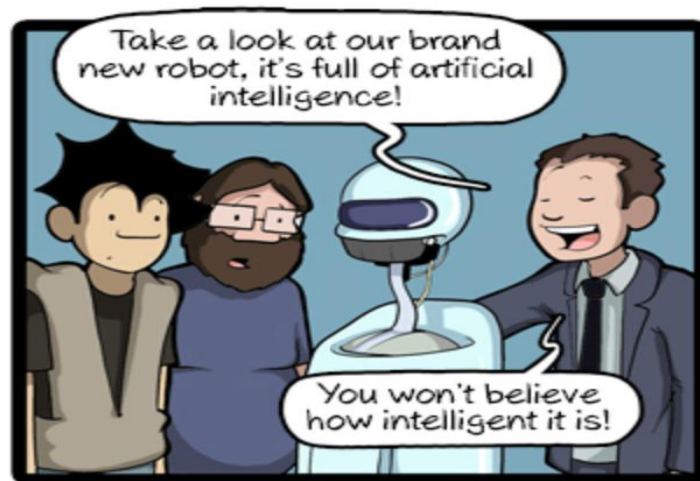


<http://www.commitstrip.com/en/2017/06/07/ai-inside/>

Shared on Yann LeCun's FB

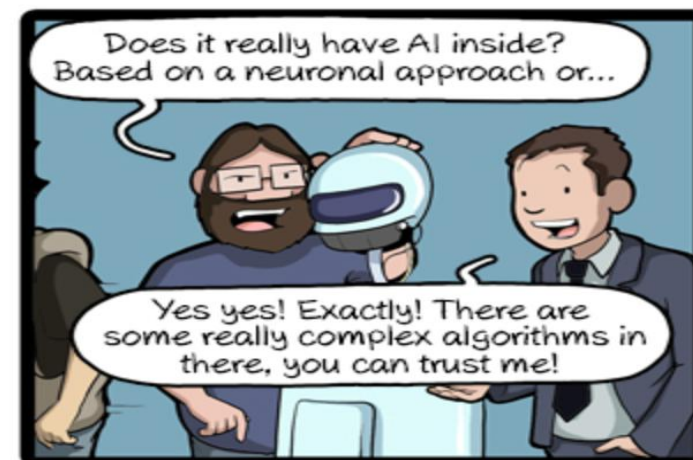
人类设定好的本能

- AI?



人类设定好的本能

- AI?

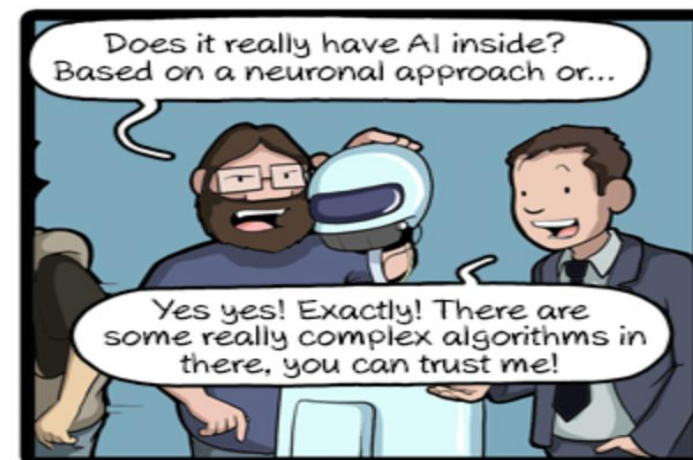


<http://www.commitstrip.com/en/2017/06/07/ai-inside/>

Shared on Yann LeCun's FB

人类设定好的本能

- AI?

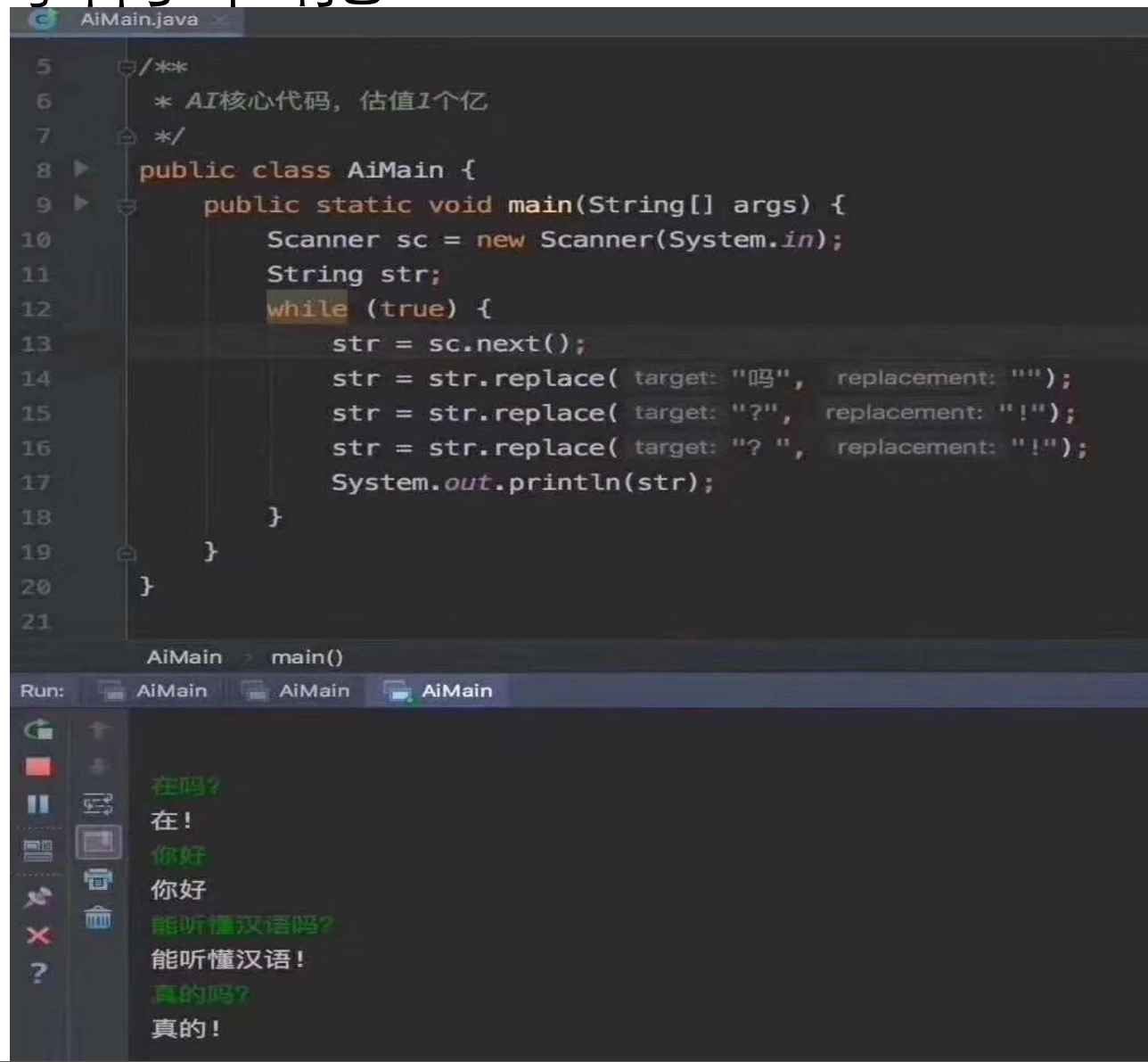


<http://www.commitstrip.com/en/2017/06/07/ai-inside/>

Shared on Yann LeCun's FB

人类设定好的本能

- AI?



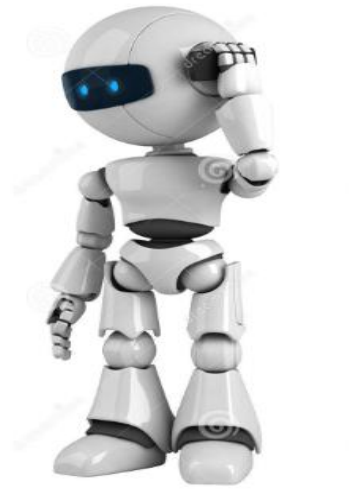
The screenshot shows an IDE with a Java file named `AiMain.java`. The code is as follows:

```
5  /**
6   * AI核心代码，估值1个亿
7   */
8  public class AiMain {
9      public static void main(String[] args) {
10         Scanner sc = new Scanner(System.in);
11         String str;
12         while (true) {
13             str = sc.next();
14             str = str.replace( target: "吗", replacement: "");
15             str = str.replace( target: "?", replacement: "!");
16             str = str.replace( target: "? ", replacement: "!");
17             System.out.println(str);
18         }
19     }
20 }
21
```

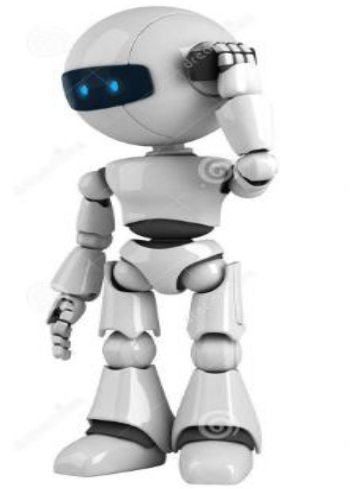
Below the code editor, the `Run` tab is active, showing the execution output:

```
在吗?
在!
你好
你好
能听懂汉语吗?
能听懂汉语!
真的吗?
真的!
```

What is Machine Learning?

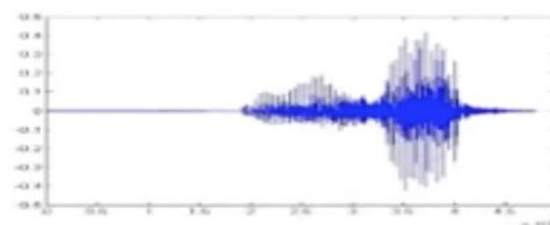
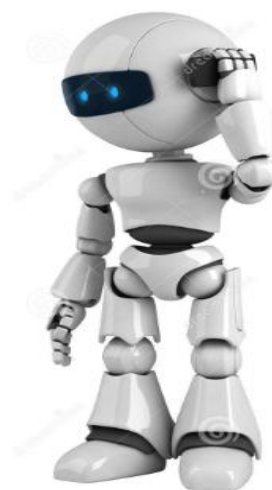


What is Machine Learning?



You write the program for learning.

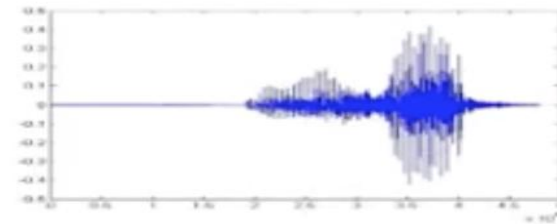
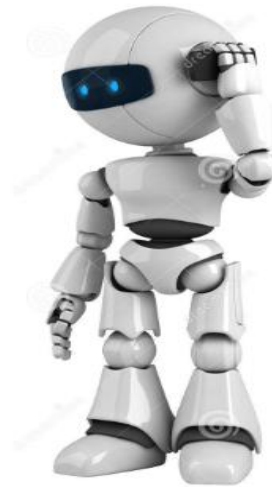
What is Machine Learning?



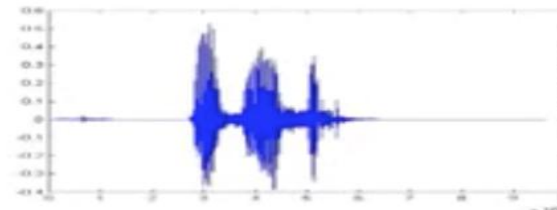
Hi

You write the program for learning.

What is Machine Learning?



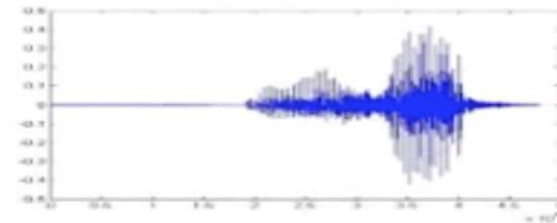
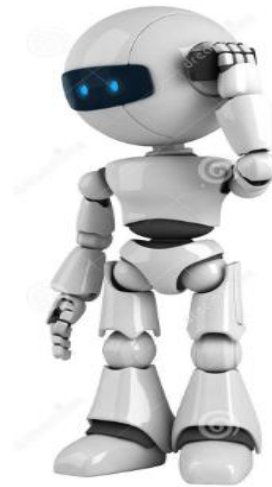
Hi



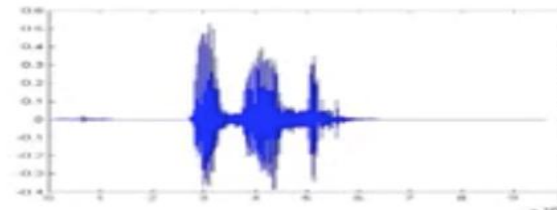
How are you

You write the program for learning.

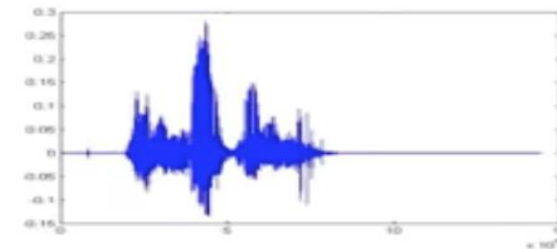
What is Machine Learning?



Hi



How are you

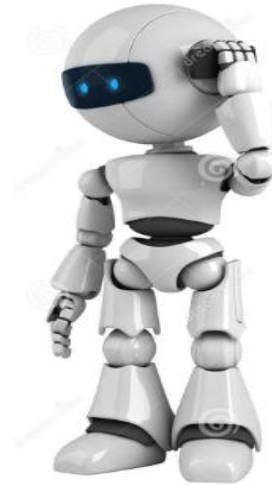


Good bye

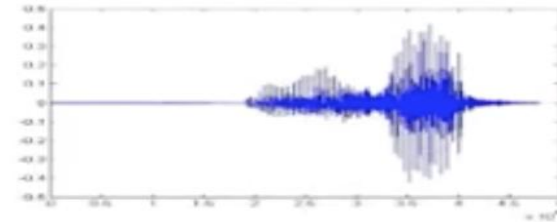
You write the program for learning.

What is Machine Learning?

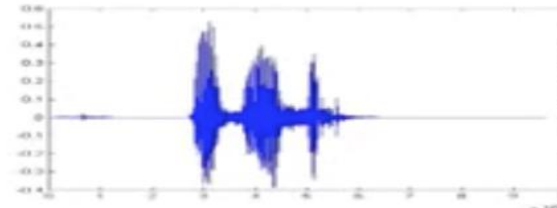
Learning...



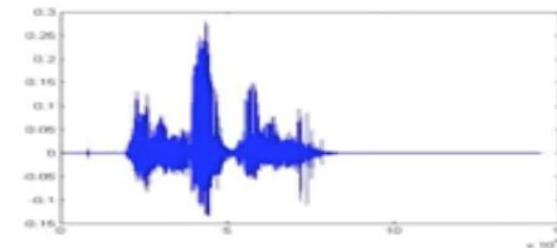
You write the program for learning.



Hi



How are you

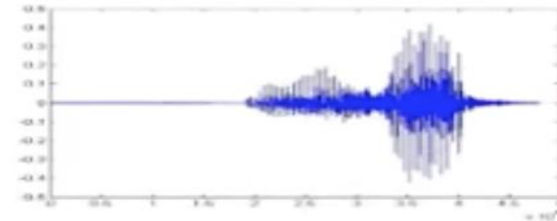
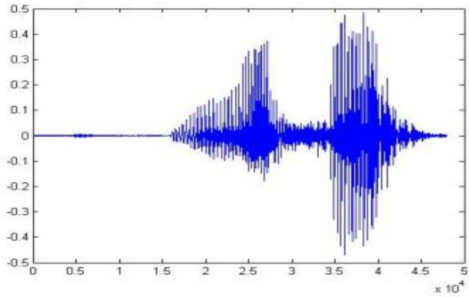
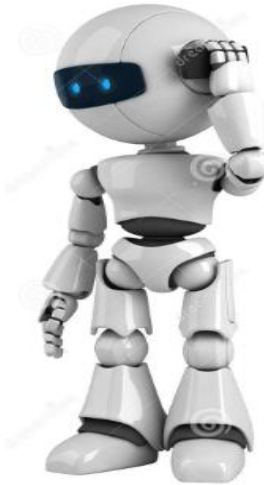


Good bye

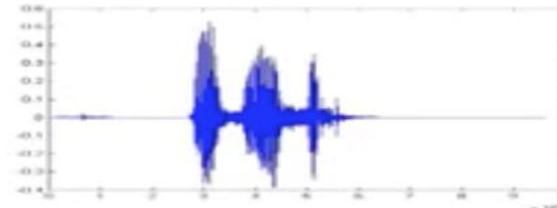
A large amount of audio data

What is Machine Learning?

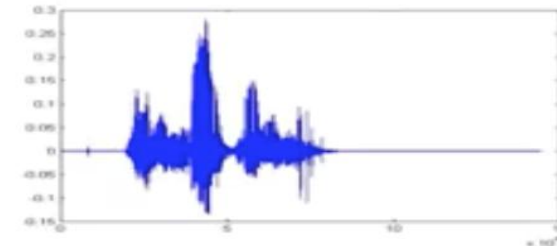
Learning...



Hi



How are you

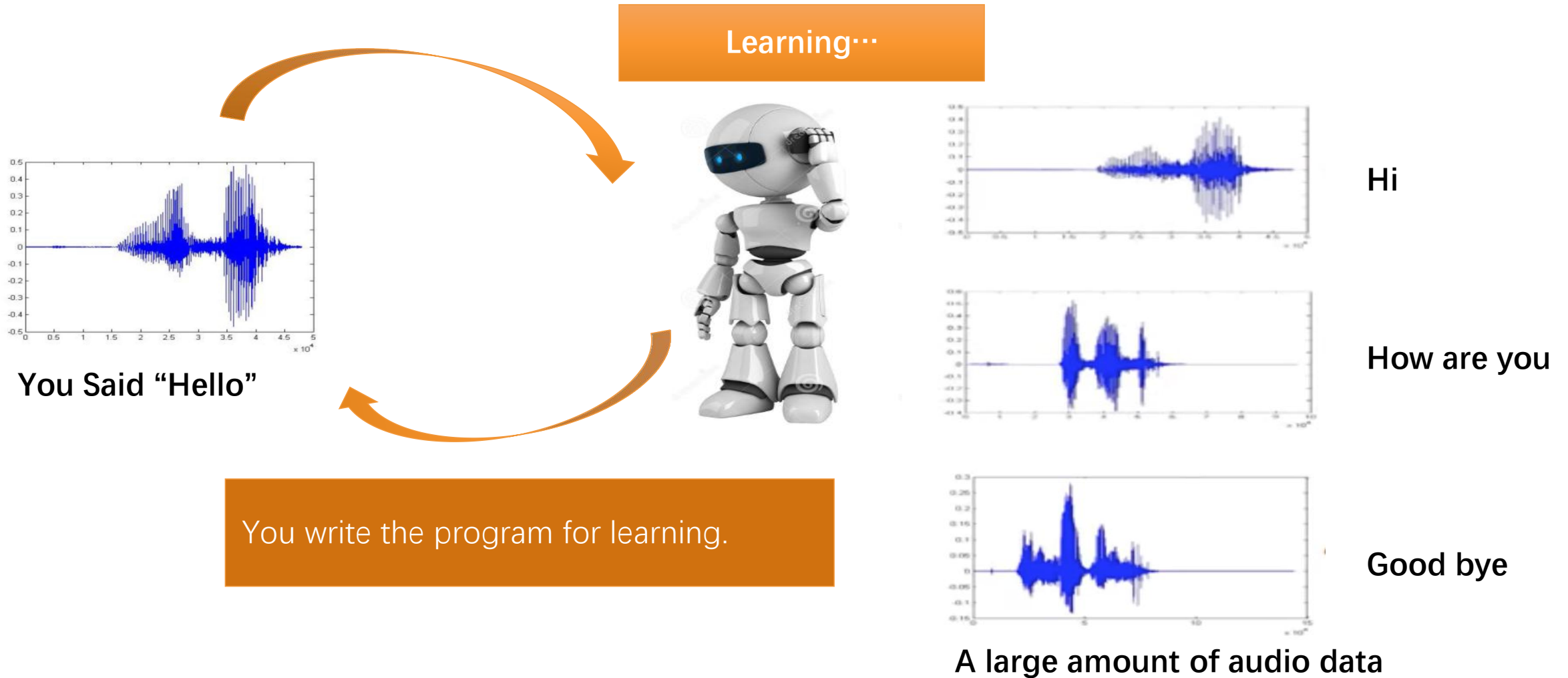


Good bye

You write the program for learning.

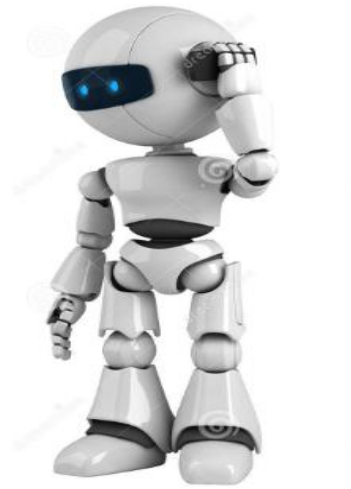
A large amount of audio data

What is Machine Learning?



What is Machine Learning?

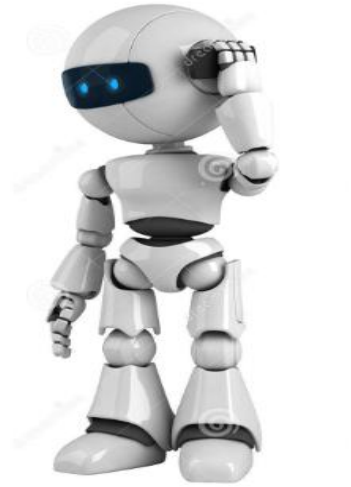
Learning...



You write the program for learning.

What is Machine Learning?

Learning...

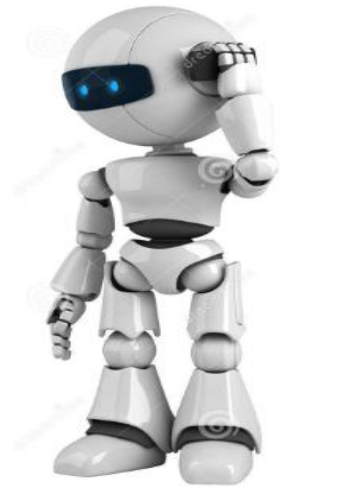


monkey

You write the program for learning.

What is Machine Learning?

Learning...



monkey

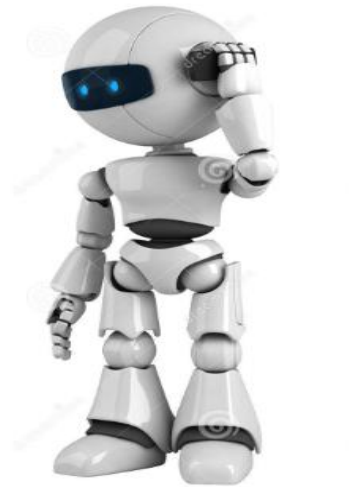


cat

You write the program for learning.

What is Machine Learning?

Learning...



You write the program for learning.



monkey



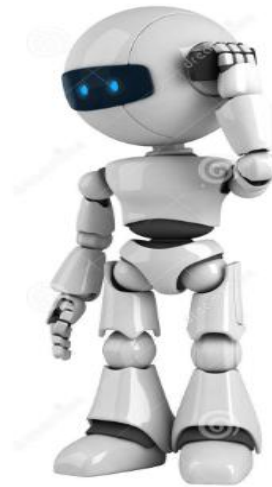
cat



dog

What is Machine Learning?

Learning...



You write the program for learning.



monkey



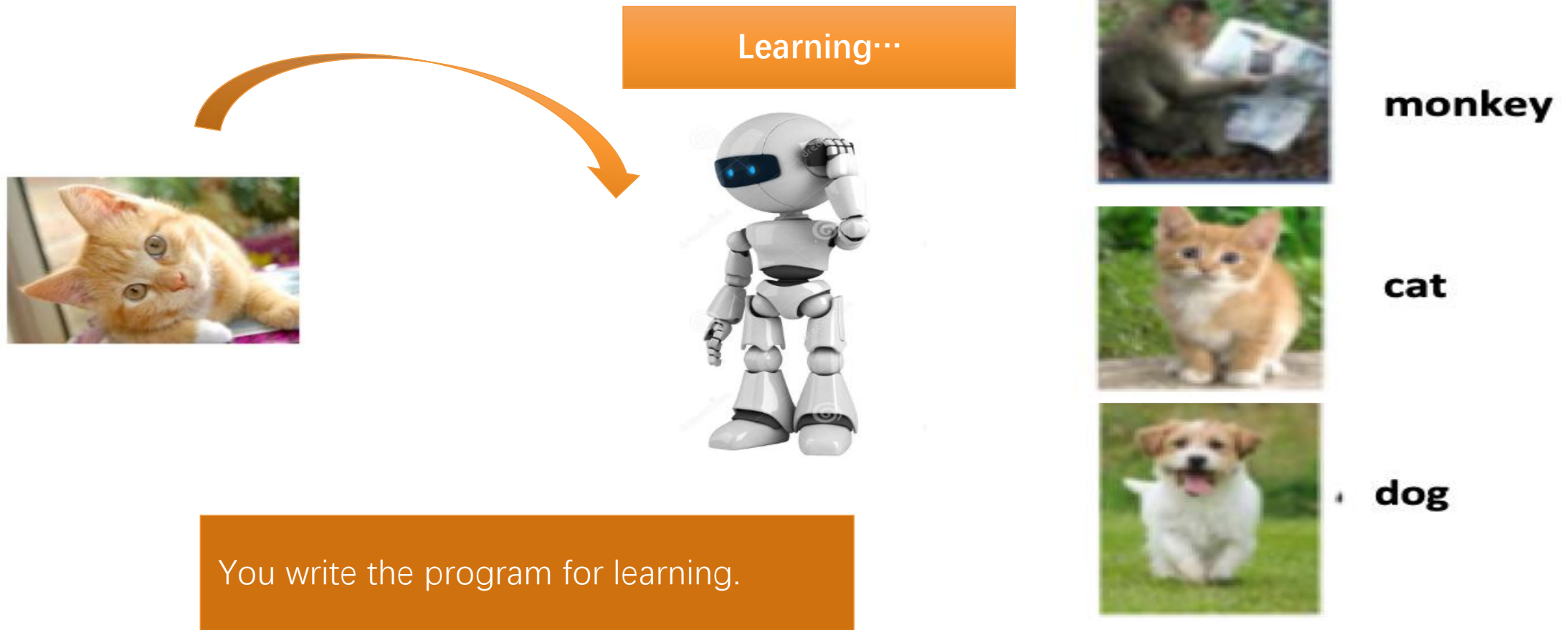
cat



dog

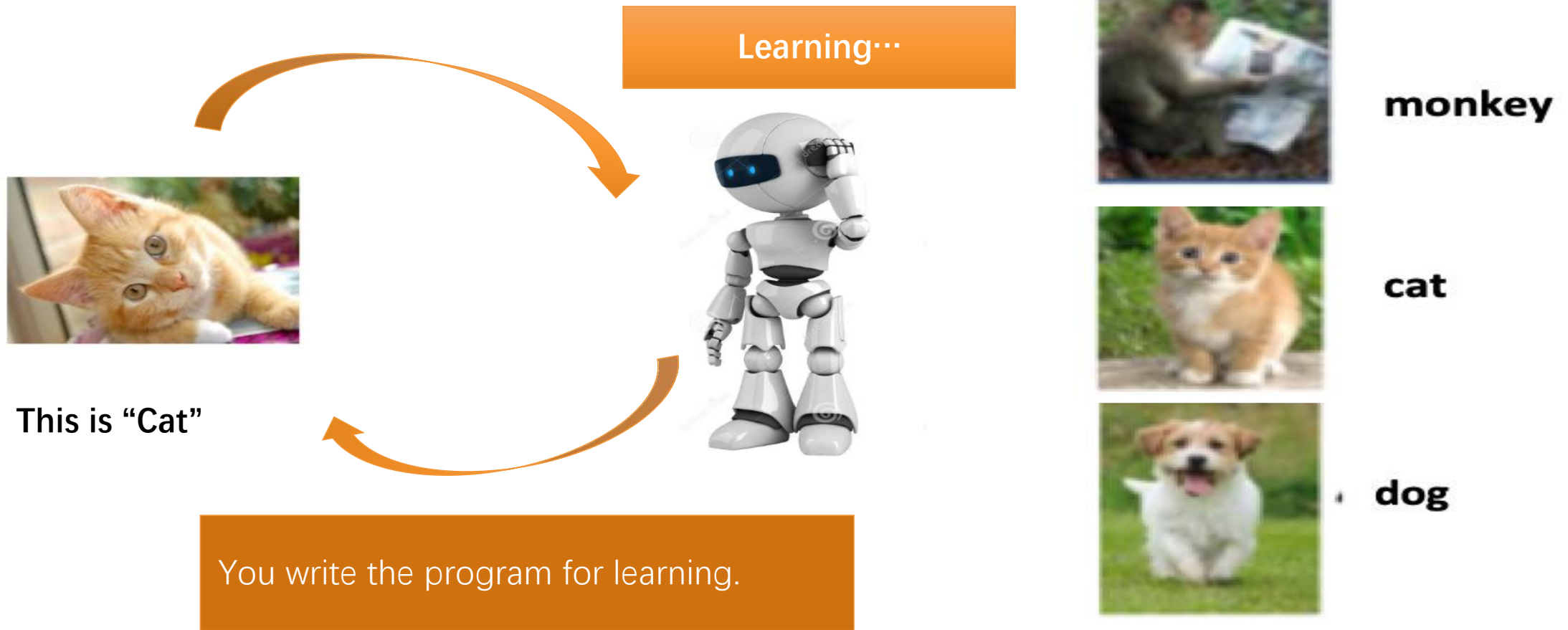
A large amount of images

What is Machine Learning?



A large amount of images

What is Machine Learning?



A large amount of images

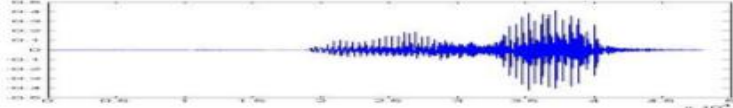
Machine Learning
 \approx Looking for a Function

From Data

Machine Learning \approx Looking for a Function

From Data

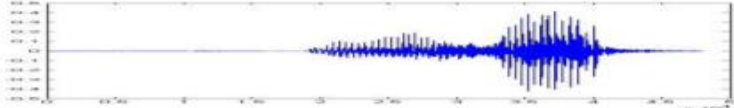
- Speech recognition

$$f(\text{ ) = \text{“How are you”}$$


Machine Learning \approx Looking for a Function

From Data

- Speech recognition

$$f(\text{ ) = \text{"How are you"}$$

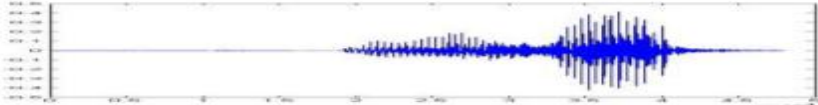
- Image recognition

$$f(\text{ ) = \text{"Cat"}$$

Machine Learning ≈ Looking for a Function

From Data

- Speech recognition

$$f(\text{  }) = \text{“How are you”}$$

- Image recognition

$$f(\text{  }) = \text{“Cat”}$$

- Play Go

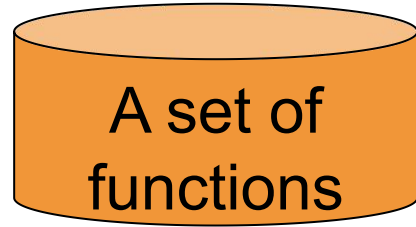
$$f(\text{  }) = \text{“5-5” (next move)}$$

Framework

Image Recognition:

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

Framework



$f_1, f_2 \dots$

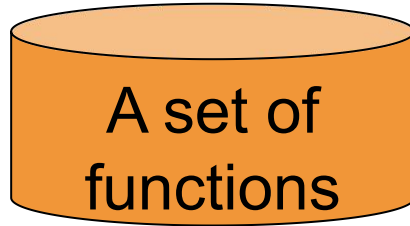
Image Recognition:

$$f(\text{img}) = \text{"cat"}$$
A small, square image of a ginger cat with white markings, looking towards the camera.

Framework

Image Recognition:

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



$f_1, f_2 \dots$

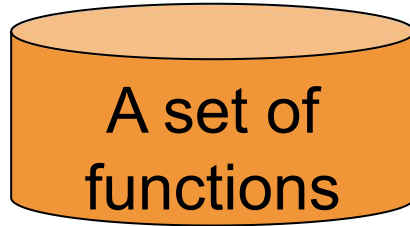
$$f_1(\text{img}) = \text{"cat"}$$

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

Framework

Image Recognition:

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



$f_1, f_2 \dots$

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

$$f_2(\text{img}) = \text{"money"}$$

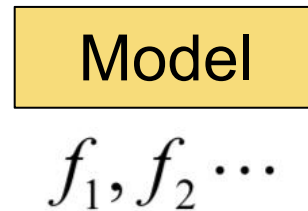
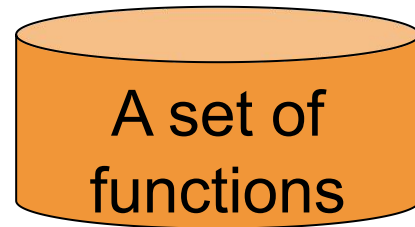
$$f_1(\text{img}) = \text{"dog"}$$

$$f_2(\text{img}) = \text{"snake"}$$

Framework

Image Recognition:

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



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

$$f_2(\text{img}) = \text{"money"}$$

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

$$f_2(\text{img}) = \text{"snake"}$$

Framework

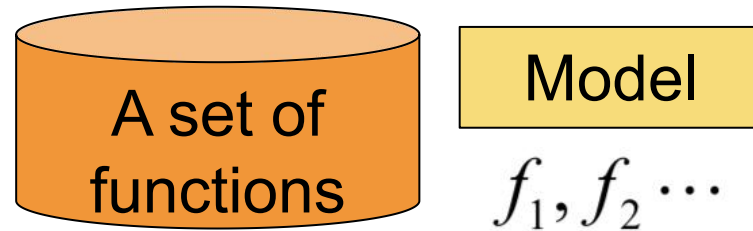


Image Recognition:

$$f(\text{img_cat}) = \text{"cat"}$$

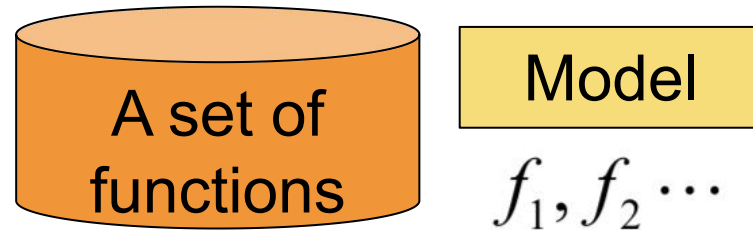
$$f_1(\text{img_cat1}) = \text{"cat"}$$

$$f_2(\text{img_cat2}) = \text{"money"}$$

$$f_1(\text{img_dog}) = \text{"dog"}$$

$$f_2(\text{img_dog}) = \text{"snake"}$$

Framework



Function input:

Function output:

Image Recognition:

$$f(\text{img_cat}) = \text{"cat"}$$

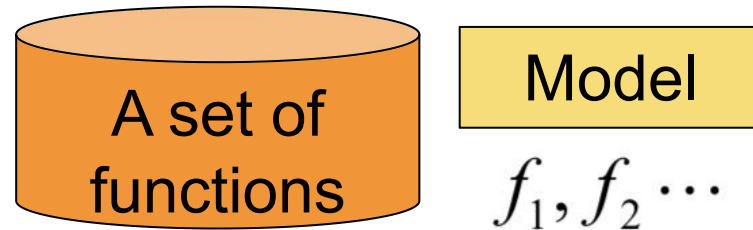
$$f_1(\text{img_cat1}) = \text{"cat"}$$

$$f_2(\text{img_cat2}) = \text{"money"}$$

$$f_1(\text{img_dog}) = \text{"dog"}$$

$$f_2(\text{img_dog}) = \text{"snake"}$$

Framework



Function input:

Function output:

Image Recognition:

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

$$f_1(\text{image of cat}) = \text{"cat"}$$

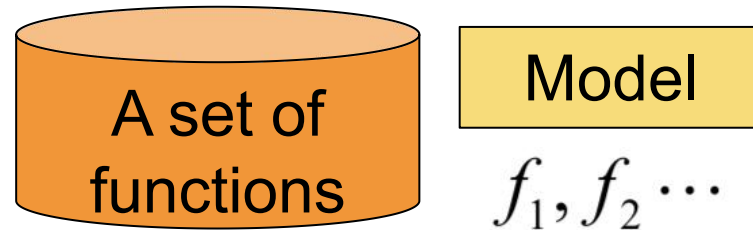
$$f_2(\text{image of cat}) = \text{"money"}$$

$$f_1(\text{image of dog}) = \text{"dog"}$$

$$f_2(\text{image of dog}) = \text{"snake"}$$

$$\text{image of dog} = \text{"dog"}$$

Framework



Function input:

Function output:

Image Recognition:

$$f(\text{img_cat}) = \text{"cat"}$$

$$f_1(\text{img_cat1}) = \text{"cat"}$$

$$f_2(\text{img_cat2}) = \text{"money"}$$

$$f_1(\text{img_dog}) = \text{"dog"}$$

$$f_2(\text{img_dog}) = \text{"snake"}$$

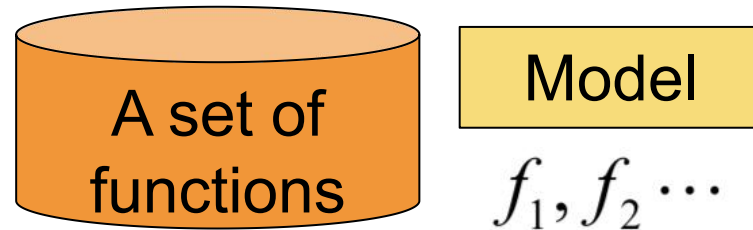


"dog"



"cat"

Framework



Function input:

Function output:

Image Recognition:

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

$$f_1(\text{image of a cat}) = \text{"cat"}$$

$$f_2(\text{image of a cat}) = \text{"money"}$$

$$f_1(\text{image of a dog}) = \text{"dog"}$$

$$f_2(\text{image of a dog}) = \text{"snake"}$$



"dog"



"cat"



"monkey"

Framework

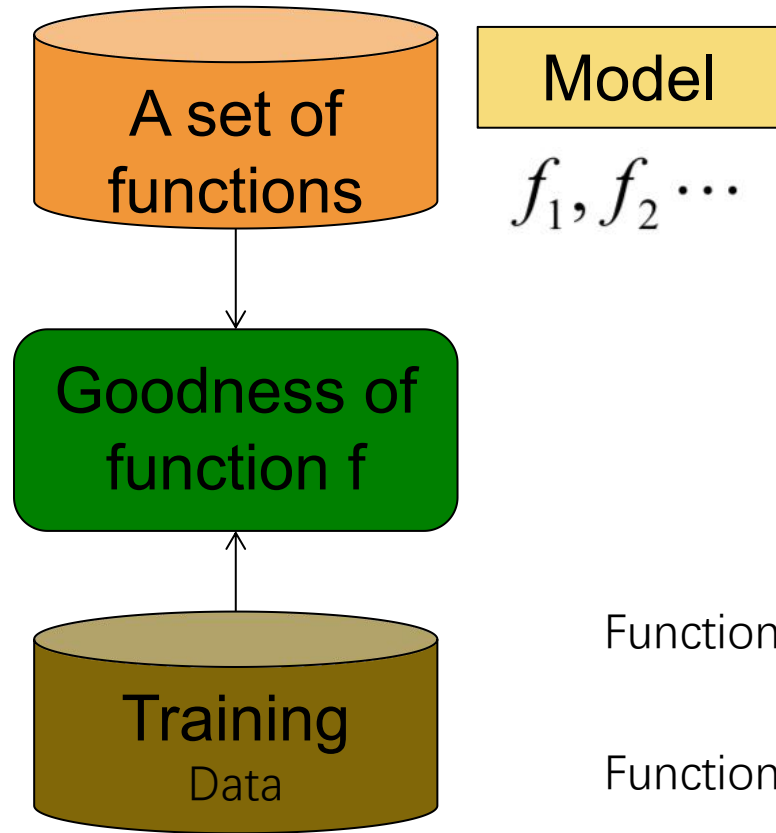


Image Recognition:

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

$$f_1(\text{image of a cat}) = \text{"cat"}$$

$$f_2(\text{image of a cat}) = \text{"money"}$$

$$f_1(\text{image of a dog}) = \text{"dog"}$$

$$f_2(\text{image of a dog}) = \text{"snake"}$$

Function input:

Function output:



"dog"

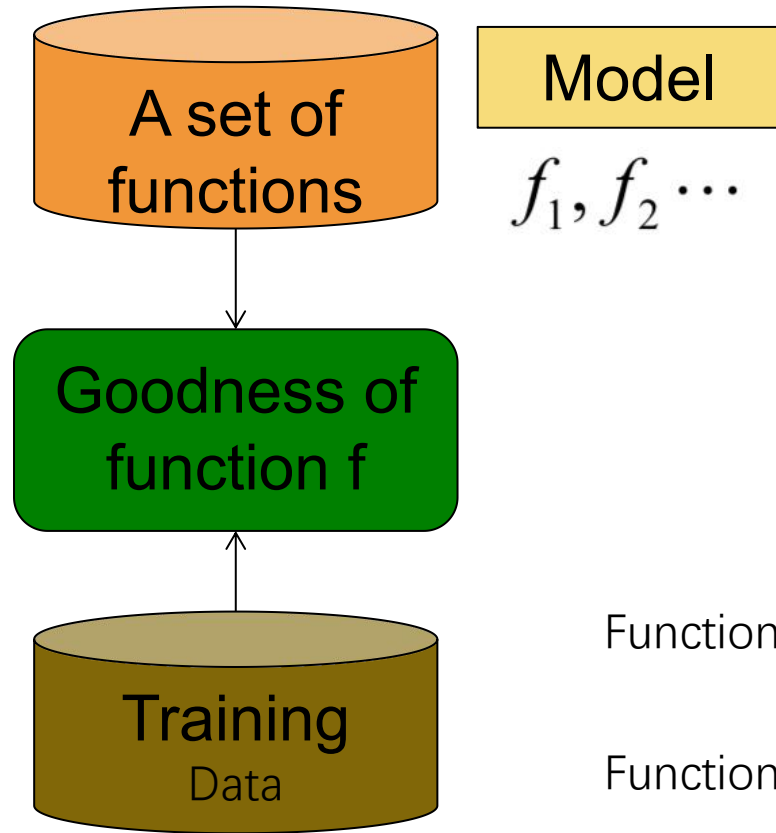


"cat"



"monkey"

Framework



Model
 $f_1, f_2 \dots$

Image Recognition:

$$f(\text{img_cat}) = \text{"cat"}$$

$$f_1(\text{img_cat}) = \text{"cat"}$$

$$f_2(\text{img_cat}) = \text{"money"}$$

$$f_1(\text{img_dog}) = \text{"dog"}$$

$$f_2(\text{img_dog}) = \text{"snake"}$$



"dog"



"cat"



"monkey"

Function input:

Function output:

Better!

Framework

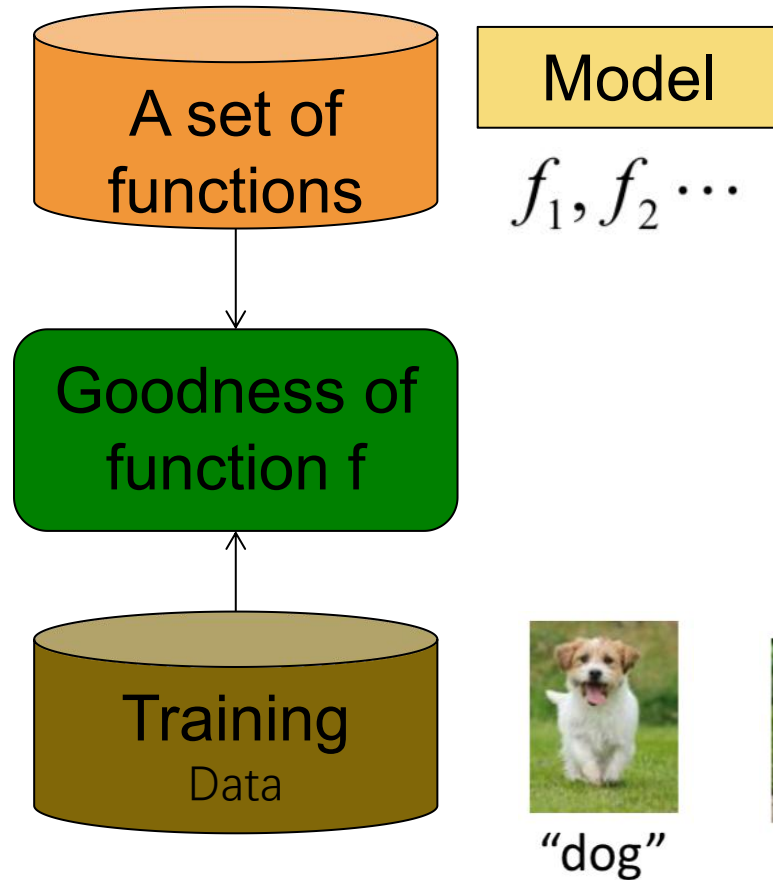


Image Recognition:

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

$$f_1(\text{image of a cat}) = \text{"cat"}$$
$$f_1(\text{image of a dog}) = \text{"dog"}$$

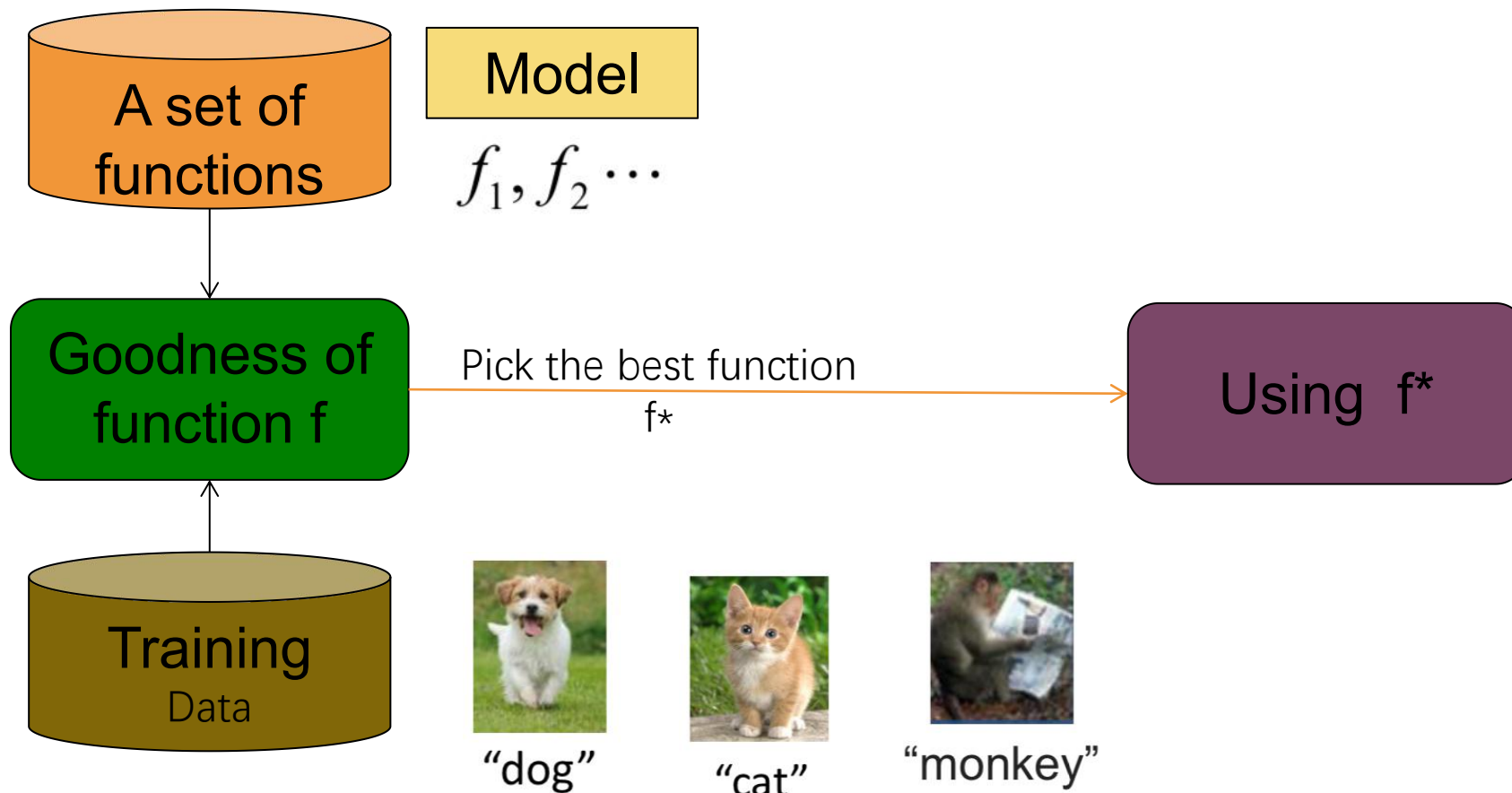
$$f_2(\text{image of a cat}) = \text{"money"}$$
$$f_2(\text{image of a dog}) = \text{"snake"}$$

Better!

Framework

Image Recognition:

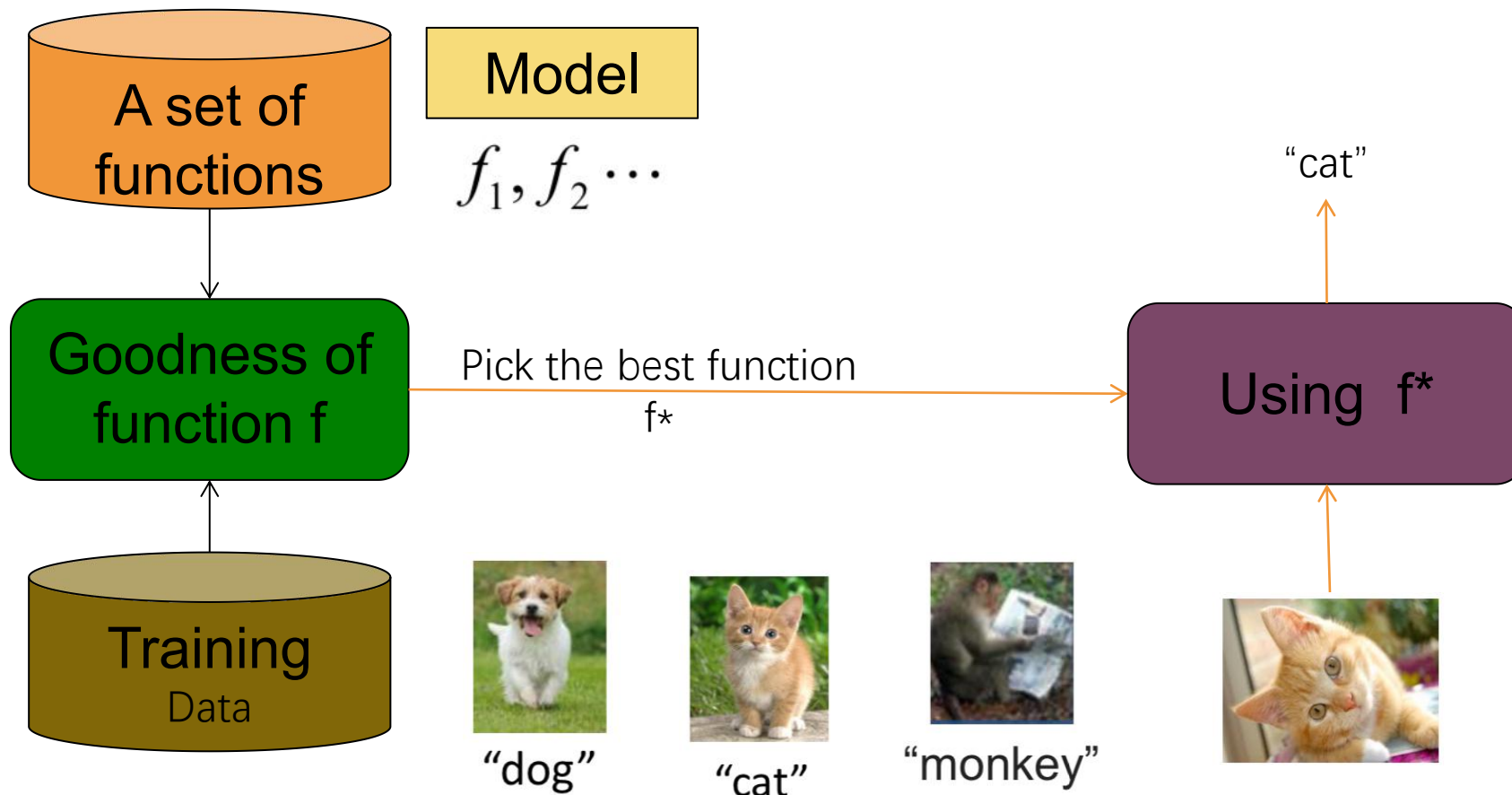
$$f(\text{img_cat}) = \text{"cat"}$$



Framework

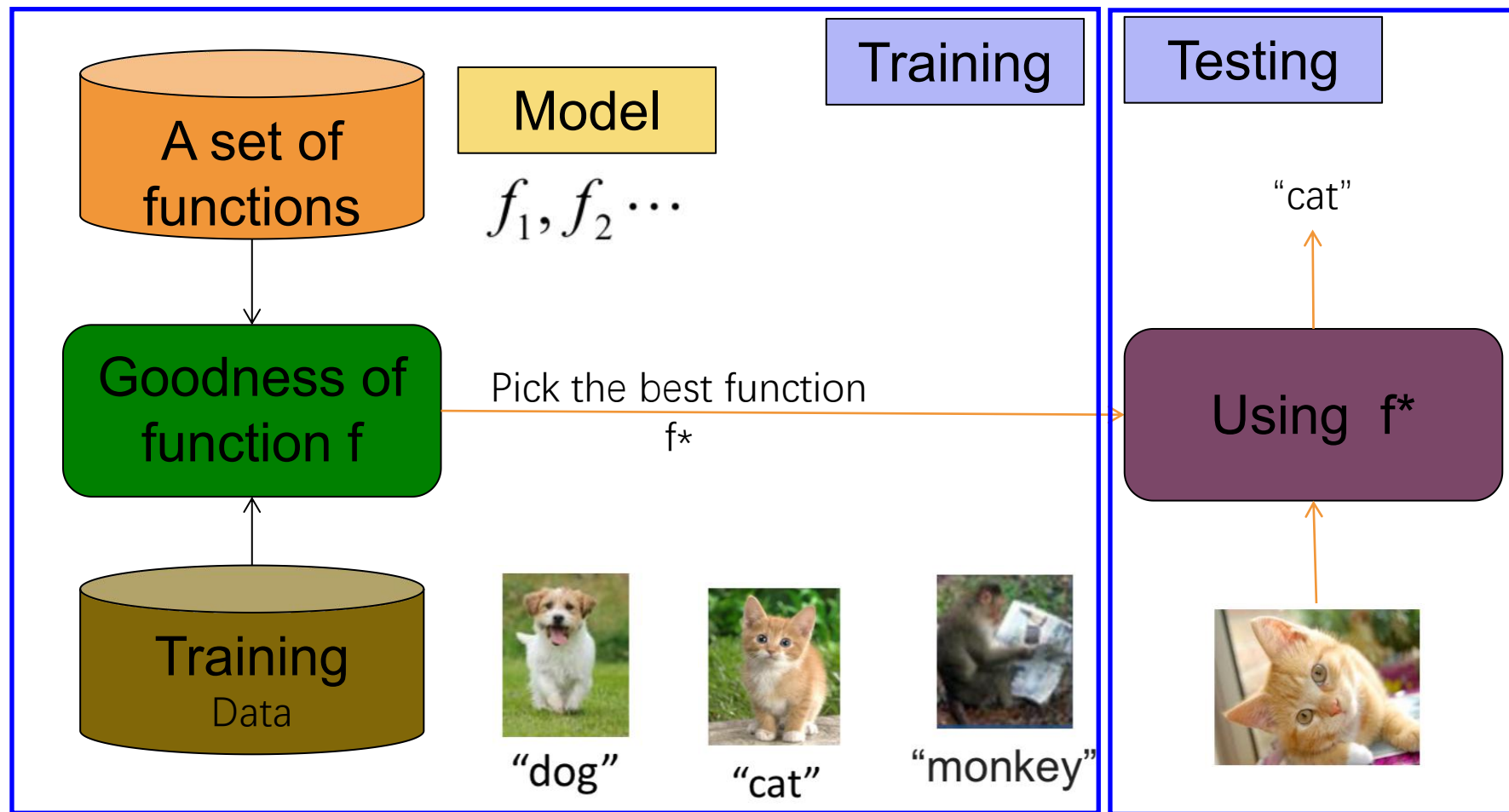
Image Recognition:

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



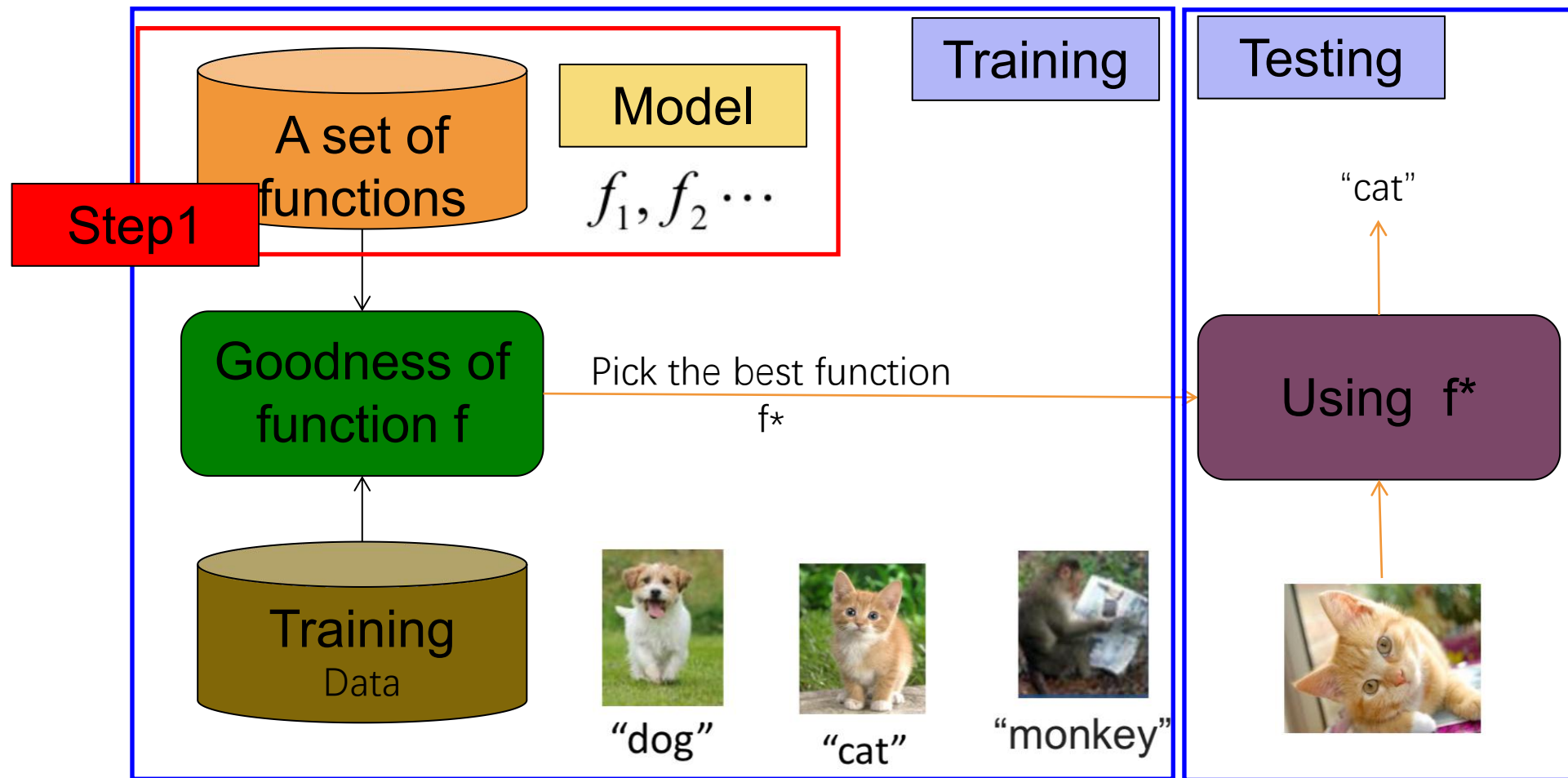
$$f(\text{image of a cat}) = \text{"cat"}$$

Framework



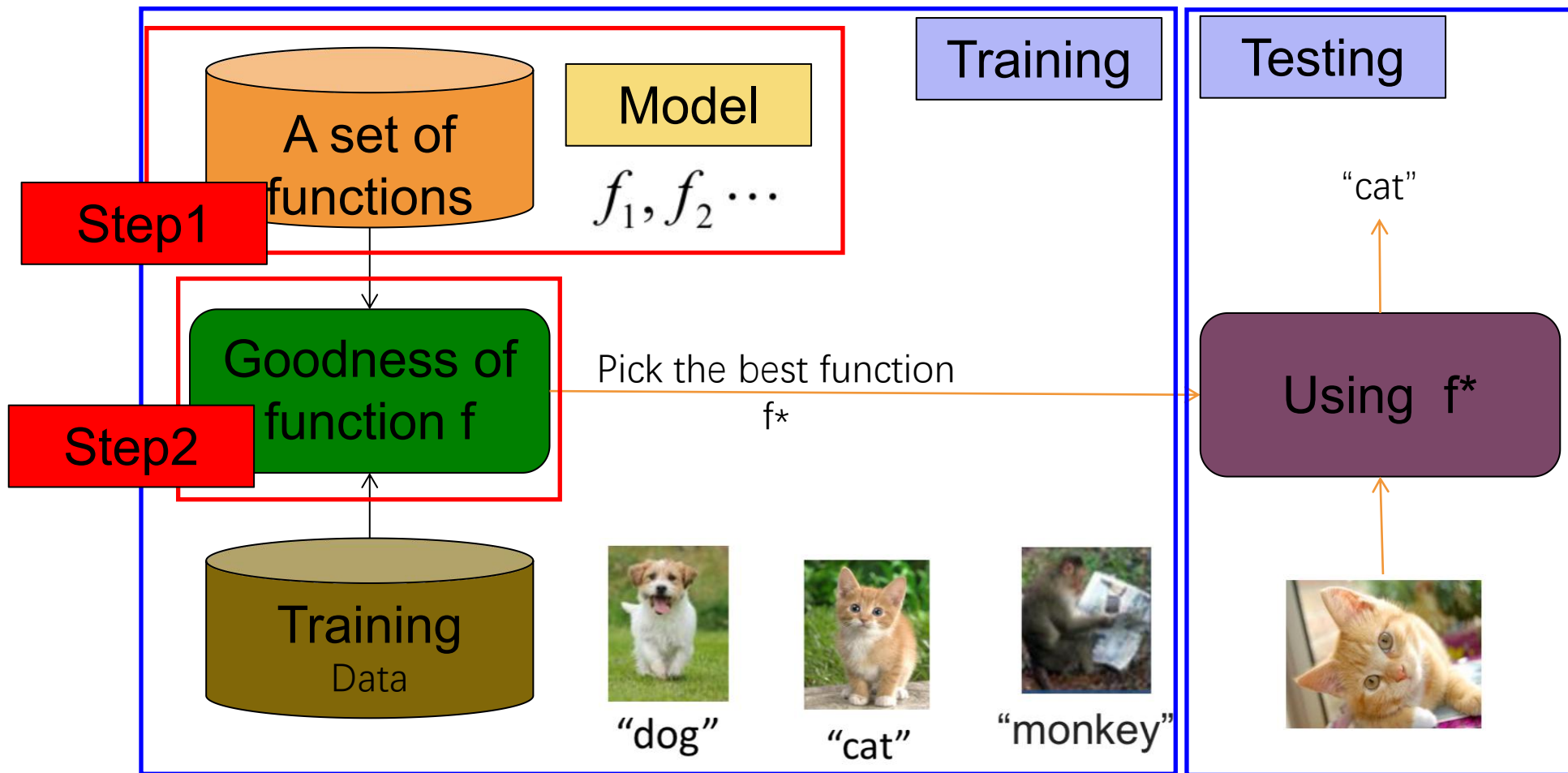
$$f(\text{image of a cat}) = \text{"cat"}$$

Framework



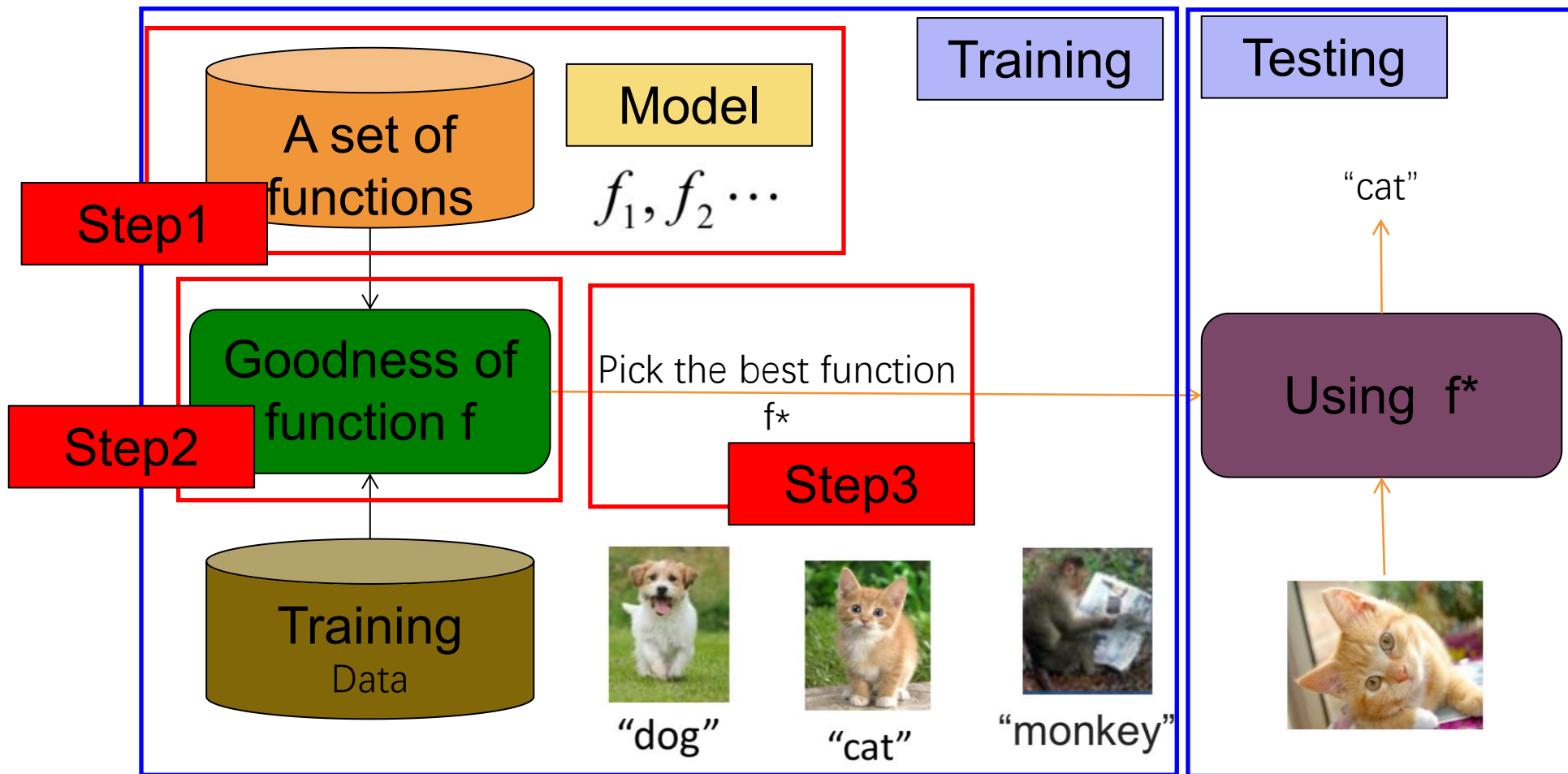
$$f(\text{Image of a cat}) = \text{"cat"}$$

Framework



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

Framework



Machine learning is so simple ...

Step 1:
Define a set of
function

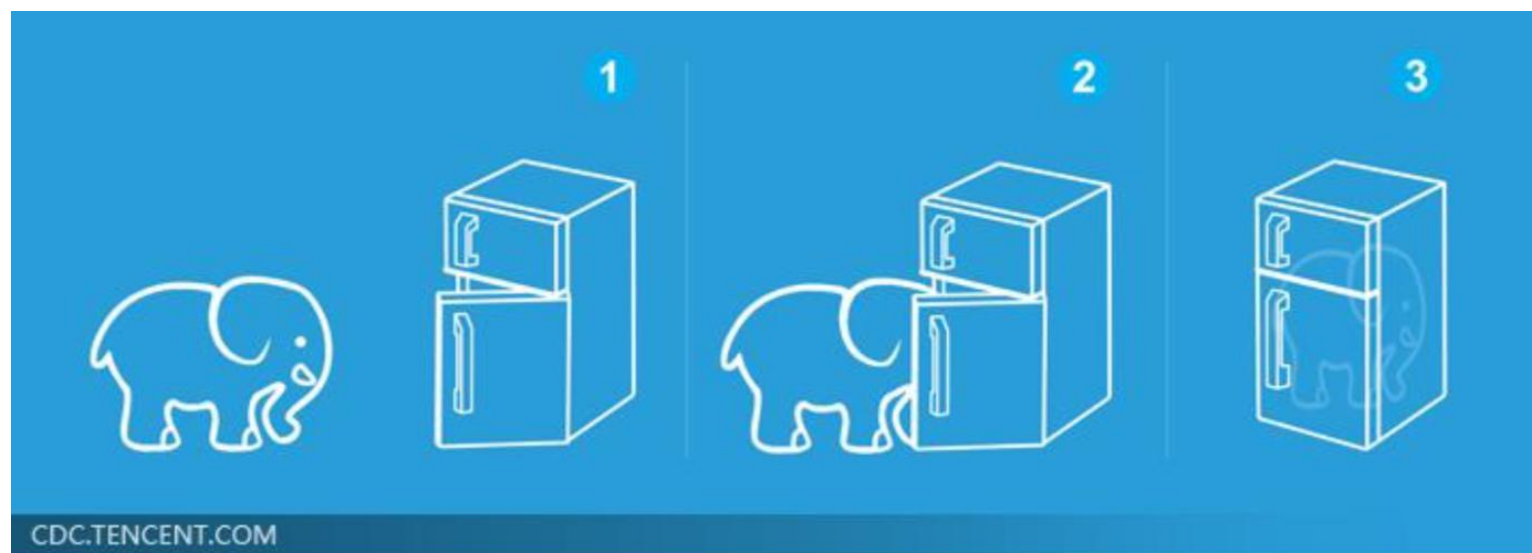


Step 2:
Goodness of
function

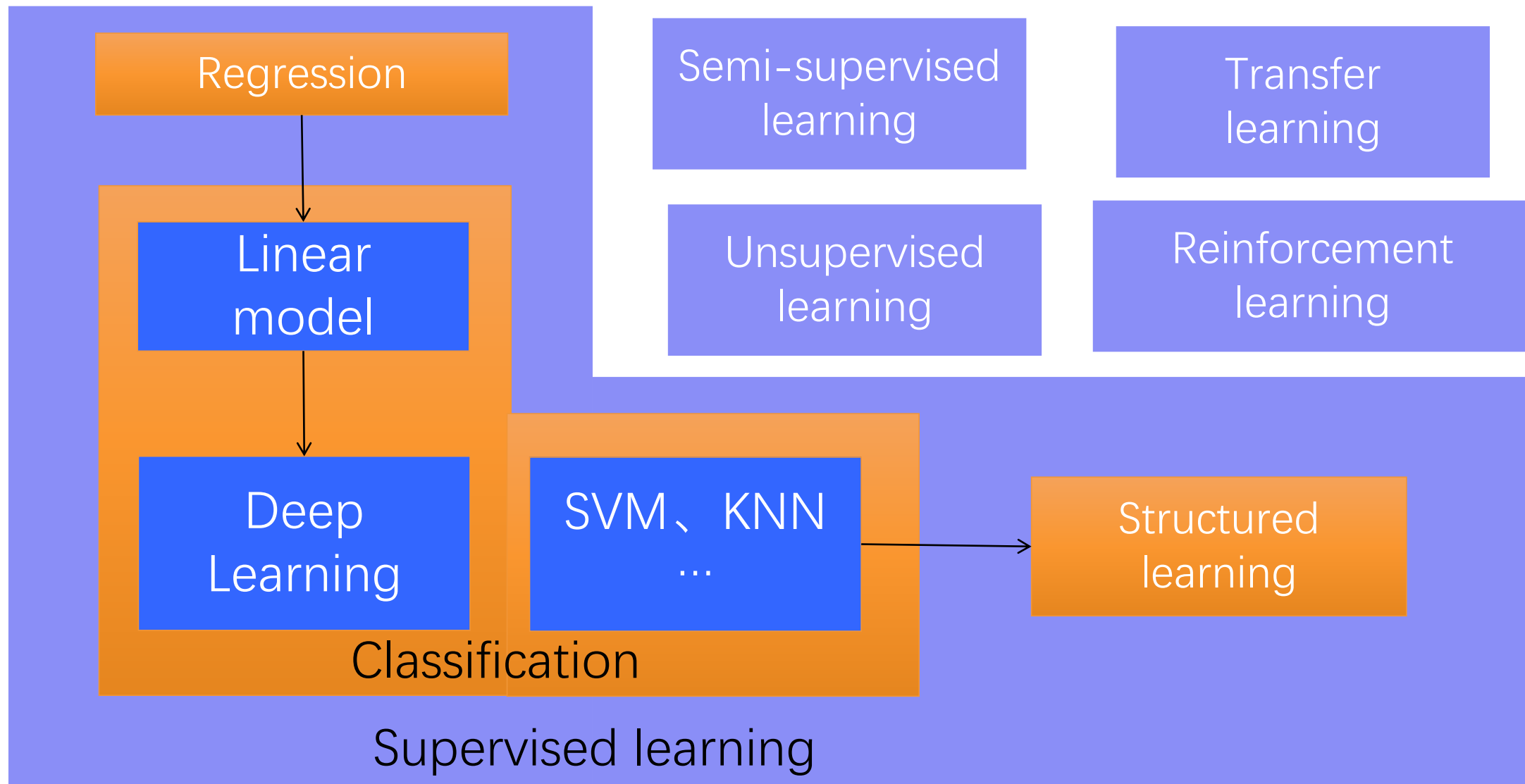


Step 3:
Pick the best
function

就好像把大象装进冰箱……



Learning map

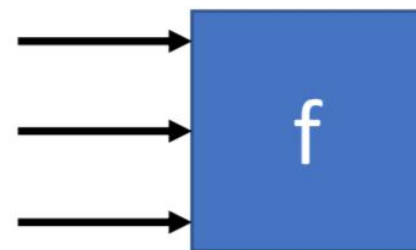


Regression

The output of target function f is
'scalar'

预测
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

Output:

9/03 上午 PM2.5 = 100

Input:

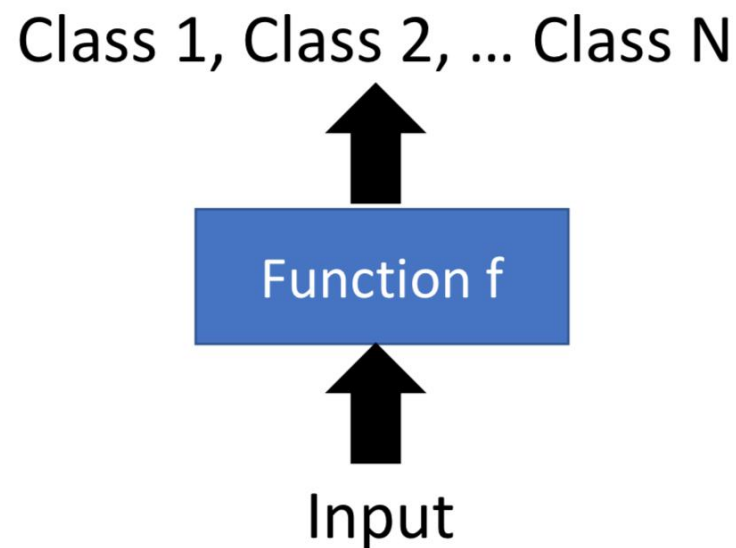
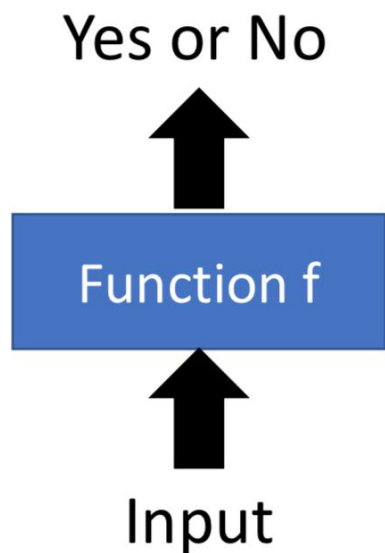
9/12 上午 PM2.5 = 30 9/13 上午 PM2.5 = 25

Output:

9/14 上午 PM2.5 = 20

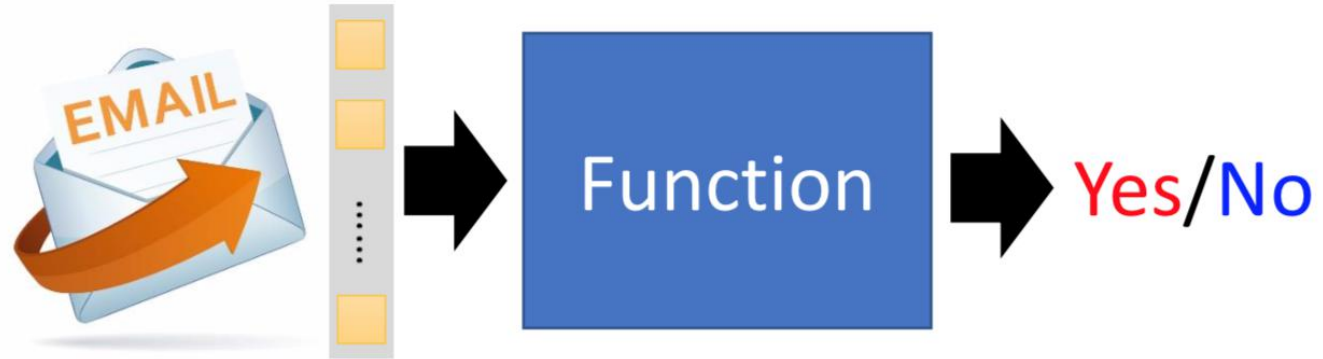
Classification

- Binary classification
- Multi-class classification



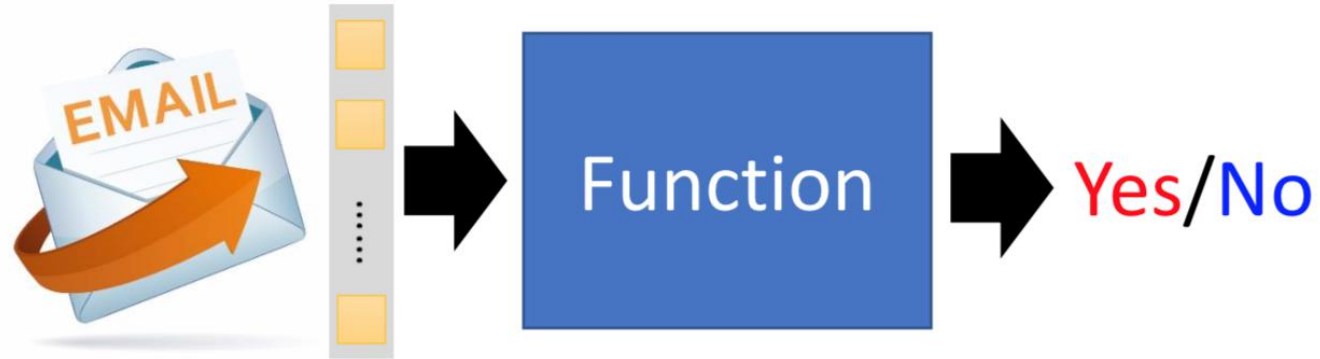
Binary classification

*Spam
Filtering*



Binary classification

*Spam
Filtering*



*training
data*



Multi-class classification

*document
classification*



Function



→ 政治

→ 新闻

→ 财经

Multi-class classification

*document
classification*



Function



→ 政治

→ 新闻

→ 财经

Training data



政治



新闻



财经

Classification: Deep Learning

*image
classification*



Function



→ monkey

→ dog

→ cat

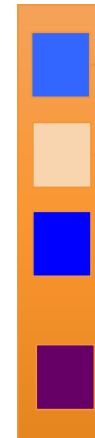
Each possible
object is a class

Classification: Deep Learning

*image
classification*



Hierarchical Structure



→ monkey

→ dog

→ cat

Each possible
object is a class

Classification: Deep Learning

*image
classification*



Hierarchical Structure



Each possible
object is a class



→ monkey

→ dog

→ cat

Training Data



"monkey"



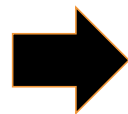
"cat"



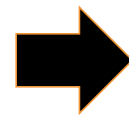
"dog"

Classification: Deep Learning

Play Go



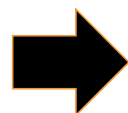
Function



Next move
Each position is
one class (19x19)

Classification: Deep Learning

Play Go

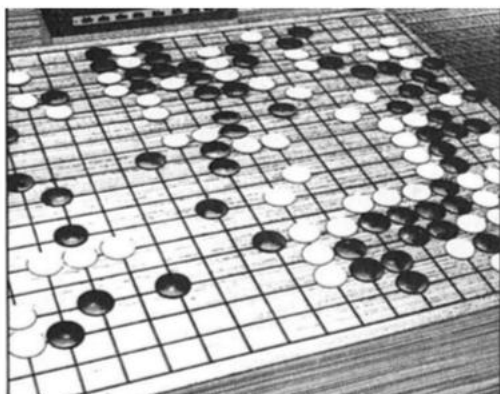


Function



Next move
Each position is
one class (19x19)

Training data



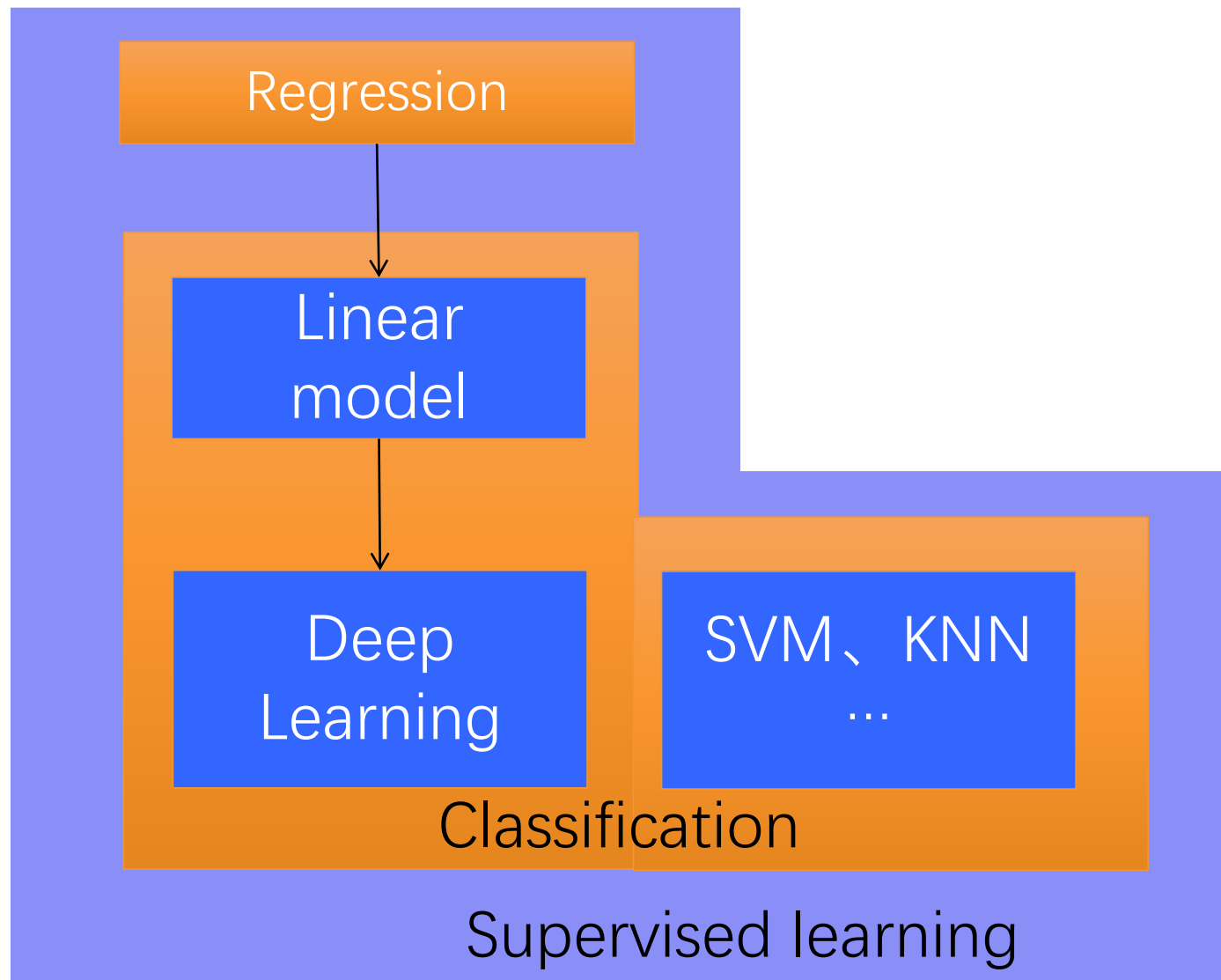
一堆棋谱

进藤光VS春

黑: 5之五 → 白: 天元 → 黑: 五之5



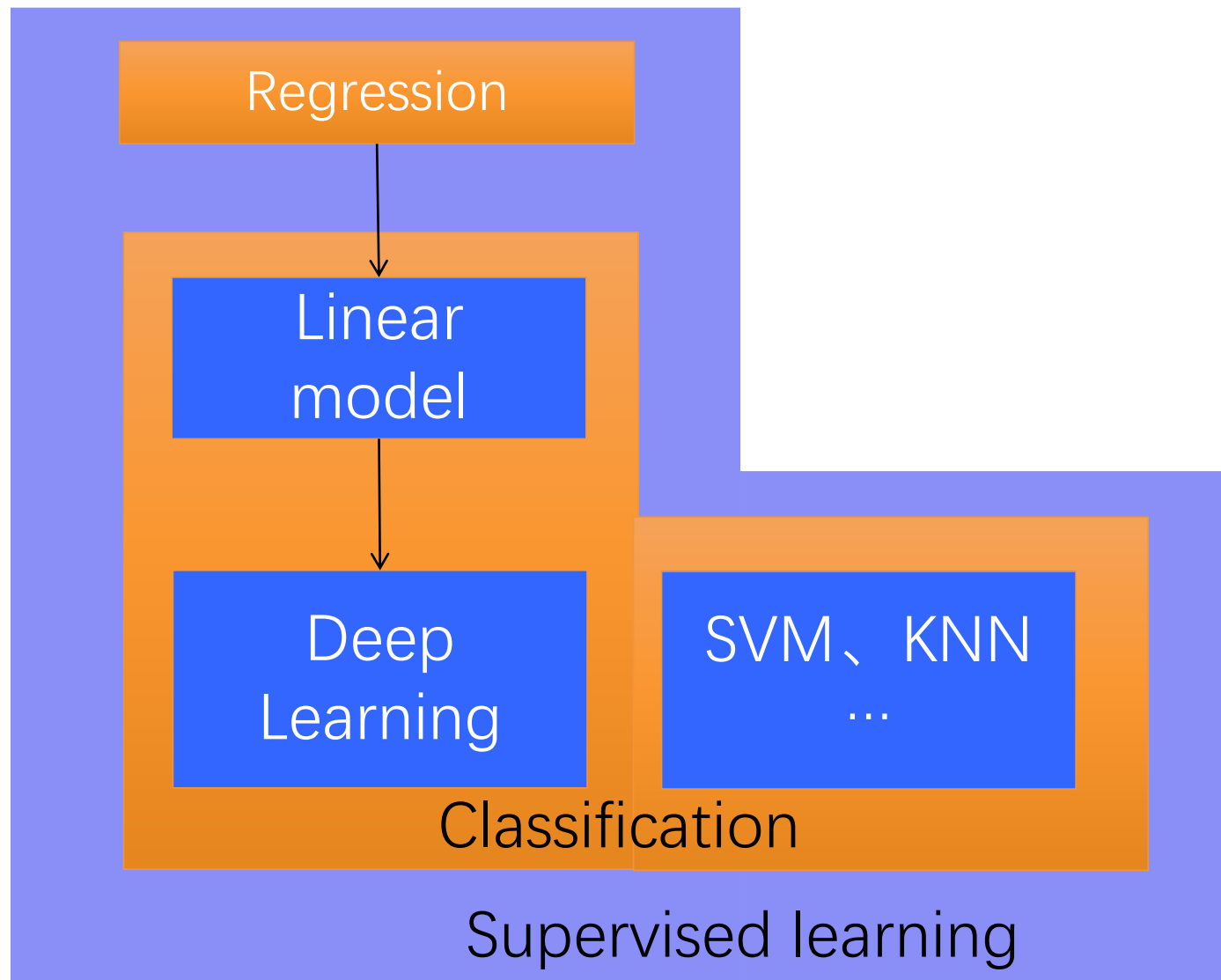
Learning map



Training data:
Input/output
Pair of target function

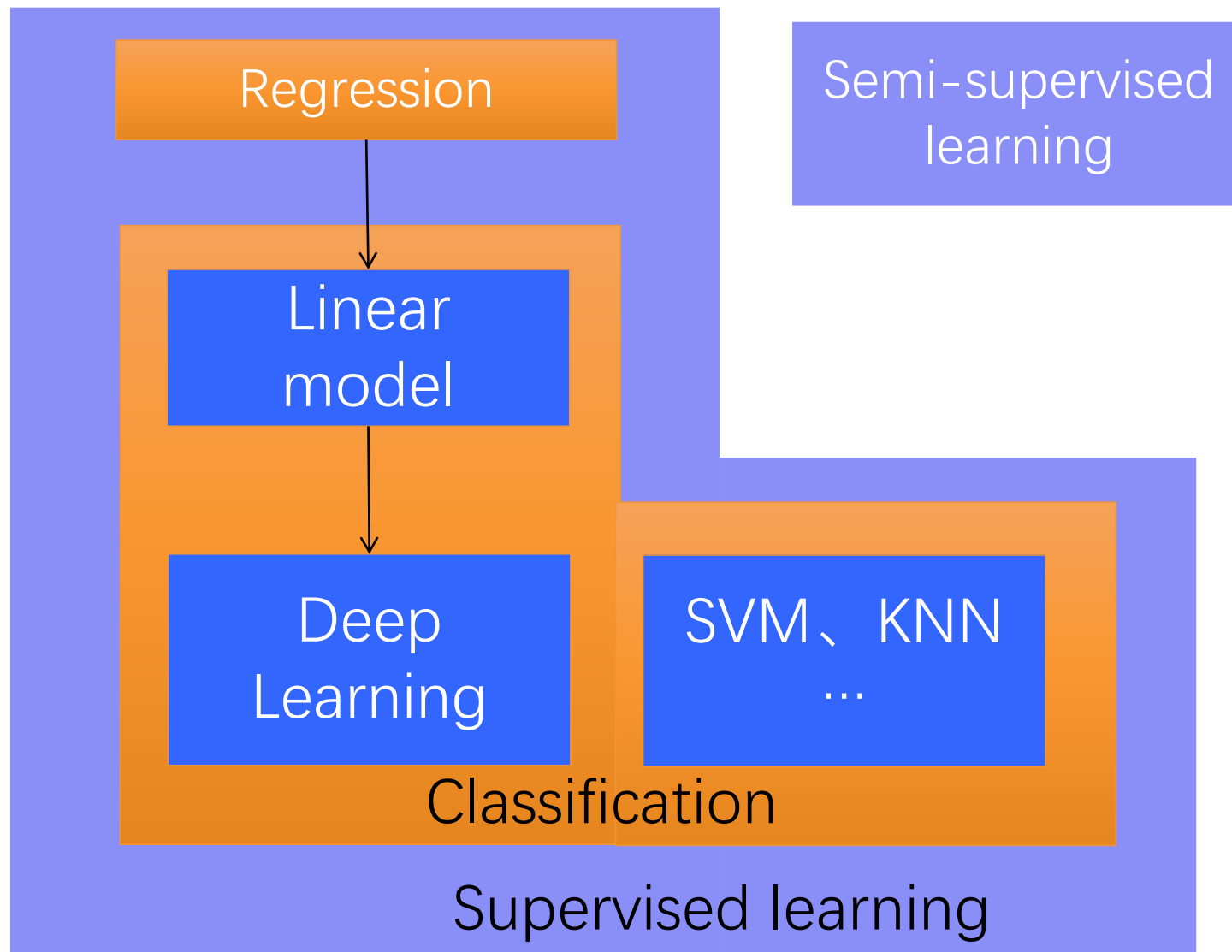
Learning map

Hard to collect a large
amount of labeled data



Training data:
Input/output
Pair of target function

Learning map



Hard to collect a large
amount of labeled data

Training data:
Input/output
Pair of target function

Semi-supervised learning

For example , recognizing dogs and cats

Labeled
data



cat



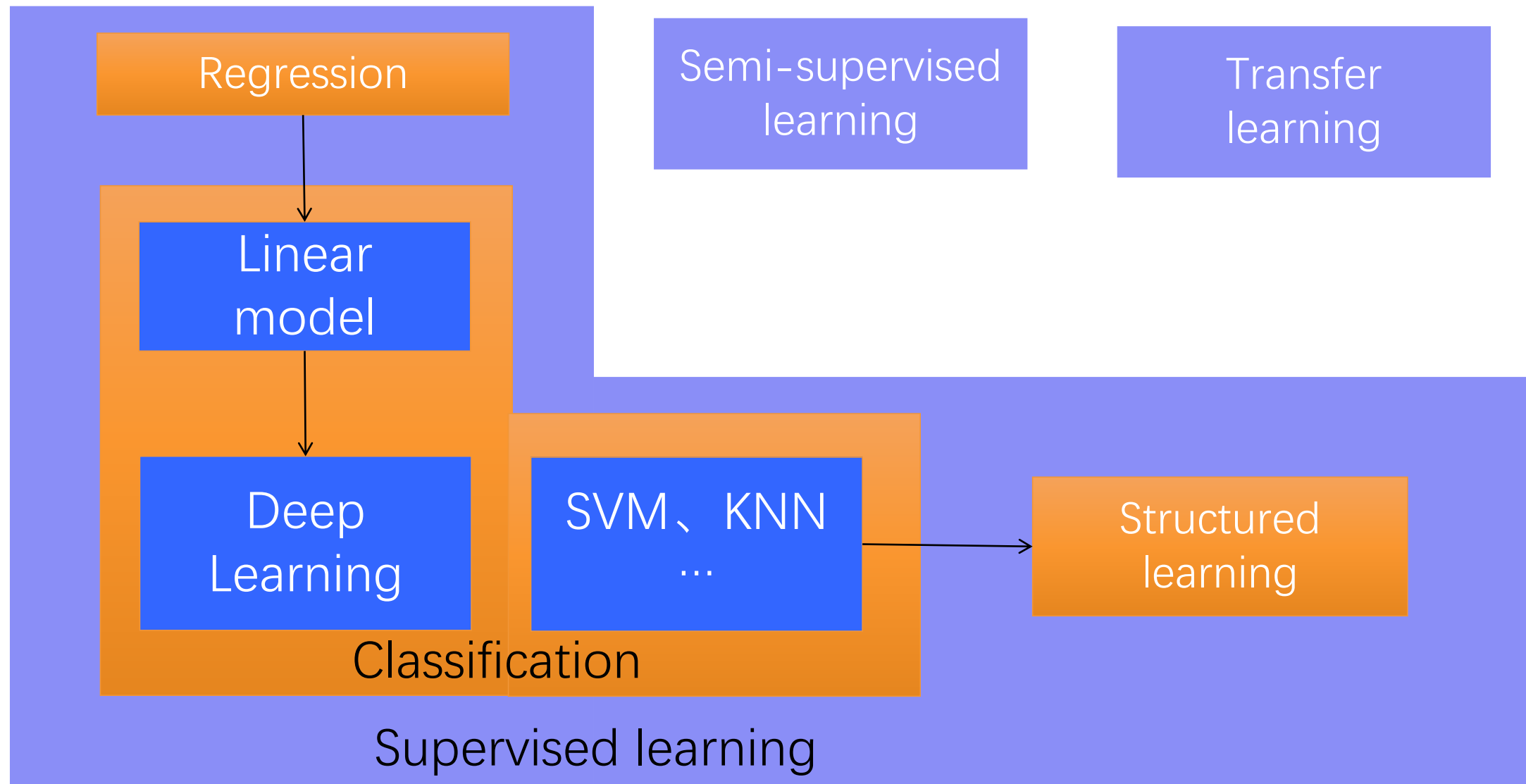
dog

Unlabeled
data



Images of dogs and cats

Learning map



Transfer learning

For example , recognizing dogs and cats

Labeled
data



cat



dog



elephant



Haruhi



Transfer learning

For example , recognizing dogs and cats

Labeled
data



cat



dog



elephant

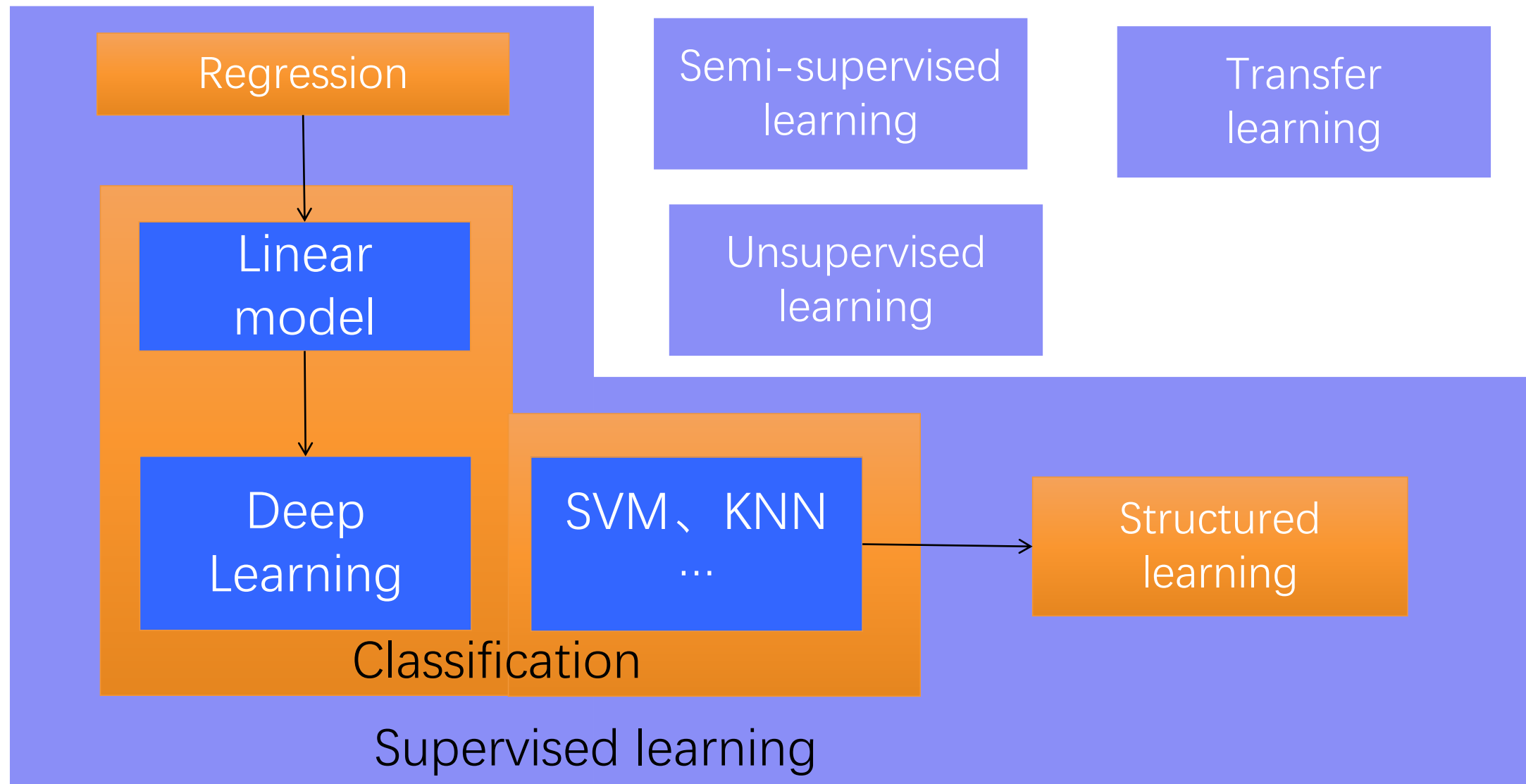


Haruhi



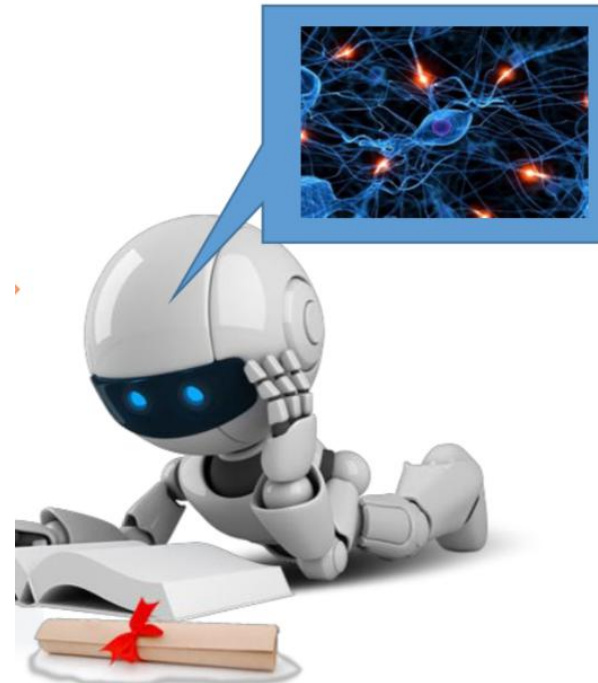
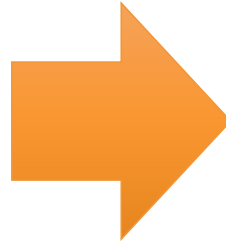
Data not related to the task considered
(either labelled or unlabelled)

Learning map



Unsupervised learning

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



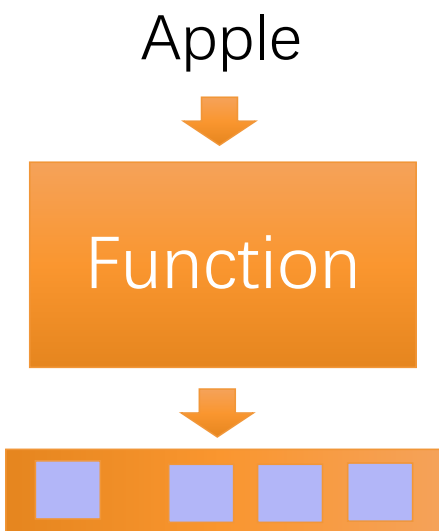
Unsupervised learning

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

Function

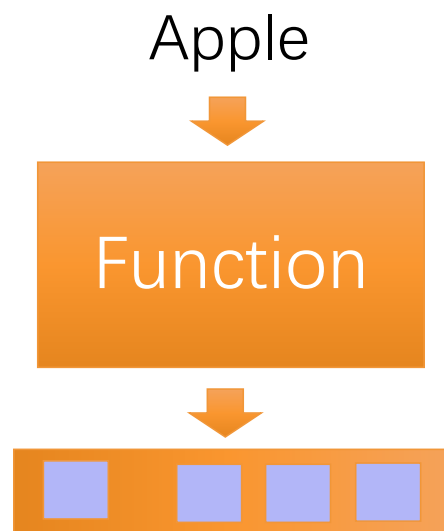
Unsupervised learning

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



Unsupervised learning

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



Training data is a lot of text

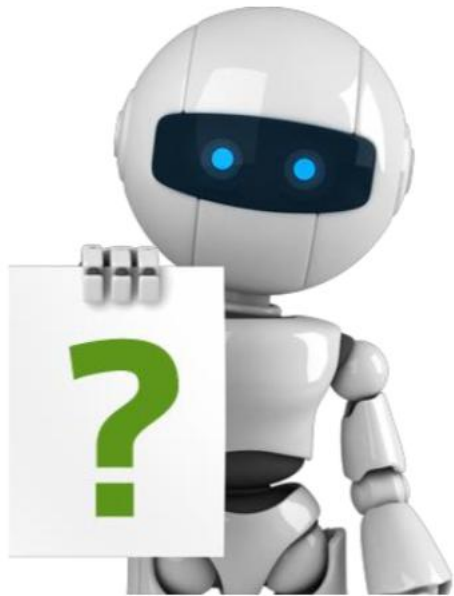


Unsupervised learning



Draw Something

Unsupervised learning



Draw Something

Unsupervised learning

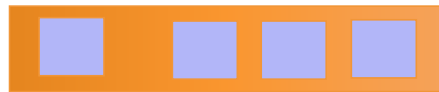


Draw Something



Unsupervised learning

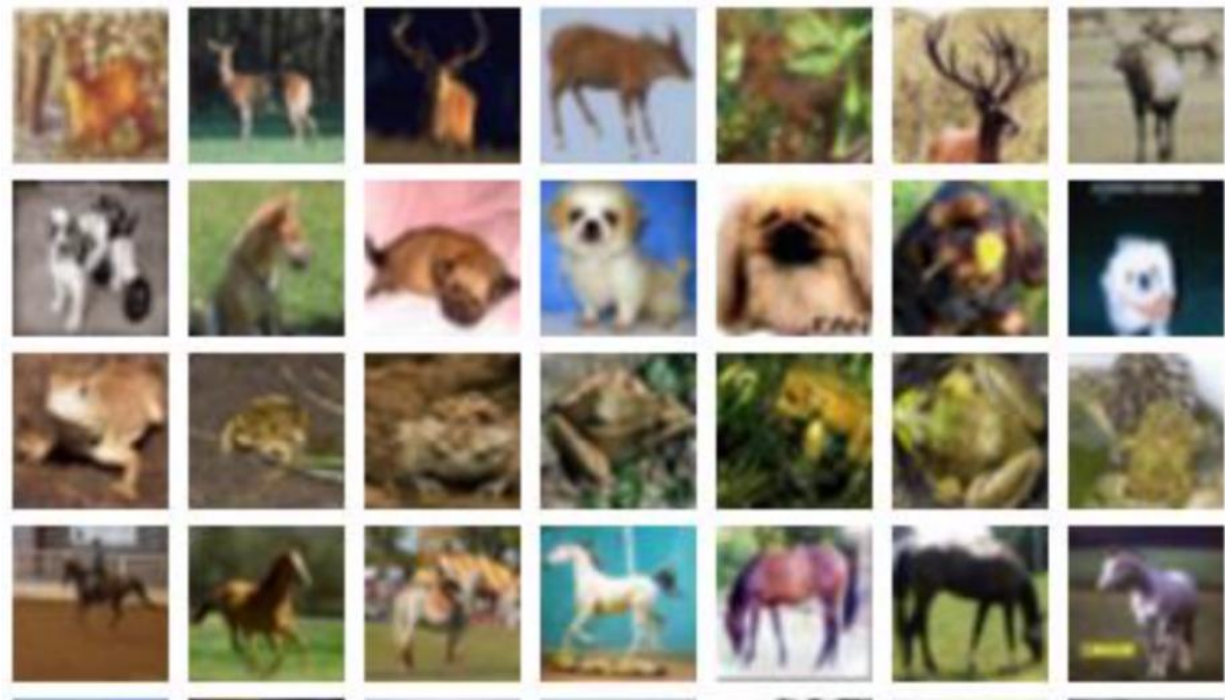
Machine Draw



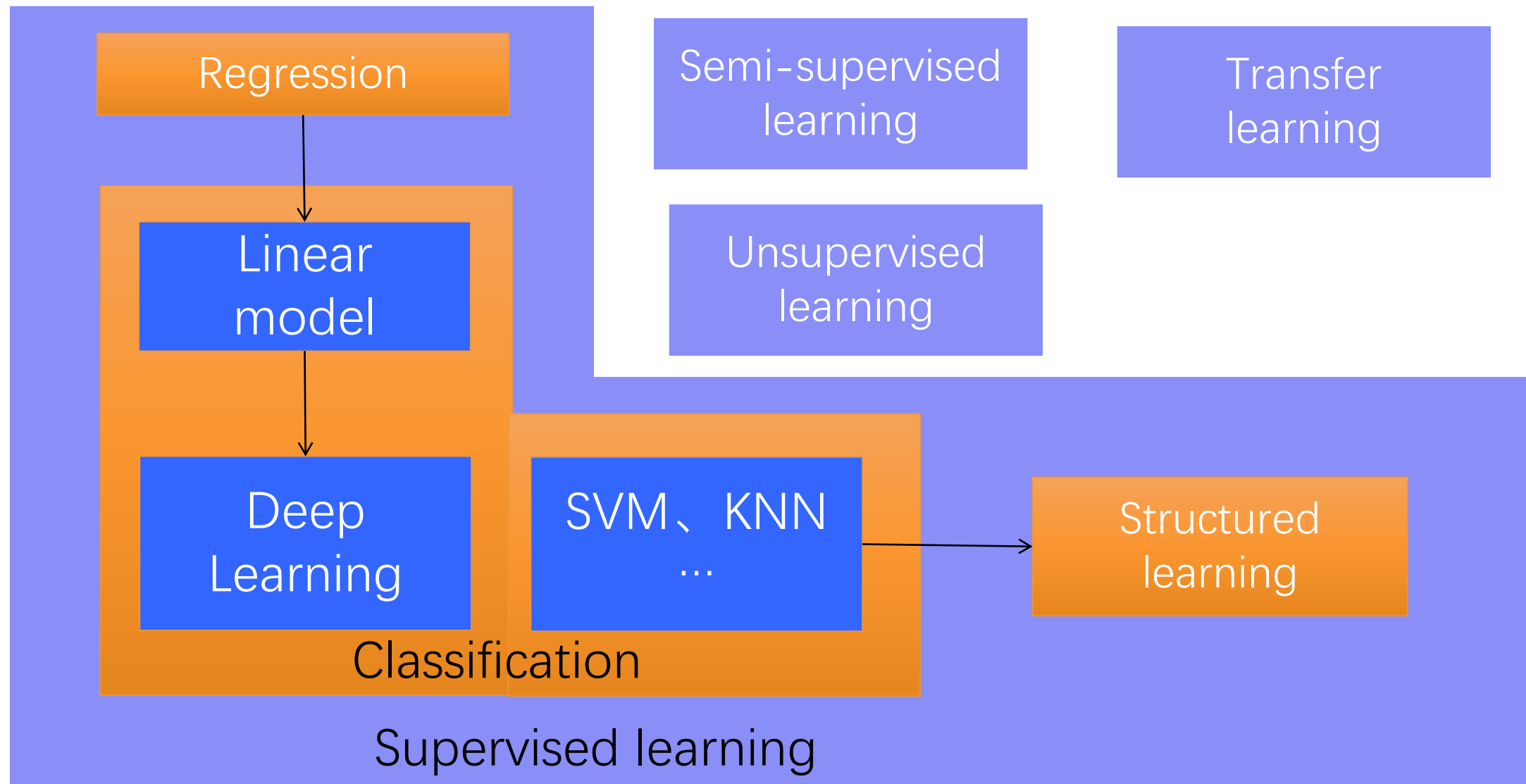
Function



Training data is a lot of images



Learning map



Structured learning – beyond classification



Speech recognition

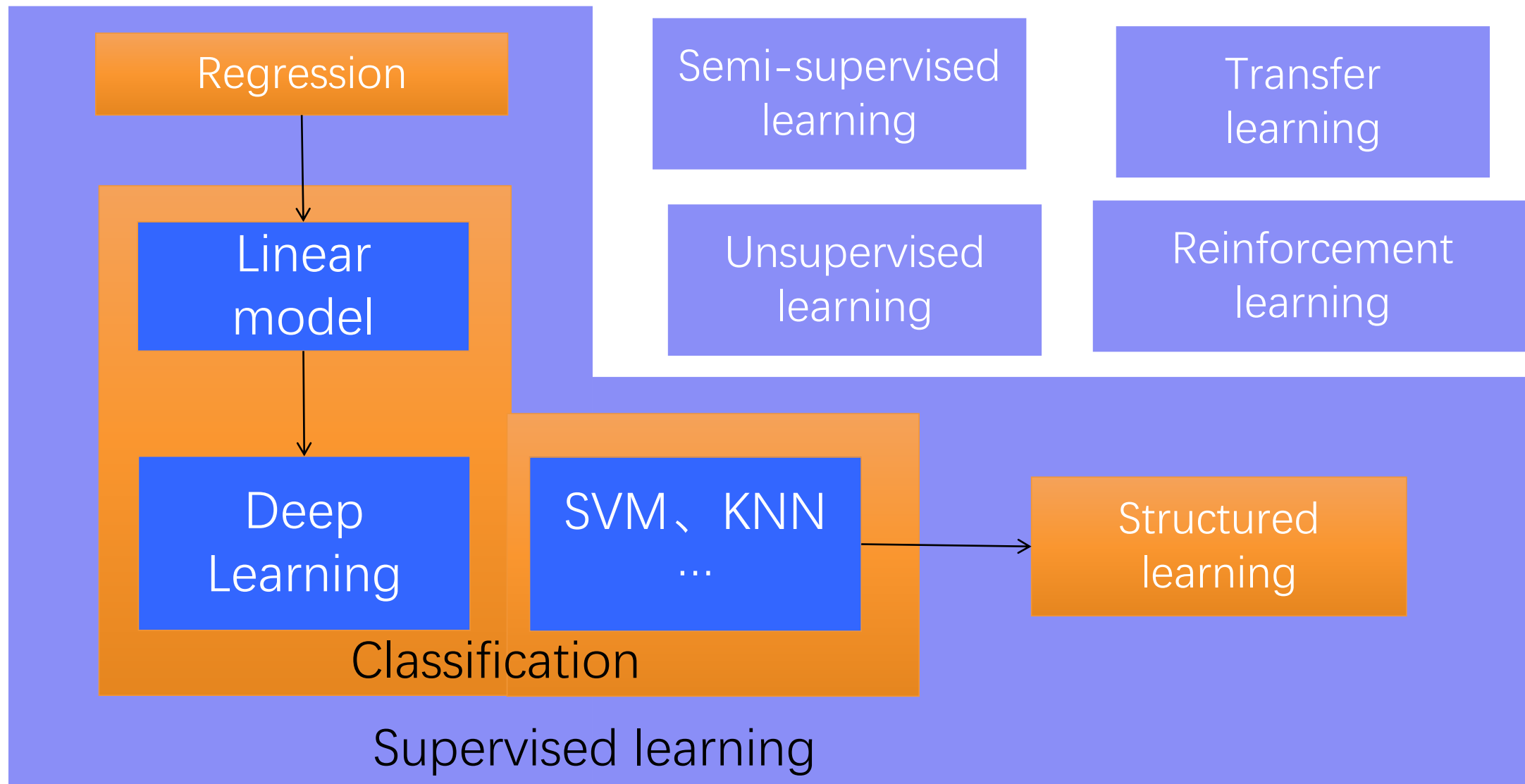


Machine translation

人脸识别



Learning map

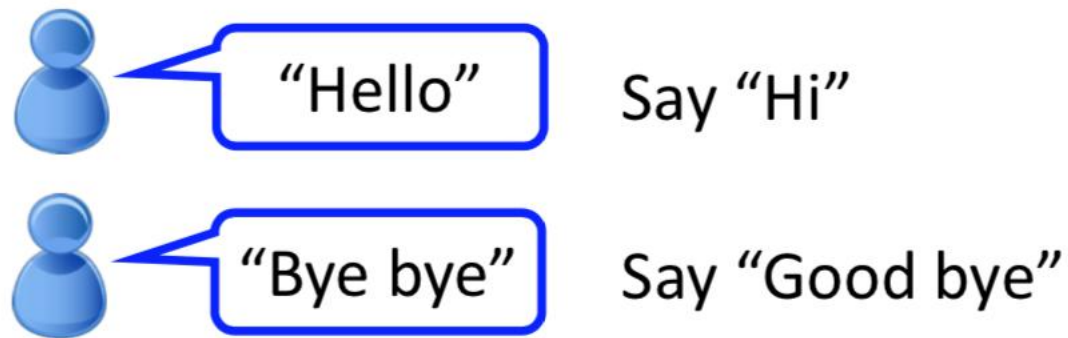


Reinforcement learning

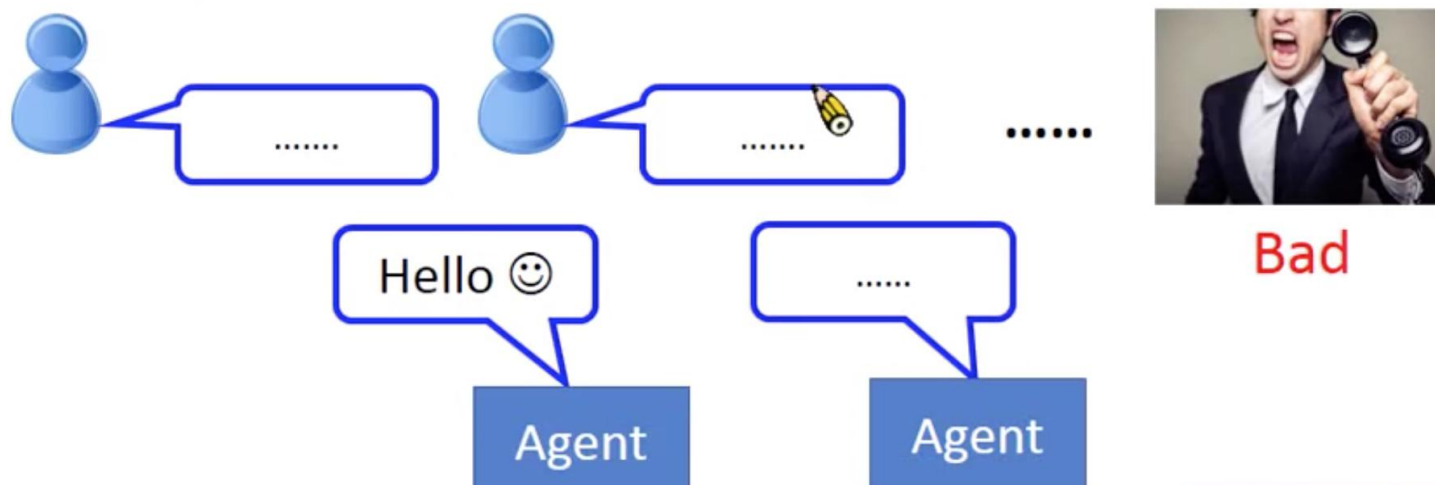


Supervised v.s. Reinforcement

- Supervised



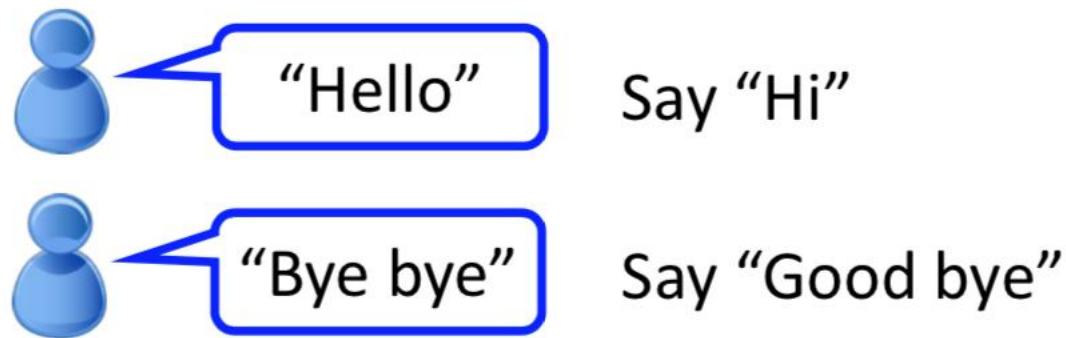
- Reinforcement



Supervised v.s. Reinforcement

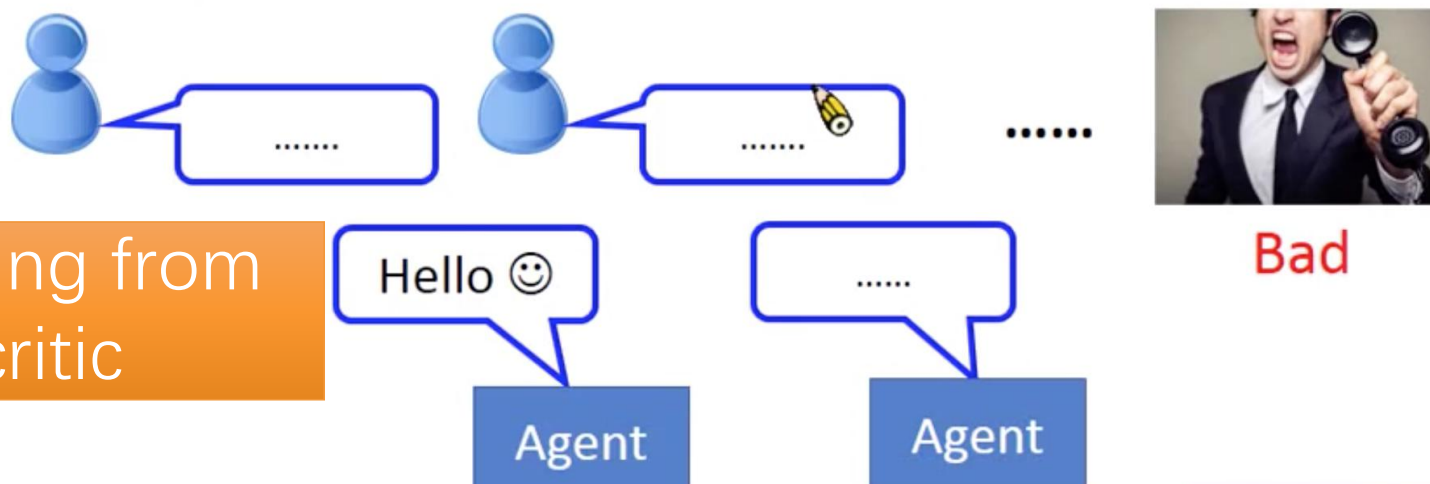
- Supervised

Learning from
teacher



- Reinforcement

Learning from
critic



Supervised v.s. Reinforcement

- Supervised



Next move:
"5-5"



Next move:
"3-3"

- Reinforcement

First move → many moves → Win!

Supervised v.s. Reinforcement

- Supervised



Next move:
"5-5"



Next move:
"3-3"

- Reinforcement

First move



..... many moves



Win!

Alpha Go is supervised learning + reinforcement learning.

2019
怪兽
学堂

THANKS

