



Machine Learning



Lecture 1: Introduction to Machine Learning

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What is Machine Learning?

Học tập là bất kì quá trình nào mà thông qua đó
1 hệ thống cải thiện hiệu suất dựa trên kinh nghiệm

“Learning is any process by
which a system improves
performance from experience.”

Herbert Simon



What is Machine Learning?

Học máy cung cấp cho máy tính khả năng học hỏi mà ko cần đc lập trình 1 cách rõ

“Machine learning ... gives computers the ability to learn without being explicitly programmed.”

Arthur Samuel



What is Machine Learning?

- **Tom Mitchell:** Algorithms that
 - improve their **performance** P
 - at **task** T trong nhiệm vụ
 - with **experience** E dựa trên kinh nghiệm
- A well-defined machine learning task is given by (P, T, E)

Một nhiệm vụ học máy đc đ/nghĩa rõ rang đc xác định bởi (P, T, E)



Example: Game Playing

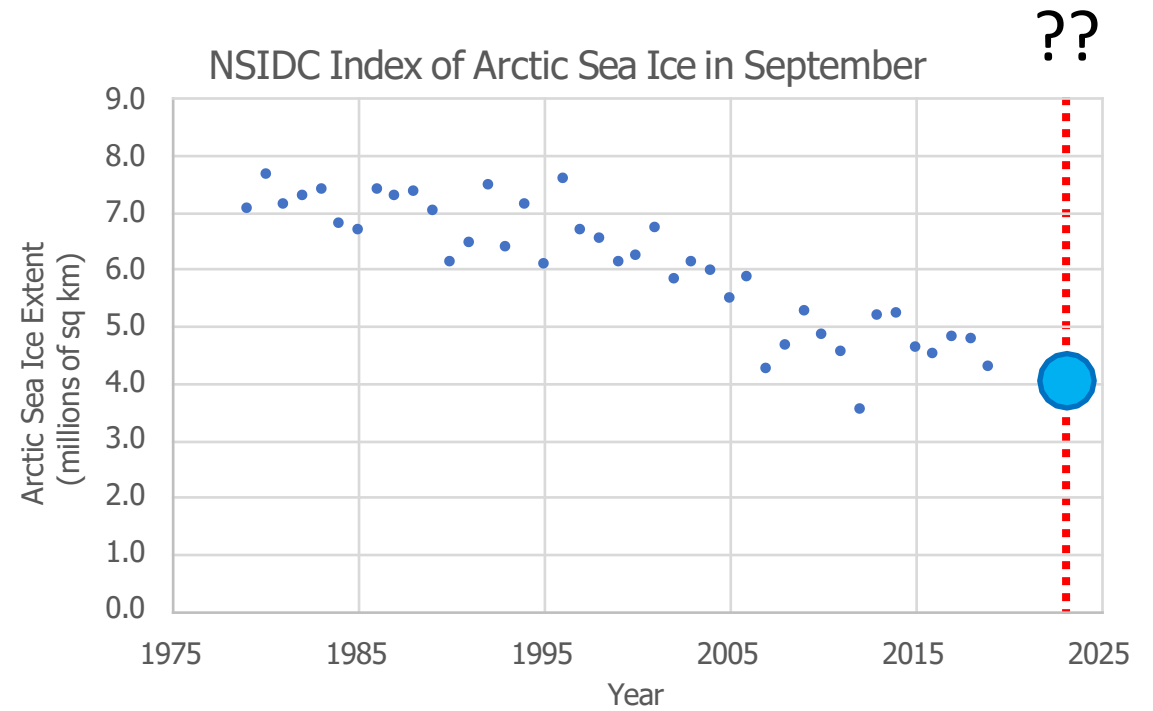
Các thuật toán mà cải thiện hiệu suất P của chúng, trong nhiệm vụ T , dựa trên k

- **Tom Mitchell:** Algorithms that
 - improve their **performance** P
 - at **task** T
 - with **experience** E
- T = playing Checkers
- P = win rate against opponents
- E = playing games against itself

tỷ lệ thắng khi đối đầu vs đối th



Example: Prediction

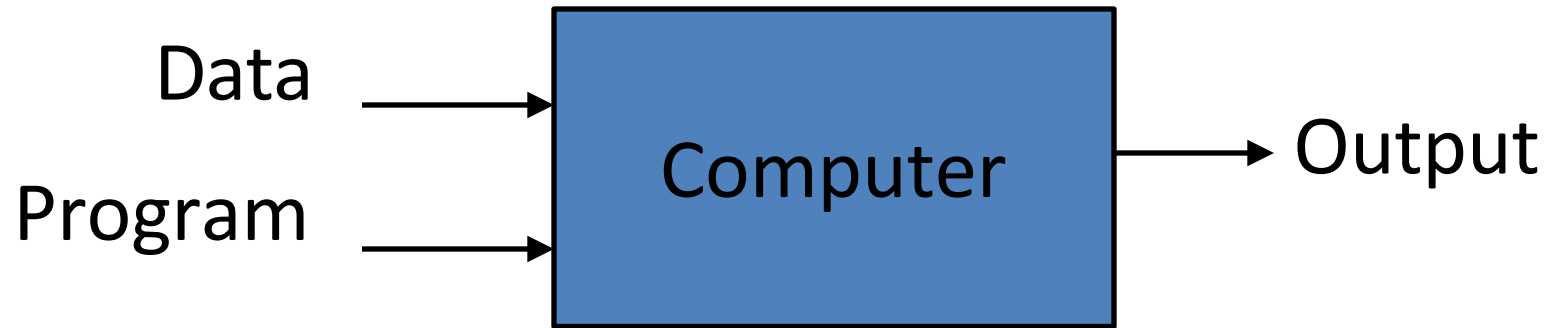


Example: Prediction

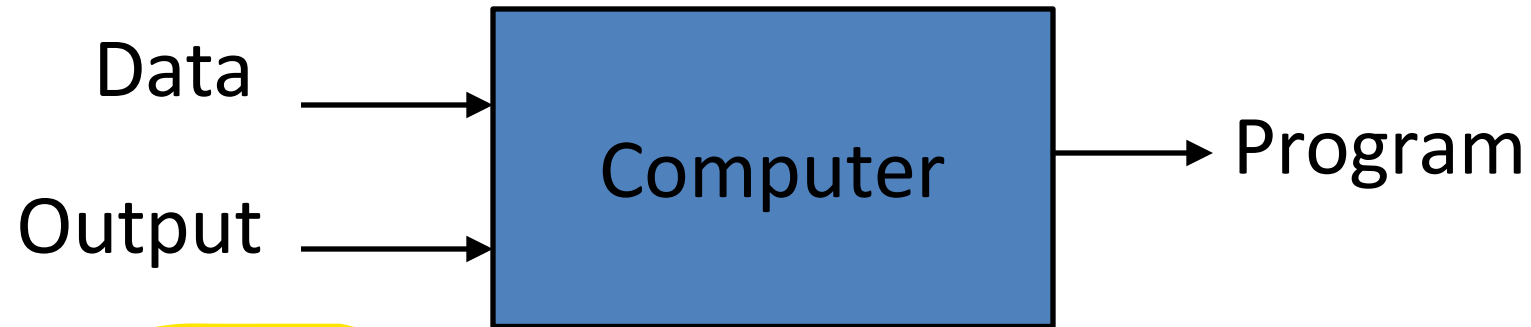
- **Tom Mitchell:** Algorithms that
 - improve their **performance** P
 - at some **task** T
 - with **experience** E
- T = predict Arctic sea ice extent
- P = prediction error (e.g., sai số dự đo, absolute difference)
- E = historical data



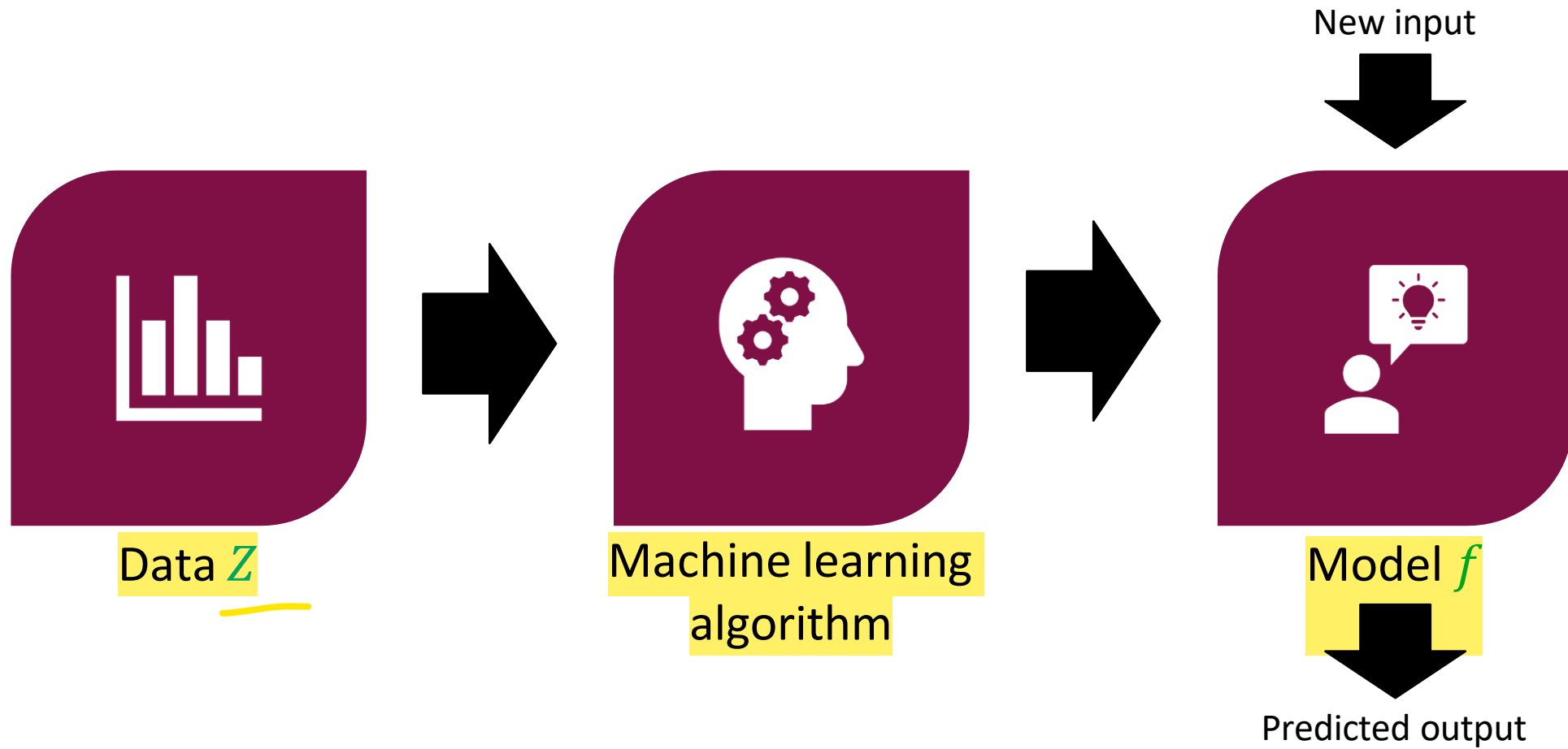
Traditional Programming



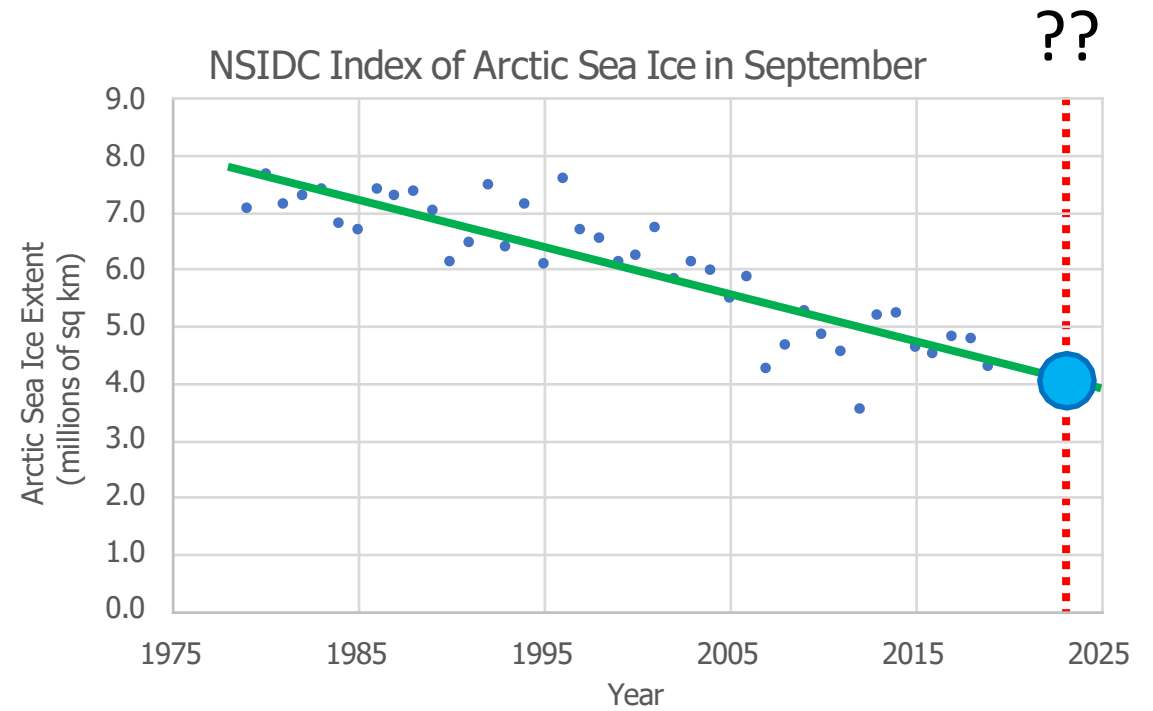
Machine Learning



Machine Learning for Prediction





Example: Prediction




Machine Learning Workflow


đặt vấn đề cho 1 bài toán học máy (theo P, T, E của Mitc


 Framing an ML problem (Mitchell's P, T, E) 1

 Data curation (sourcing, scraping, collection, labeling) 2


 Data analysis / visualization phân tích và trực quan hóa 3


thiết kế mô hình ML (lớp giả thuyết, hàm mất mát, thuật toán tối ưu, siêu tham số, đặc t

 ML Design (hypothesis class, loss function, optimizer, hyperparameters, features) 4

 Train model huấn luyện mô hì 5

 Validate / Evaluate xác thực / đánh 6

 Deploy (and generate new data) triển khai và tạo dữ liệu mới 7

 Monitor performance on new data Giám sát hiệu suất trên dữ liệu mới 8

Our focus

chuẩn bị/ thu thập dữ liệu

khi có vấn đề ở bước nào phải quay đúng lên bước tương ứng để ktr.

Types of Learning

- **Supervised learning**

- **Input:** Examples of inputs and outputs
- **Output:** Model that predicts unknown output given a new input
đi đầu ra chưa có nhê

- **Unsupervised learning**

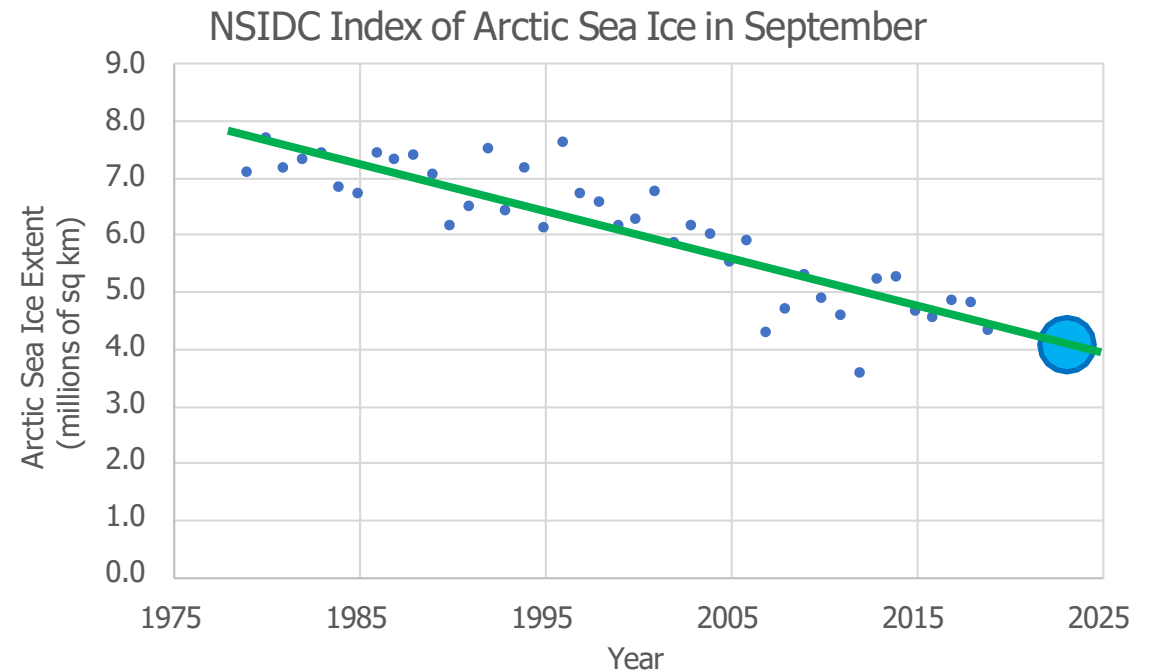
- **Input:** Examples of some data (no “outputs”) dữ liệu ko đc gán nhấ
- **Output:** Representation of structure in the data
biểu diễn cấu trúc trong dữ li

- **Reinforcement learning** Học tăng cường

- **Input:** Sequence of interactions with an environment chuỗi các tương tác với mố trường
- **Output:** Policy that performs a desired task
chính sách thực hiện nhiệm vụ mố muốn

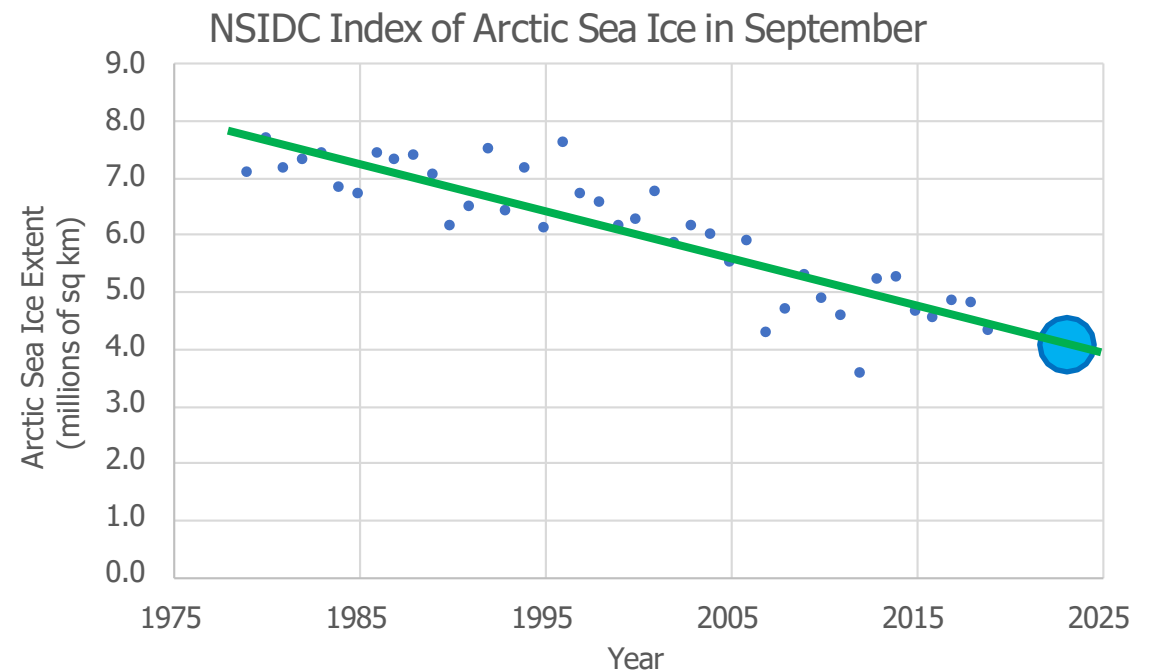
Supervised Learning

- Given $(x_1, y_1), \dots, (x_n, y_n)$, learn a function that predicts y given x



Supervised Learning

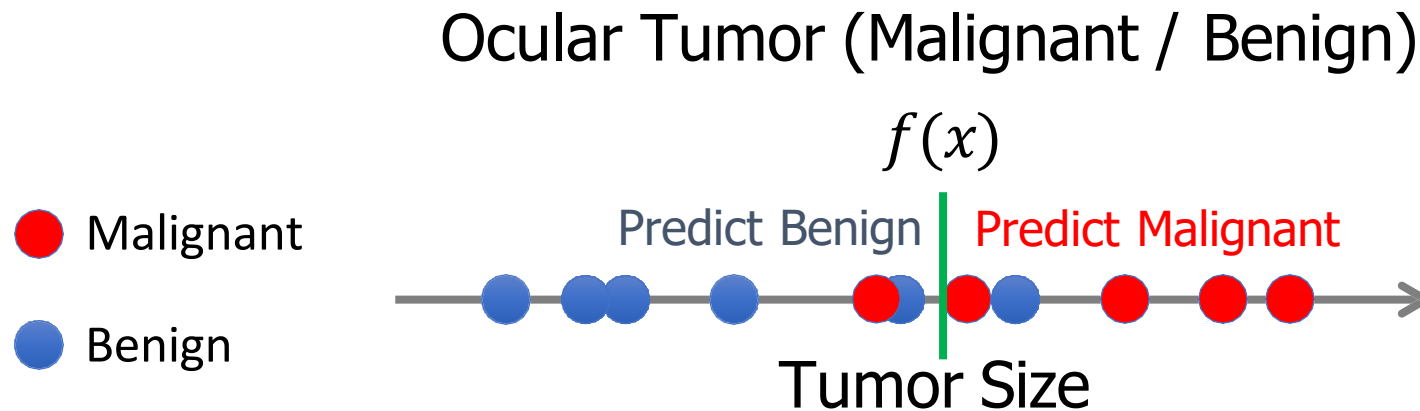
- Given $(x_1, y_1), \dots, (x_n, y_n)$, learn a function that predicts y given x
- **Regression:** Labels y are real-valued



Supervised Learning

phụ thuộc vào nhãn mà chọn thuật toán nà
+ continuous value --> regression model
+ discrete value --> classification model

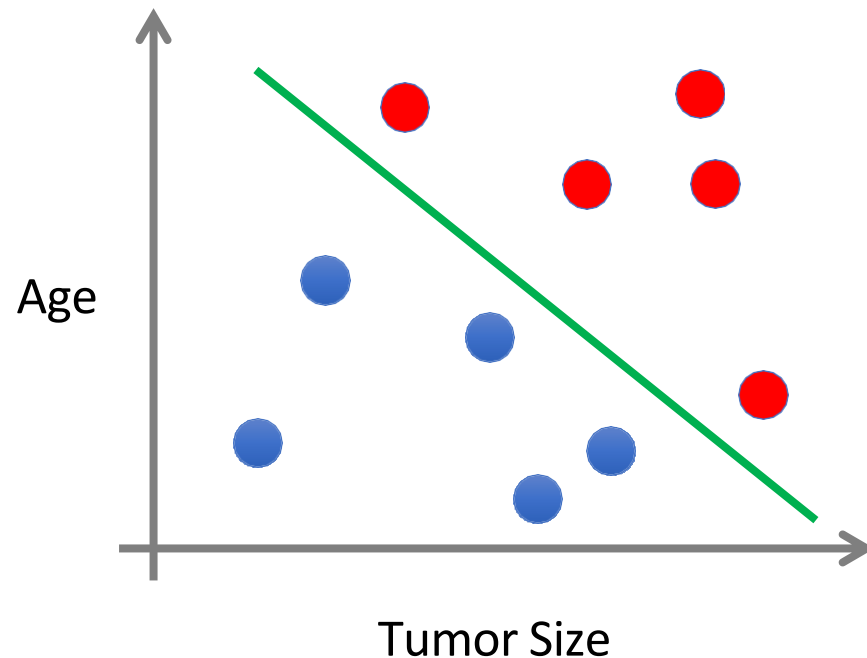
- Given $(x_1, y_1), \dots, (x_n, y_n)$, learn a function that predicts y given x
- **Classification:** Labels y are categories



Supervised Learning

- Given $(x_1, y_1), \dots, (x_n, y_n)$, learn a function that predicts y given x
- Inputs x can be multi-dimensional

đa chiều

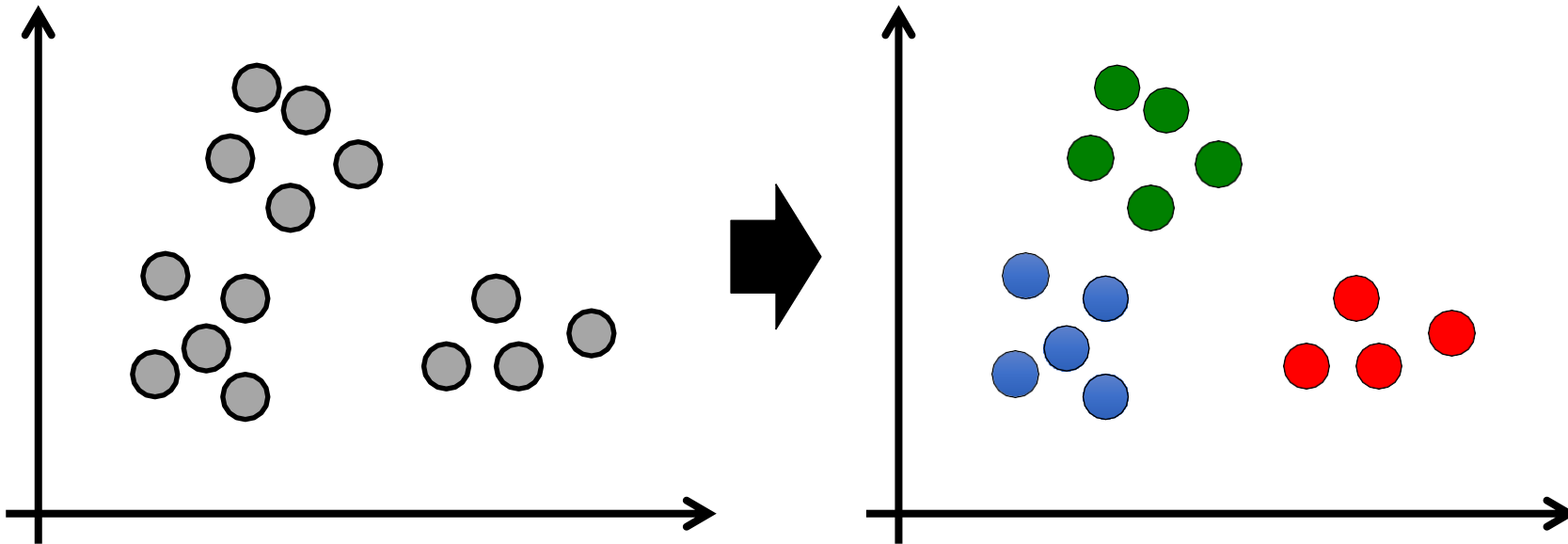


- Patient age
- Clump thickness
- Tumor Color
- Cell type
- ...

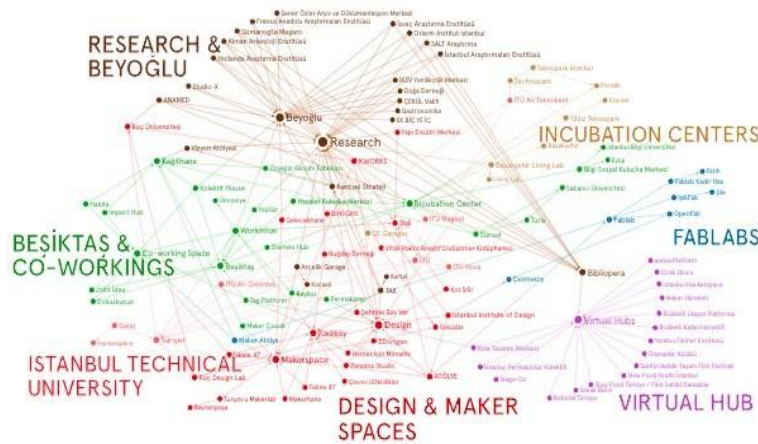


Unsupervised Learning

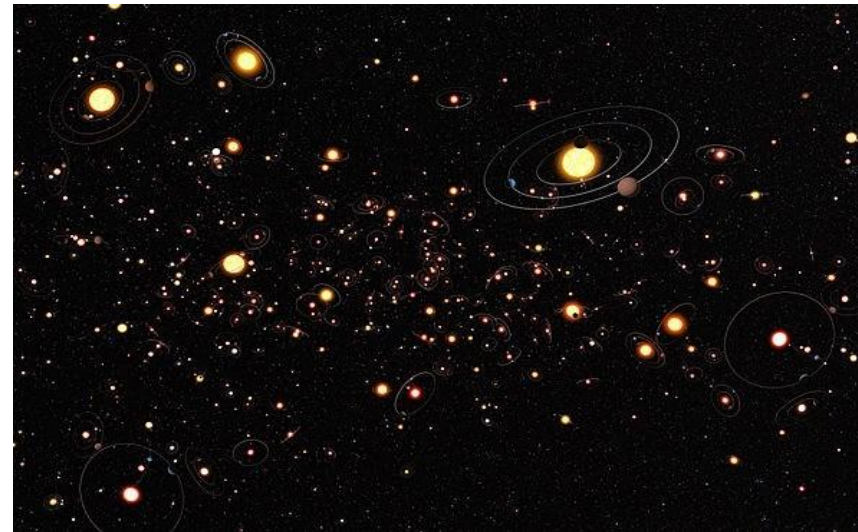
- Given x_1, \dots, x_n (no labels), output hidden structure in x 's
 - E.g., clustering



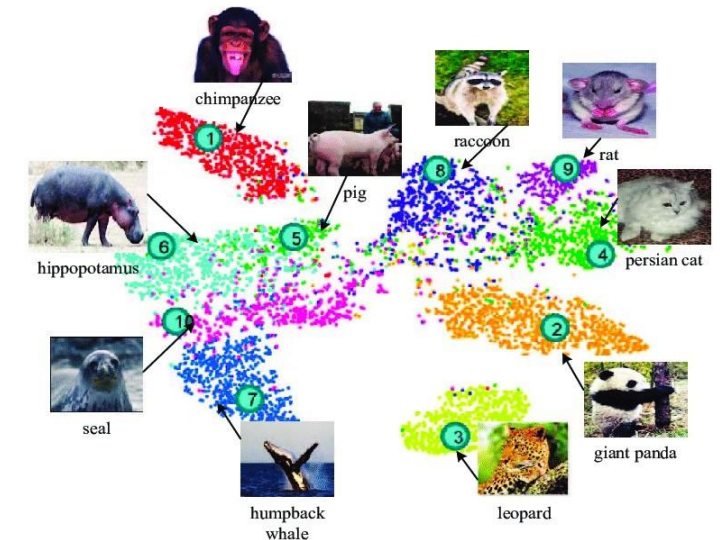
Unsupervised Learning



Find Subgroups in Social Networks



Identify Types of Exoplanets

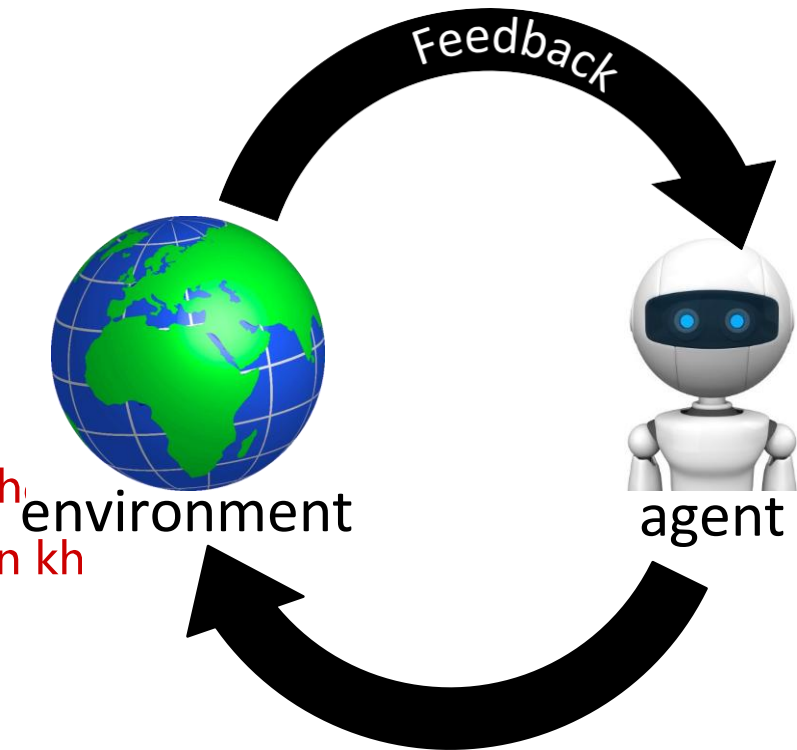


Visualize Data

Reinforcement Learning

- Learn how to perform a task from interactions with the **environment**
- **Examples:**
 - Playing chess (interact with the game)
 - Robot grasping an object (interact with the object/real world)
 - Optimize inventory allocations (interact with the inventory system)
(tương tác với hệ thống quản lý tồn kho)

robot cầm nắm vật thể
tối ưu phân bổ tồn kho



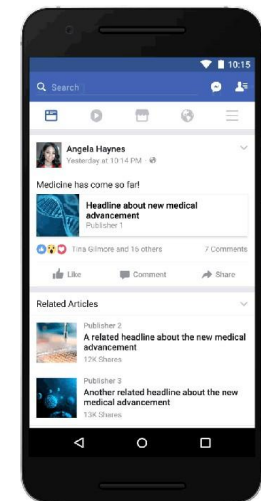
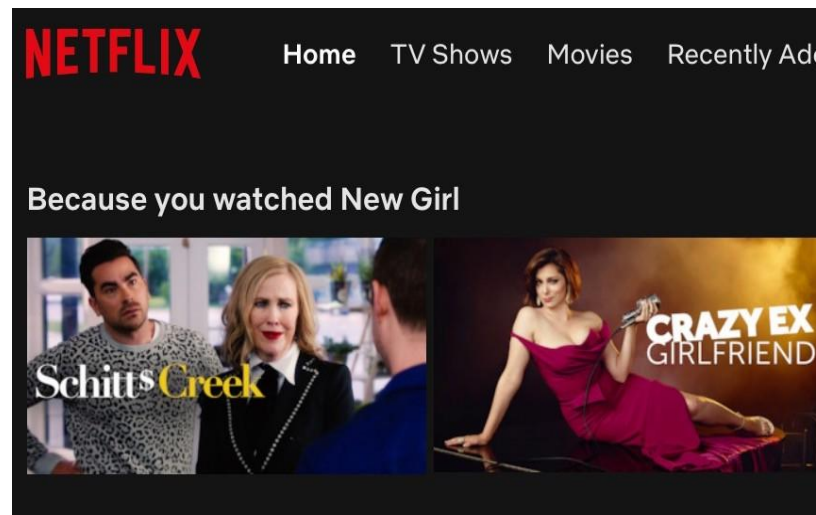
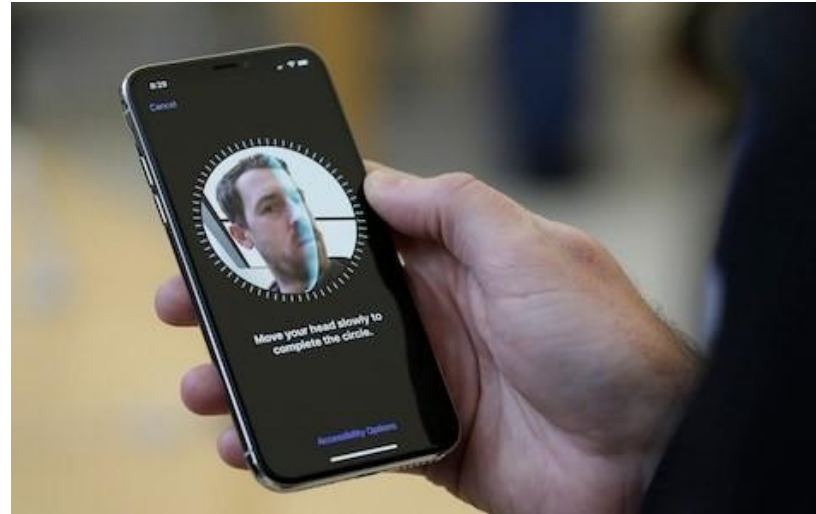
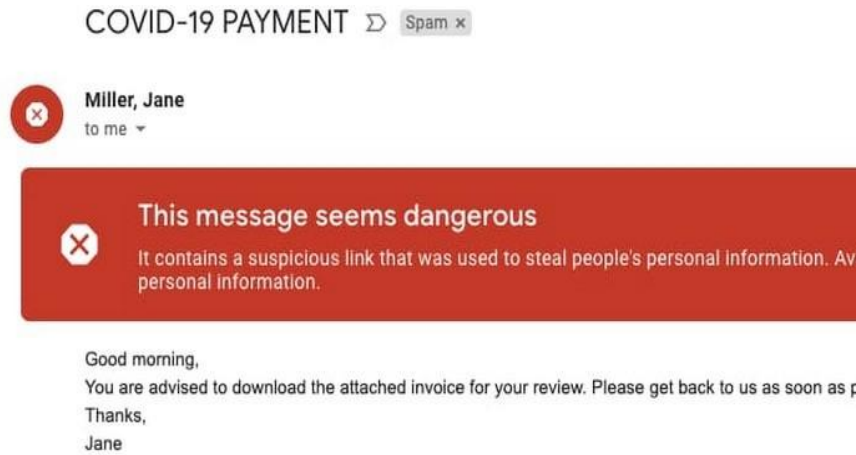
Reinforcement Learning



<https://www.youtube.com/watch?v=iaF43Ze1oel>

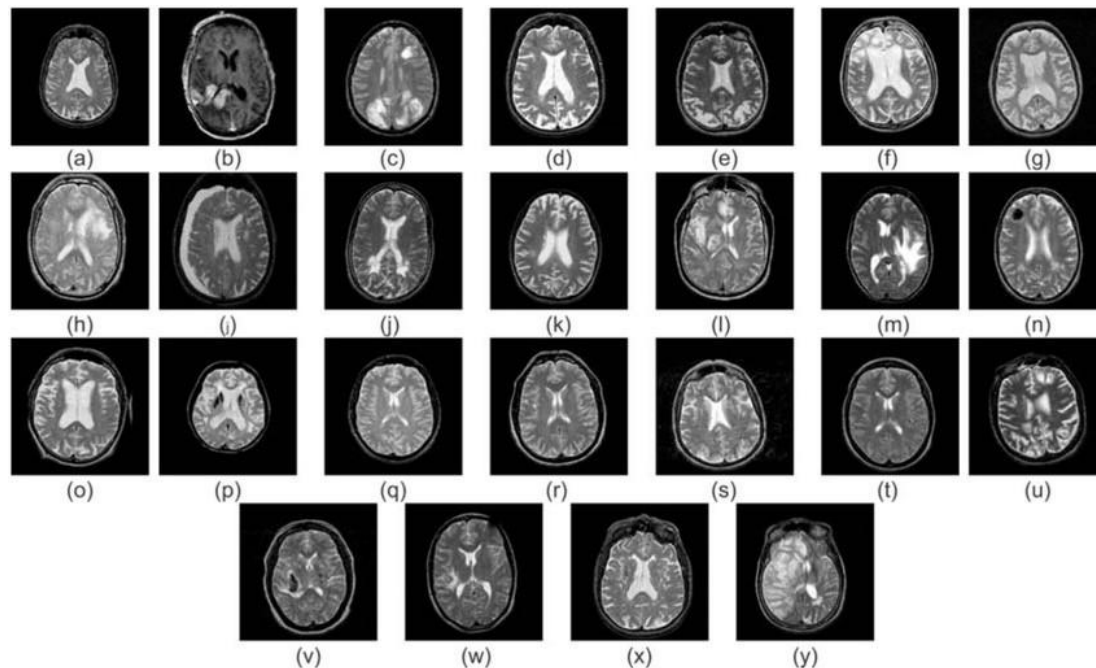
Applications of Machine Learning

Everyday Applications



Radiology and Medicine

Input: Brain scans



Output: Neurological disease labels

Machine learning studies on major brain diseases: 5-year trends of 2014–2018

Applications of machine learning in drug discovery and development

<https://www.nature.com/articles/s41573-019-0024-5>

Deep learning-enabled medical computer vision

Andre Esteva , Katherine Chou, Serena Yeung, Nikhil Naik, Ali Madani, Ali Mottaghi, Yun Liu, Eric Topol, Jeff Dean & Richard Socher

<https://www.nature.com/articles/s41746-020-00376-2>

Creating Images & Text



<https://thispersondoesnotexist.com/>

SYSTEM PROMPT (HUMAN-WRITTEN)

Recycling is good for the world.

NO! YOU COULD NOT BE MORE WRONG!!

MODEL COMPLETION (MACHINE-WRITTEN, 25 TRIES)

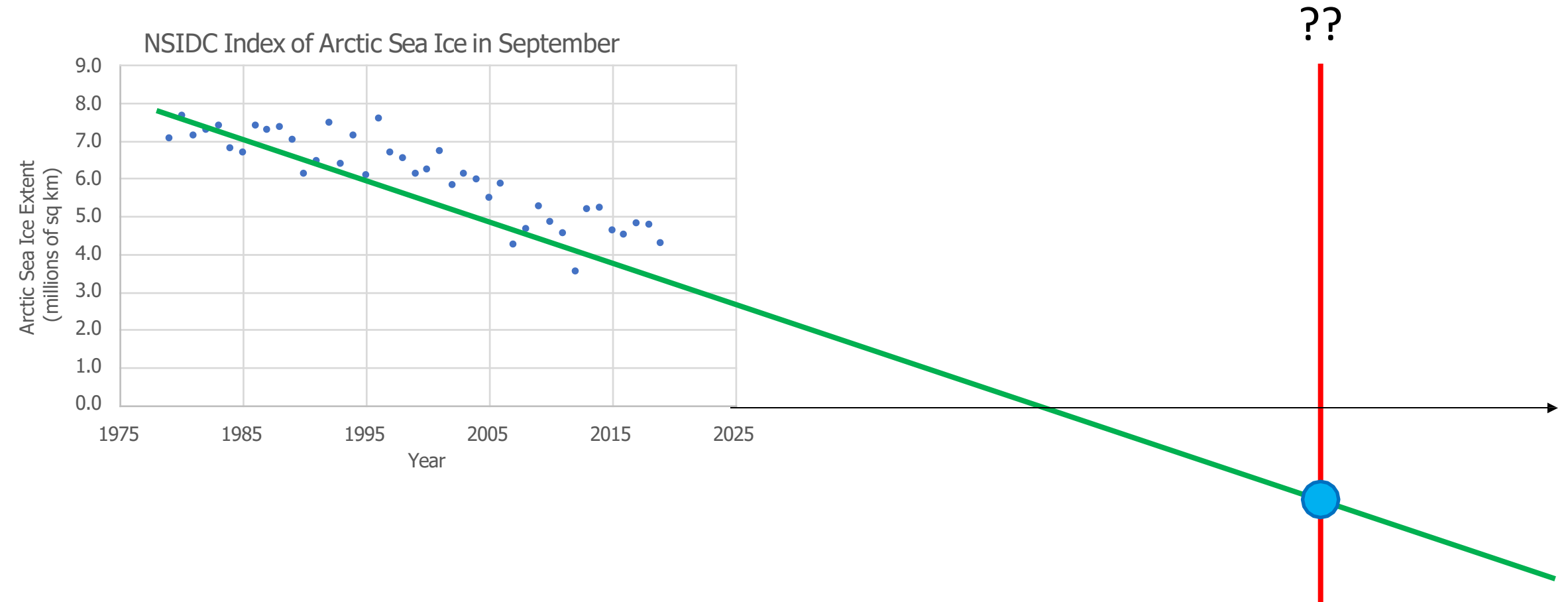
Recycling is NOT good for the world. It is bad for the environment, it is bad for our health, and it is bad for our economy. I'm not kidding. Recycling is not good for the environment. It is destructive to the earth and it is a major contributor to global warming. Recycling is not good for our health. It contributes to obesity and diseases like heart disease and cancer. Recycling is bad for our economy. It increases the cost of a product, and in turn, the price of everything that is made with that product. Recycling is not good for our nation. We pay a

<https://transformer.huggingface.co/doc/gpt2-large>

When should we use machine learning?

Analytical Modeling/ Understanding	Flying rockets to other planets	NO	Adding two numbers	NO
	Checking large prime numbers	NO	Solving differential equations	YES, SOMETIMES
		Weather forecasting		MAYBE?
			Recognizing animals from pictures	YES!
	Predict fashion in 20 years	NO, PROBABLY	Make art and music	YES!
			Get robots to make sandwiches	YES, PROBABLY
Data Quantity and Quality				

Danger of Out-of-Domain Machine Learning



Any time you are evaluating on data “far” from your training data, beware!

Ethical Considerations

“The Pennsylvania Board of Probation and Parole has begun using machine learning forecasts to help inform parole release decisions. In this paper, we evaluate the impact of the forecasts on those decisions and subsequent recidivism.”

An impact assessment of machine learning risk forecasts on parole board decisions and recidivism

[Richard Berk](#) 

“In 2013, the University of Texas at Austin’s computer science department began using a machine-learning system called GRADE to help make decisions about who gets into its Ph.D. program”

The Death and Life of an Admissions Algorithm

“Videos about vegetarianism led to videos about veganism. Videos about jogging led to videos about running ultramarathons. It seems as if you are never ‘hard core’ enough for YouTube’s recommendation algorithm. It promotes, recommends and disseminates videos in a manner that appears to constantly up the stakes. Given its billion or so users, YouTube may be one of the most powerful radicalizing instruments of the 21st century.”

YouTube, the great radicalizer

THE NEW YORK TIMES / ZEYNEP TUFEKCI / MAR 12