

Machine Learning Basics - 01



Prateek Narang

About Me



- Co-founder at **Coding Blocks**
 - CS graduate from DTU, passionate about teaching
 - Pursuing MS from IIT-Delhi
 - Previously with SanDisk
 - Interests - Algorithms, Data Structures, Game Development and Machine Learning
 - Interactive CV www.prateeknarang.com
-

Machine Intelligence



What's **Machine Learning** ?

- Supervised
 - Unsupervised
 - Semi-supervised
- 

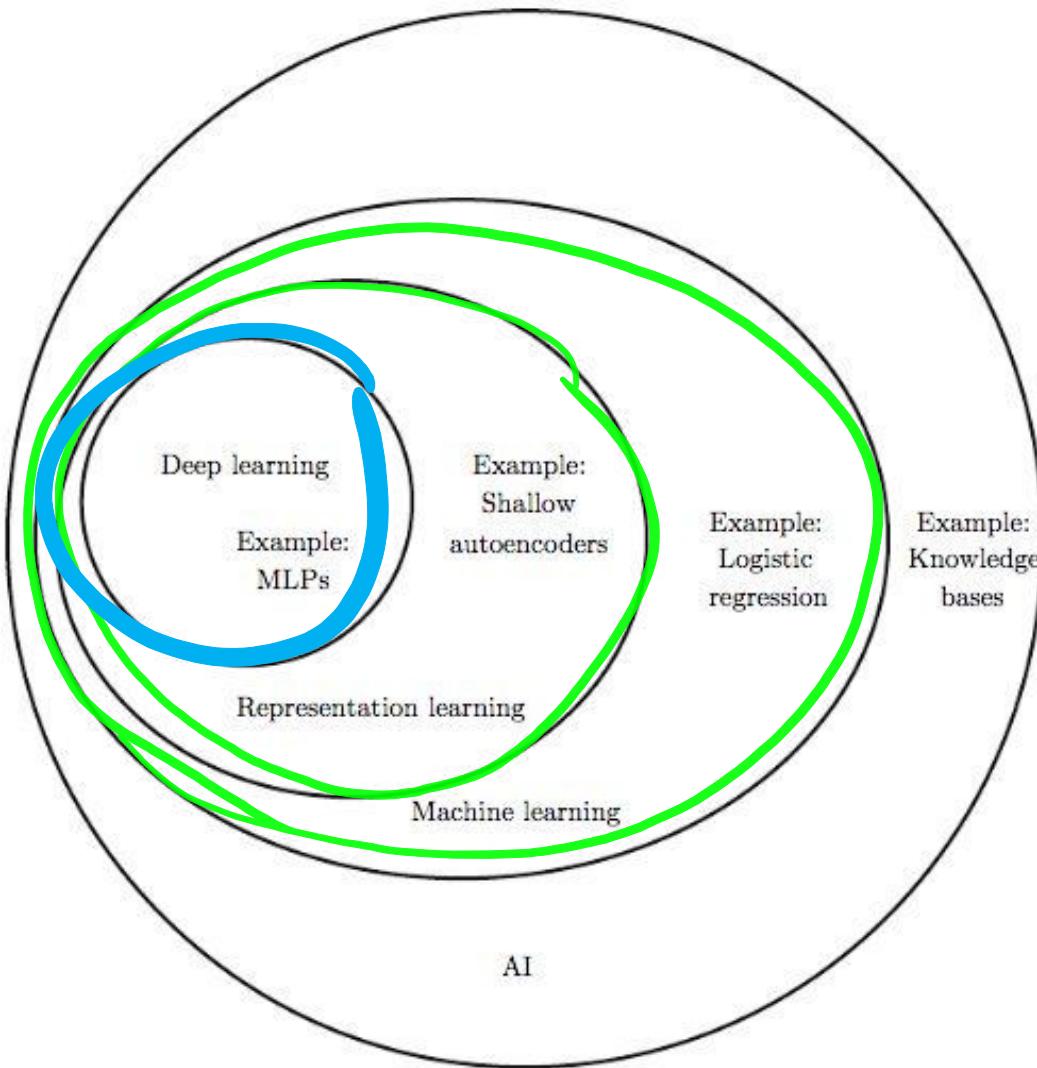
Today's Agenda

- ✓ Introduction to ML (15 mins)
- ✓ Supervised Learning (15 mins)
- ✓ Linear Regression (rest of the session)
 - Gradient Descent
 - Mean Squared Loss
 - Coding & Implementation

Overview

- Creating an statistical model to mimic “Intelligent” decision making.
- Finding patterns in complex, scattered data to present information.
- Building “smart” applications/devices.

Machine learning is a subfield of artificial intelligence (AI) concerned with algorithms that allow computers to learn. What this means, in most cases, is that an algorithm is given a set of data and infers information about the properties of the data—and that information allows it to make predictions about other data that it might see in the future



History of ML

Why did it happen?

- Started as a subset of Artificial Intelligence to help solve problems easily.
- Statistical Models used for prediction problems.
- Writing long hand-designed algorithms was inefficient

How about when??

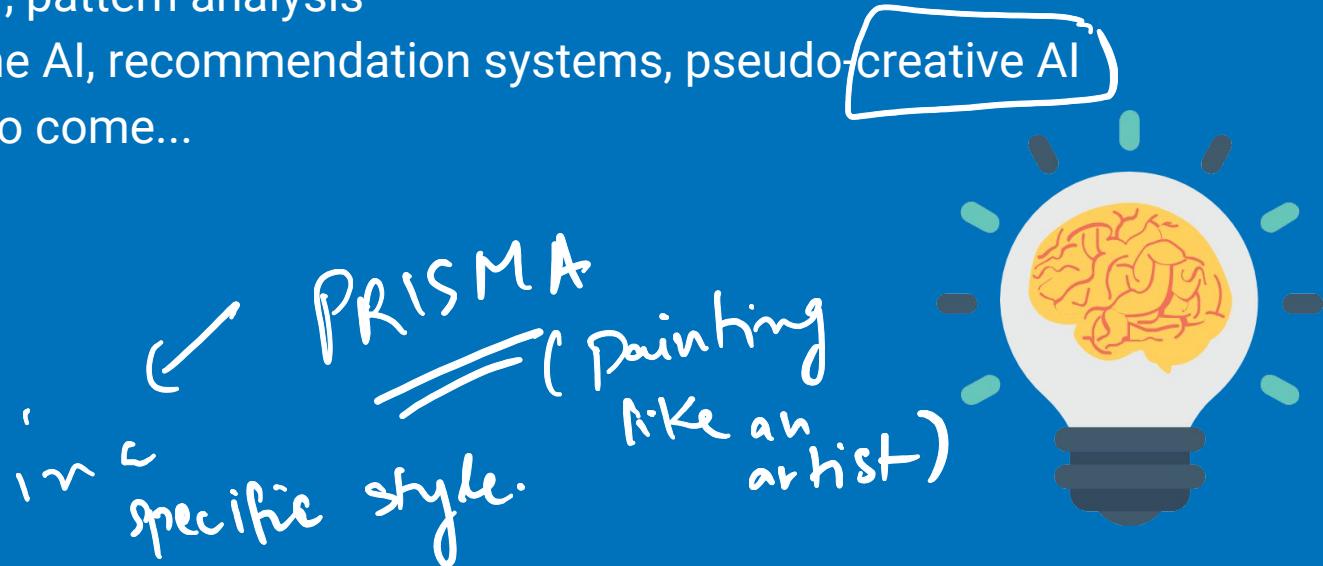
- First Computer, ENIAC (1946)
- Turing Test (1950)
- First Checkers bot (1952) at IBM
- Neural Turing Machines (1957)

Current Status

- Google DeepMind
- Facebook AI and Research (FAIR)
- OpenAI etc.
- Microsoft Research

Some Applications

- What makes your smartphone, “Smart”?
- In search engines, photo-based applications, chatbots, voice recognition, digital security, pattern analysis
- Robotics, Game AI, recommendation systems, pseudo creative AI
- And lot more to come...



Why ML Now ?

1000's
clusters

Why not use Machine Learning for everything?

- Data availability
- GPU's, computing power
- Strong Mathematical foundation(which was also there 1990's)



Why the Hype

- Every minute up to 300 hours of video are uploaded to YouTube.
- Average of 31.25 million messages and view 2.77 million videos every minute on Facebook.
- More data has been created in the past few years than in the entire previous history of the human race.
- At the moment less than 0.5% of all data is ever analyzed and used, just imagine the potential here

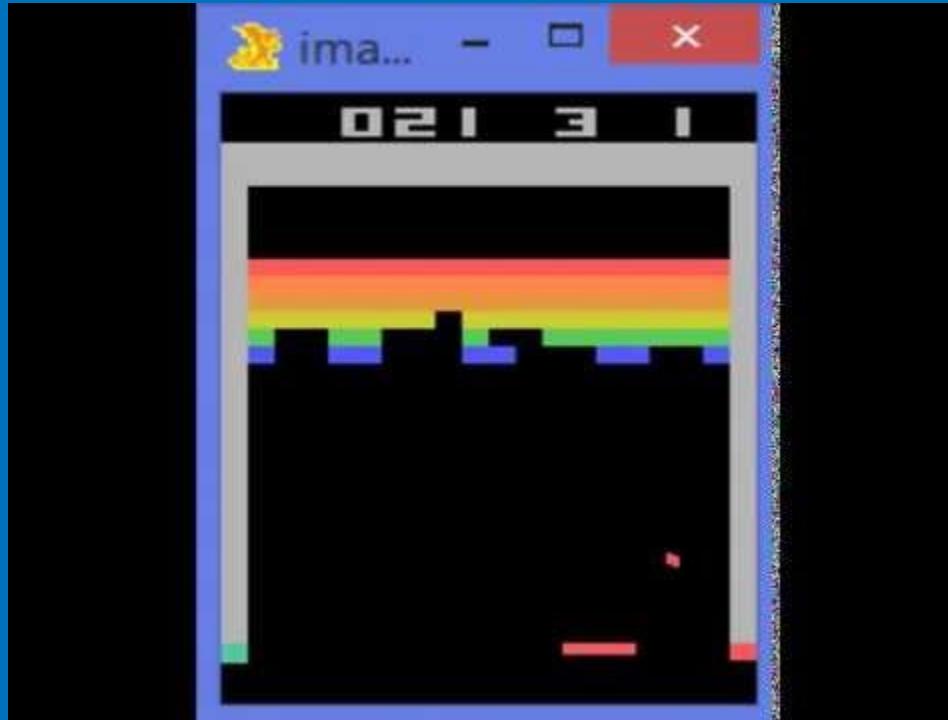
And everyone is using it.

- Google Page Ranking.
- Netflix Suggestions.
- Tinder, for you to “chill”
- Tesla Self Driving Cars, *Uber*.
- Political Campaign & Advertisement Campaigns
- Spam Filtering
- Google AdSense
- Bio-informatics
- Google “Allo”, Amazon “Alexa”
- Facebook Photo Tagging

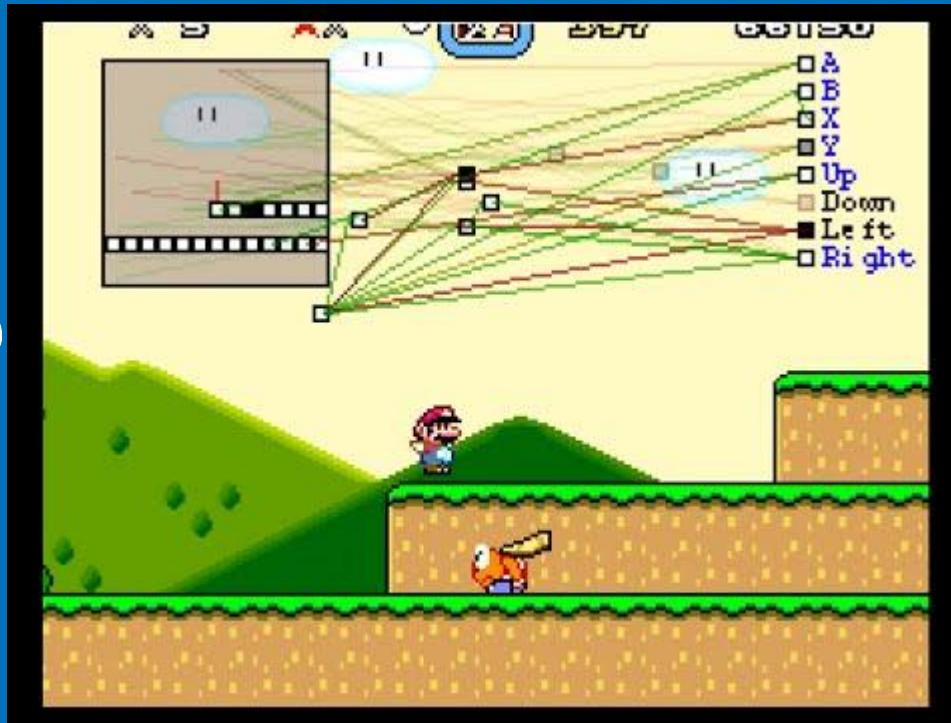
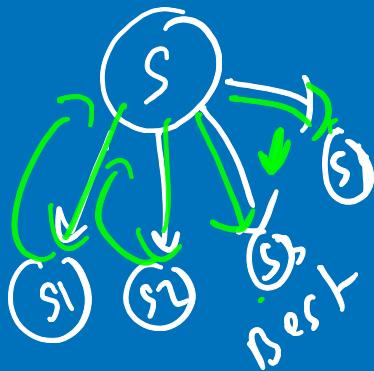
Self Driving Car



Google Deep Mind - Atari Player



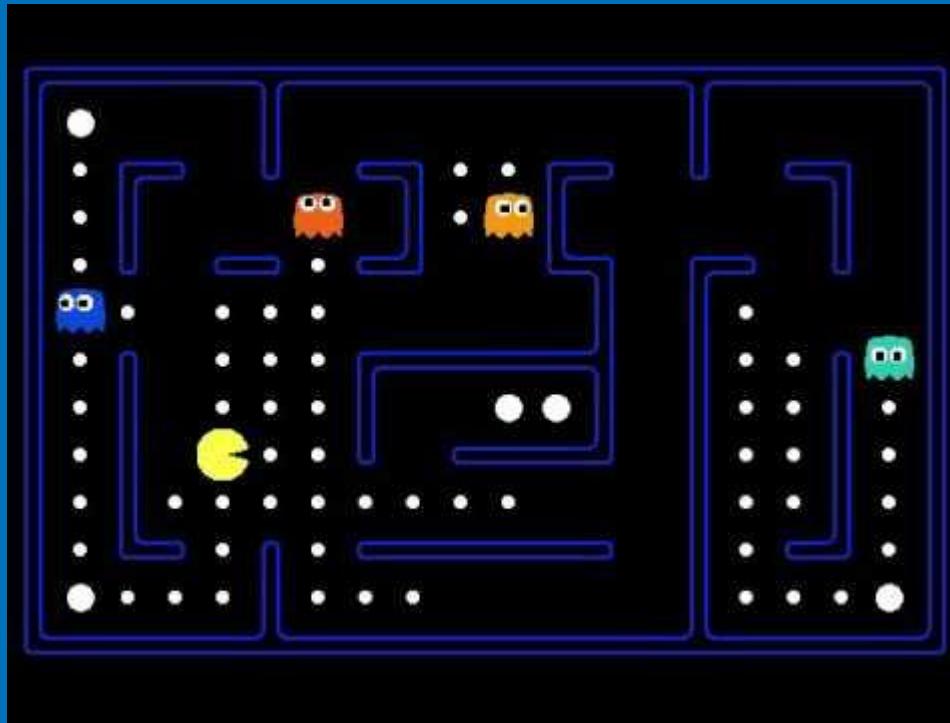
Neural Mario



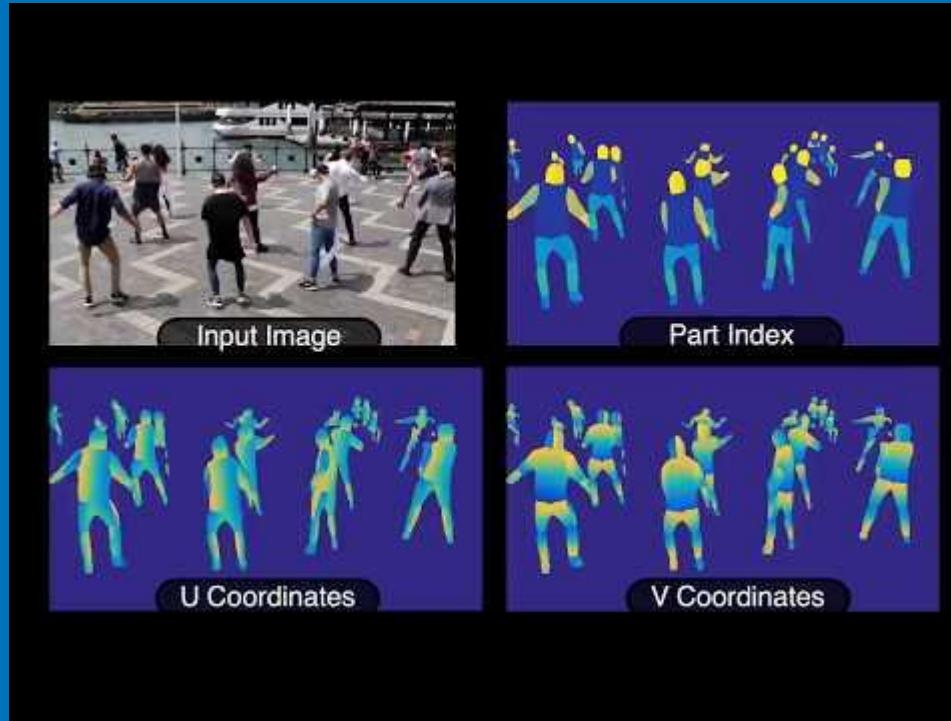
~~trying~~
Reinforcement
Angle
→ Speed

Deep Learning

Neural Networks - Pacman

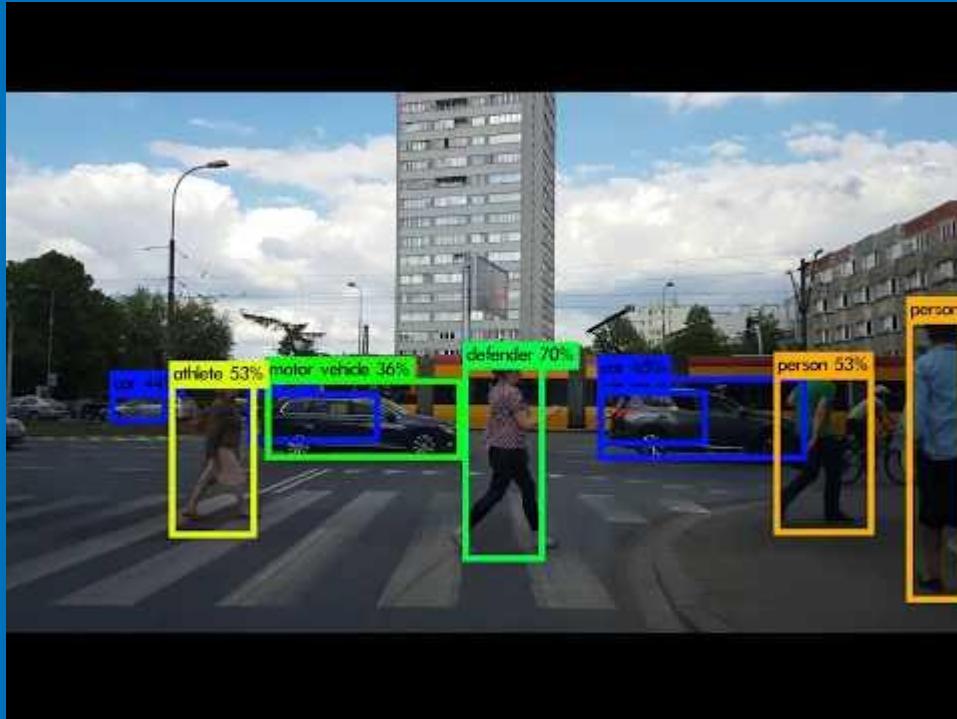


Dense Human Pose Estimation(CNN)



Object Detection

[YOLO (You Only Look Once)]



State
of the
art

Creating New Images

Input



Output



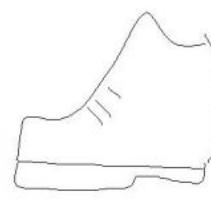
Input



Output



Input



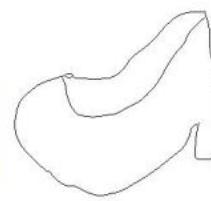
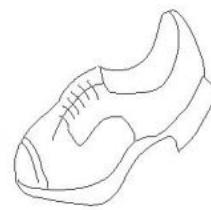
Output



Input

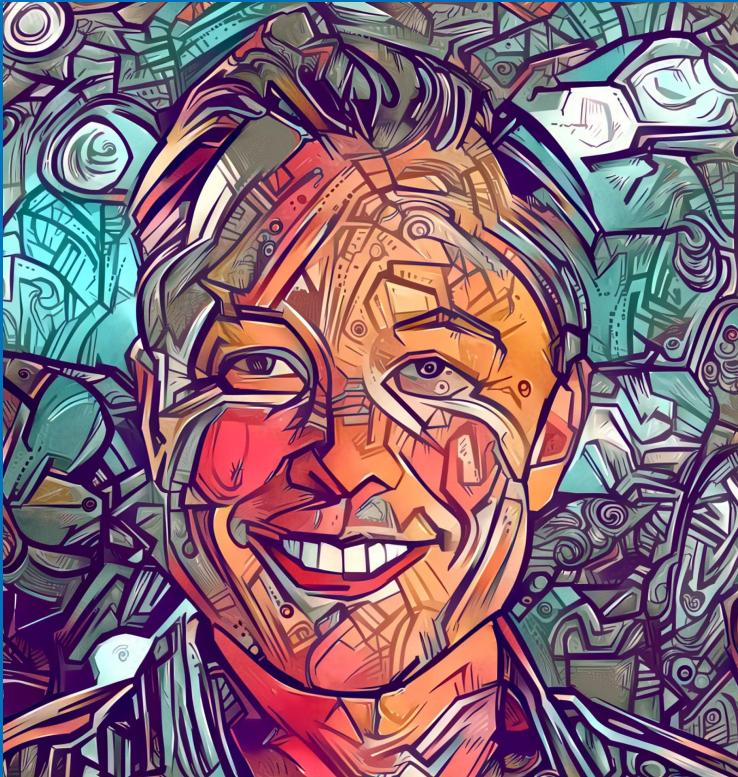


Output

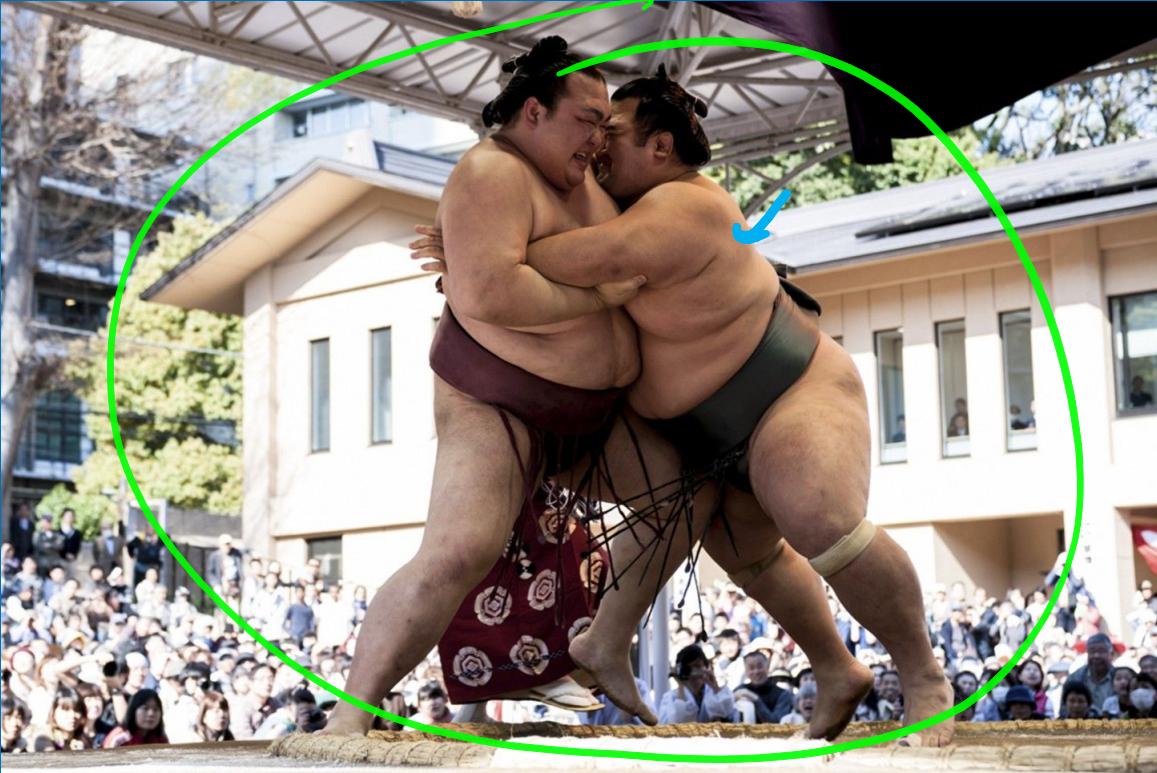


Neural Art

AI learned to paint



Story Generation from Images



Romantic-Novels
+ image ·

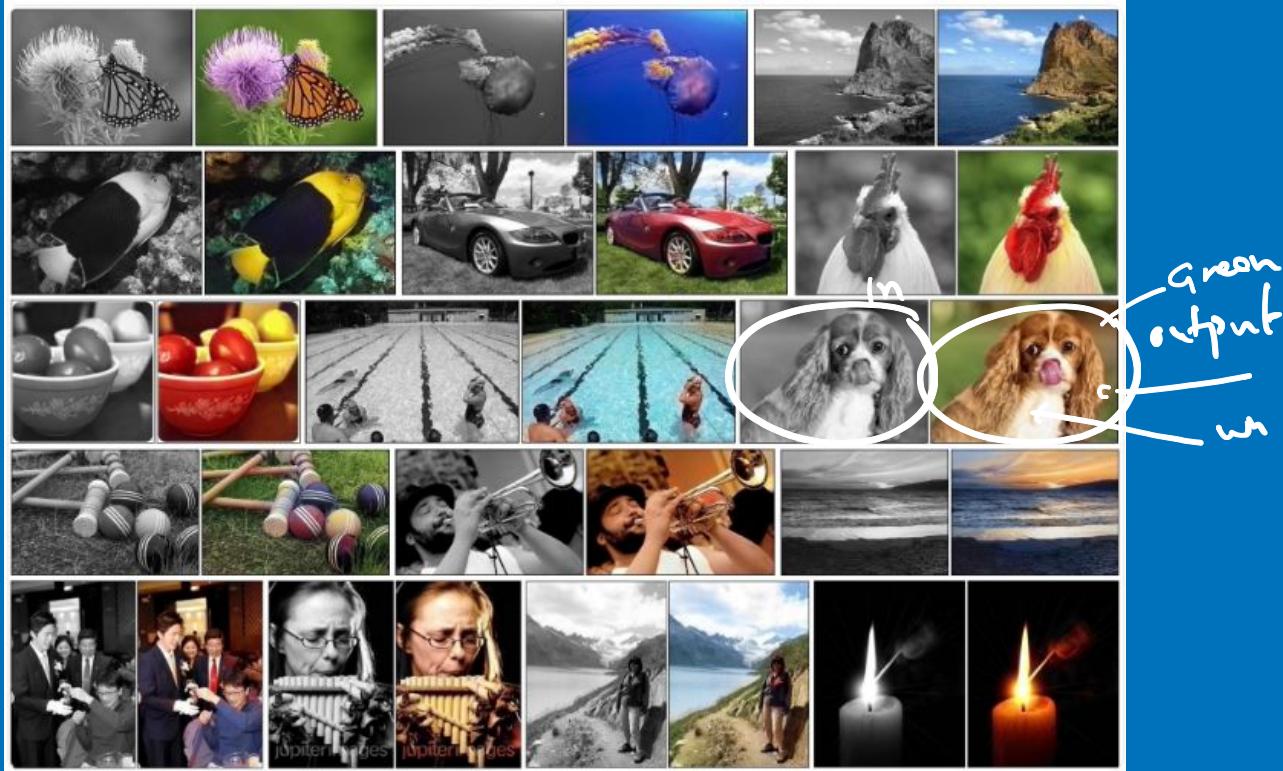
Generated story about image
Model: Romantic Novels

*"He was a shirtless man
in the back of his mind,
and I let out a curse as
he leaned over to kiss
me on the shoulder."*

*"He wanted to strangle
me, considering the be-
autiful boy I'd become
wearing his boxers."*

~~right~~

Colourizing Black & White Images/Videos



Colourizing Black & White Videos

The Lost World (1925)



~~pure~~
Computer

Language Translation



Automatic Handwriting Generation

Machine learning Mastery

Machine Learning Mastery

Machine Learning Mastery

Applications in NLP

- Language Modelling & Generation
- Named Entity Recognition
- Question Answering
- Speech Recognition & Generation
- Machine Translation

Chatbots & Conversational Engines
Context Based Queries
Bots that answer questions

Dialag
System
Understanding



Wikification

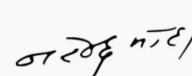
- Extracting important attributes (born, party, office, residence)
- Named Entities
- Category Tags [Multilabel classification]



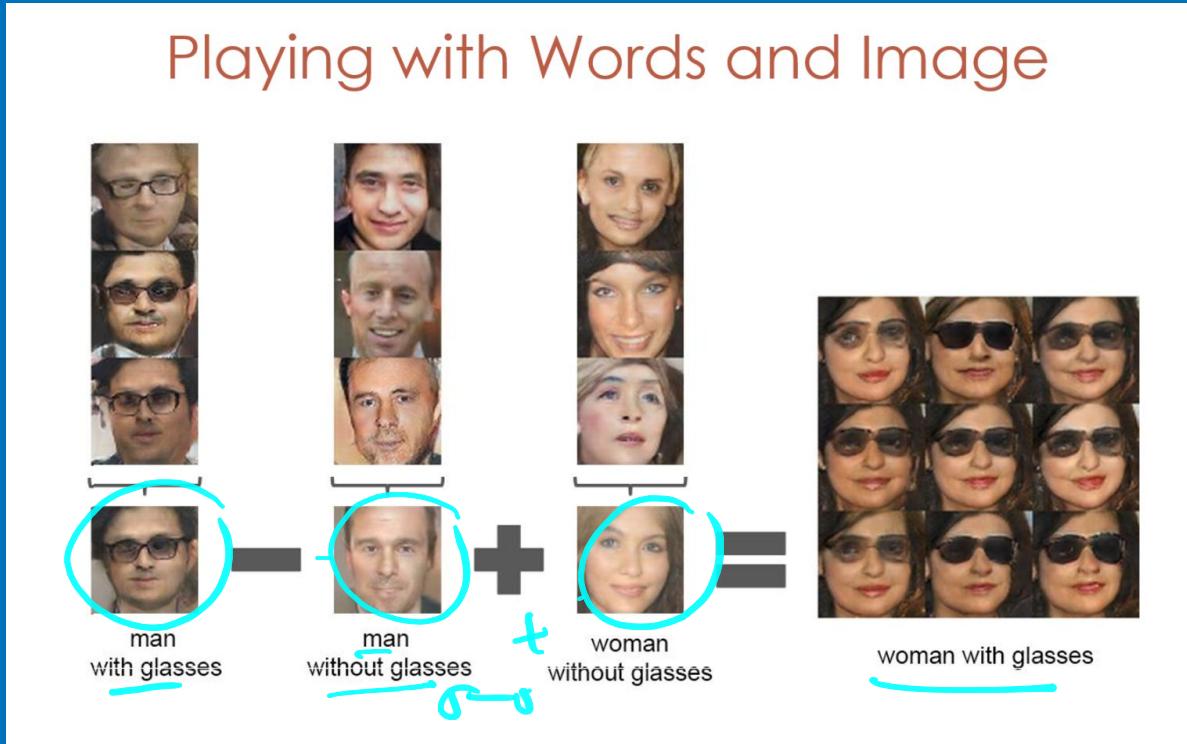
Narendra Modi
MP



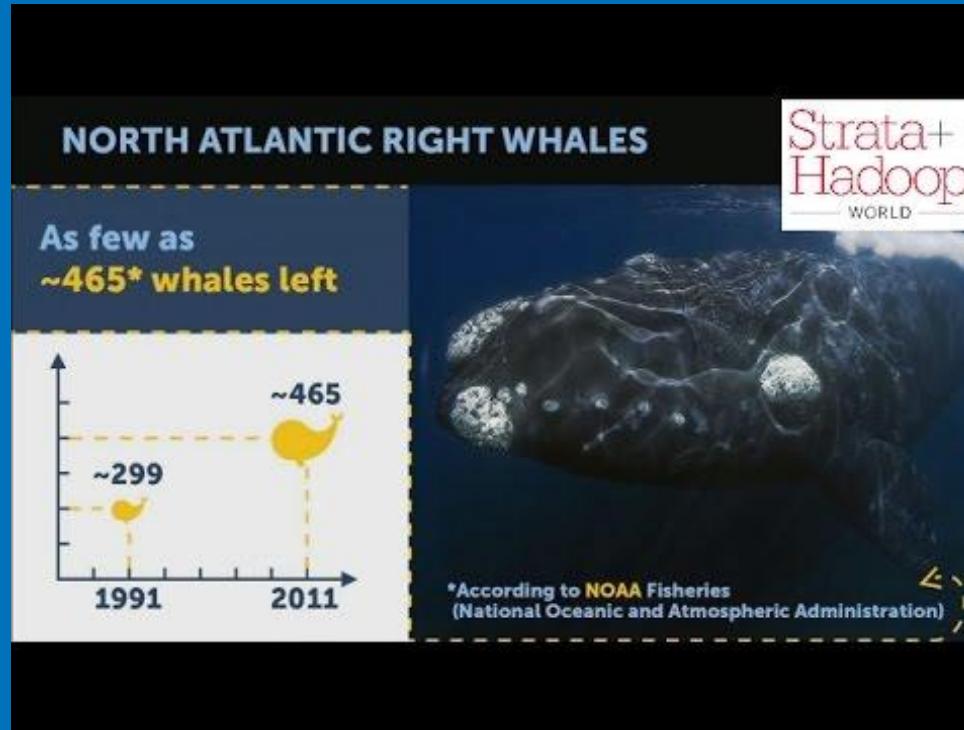
16th Prime Minister of India

In office	
1 January 2002 – 16 May 2014	
Preceded by Kamlesh Patel	
Succeeded by Suresh Patel	
Personal details	
Born	Narendra Damodardas Modi 17 September 1950 (age 67) Vadnagar, Bombay State, India (present-day Gujarat)
Political party	Bharatiya Janata Party
Spouse(s)	Jashodaben (m. 1968) (estranged)
Residence	7, Lok Kalyan Marg
Alma mater	University of Delhi Gujarat University
Signature	
Website	Official website  Government website 

Play with Words and Image (Word2Vec)



Analysis Population on Whales



Challenges

Why not use Machine Learning for everything?

- Computation cost
 - Data Availability
 - Requires research supervision
- 

Future

- pseudo-Human-like behaviour
 - Autonomous Vehicles
 - Advanced Chat AI
 - Environment Exploration
 - Knowledge Bases
-

Let's get started !

Some Common Terms

Input Features

$$\chi = (\chi_1, \chi_2, \chi_3, \dots, \chi_f)$$

Training Set ✓

$$x^0, y^0$$

$$x^1, y^1$$

$$x^2, y^2$$

$$\vdots$$

Test Set

Hypothesis

$$(x_0^{(i)}, x_1^{(i)}, \dots, x_f^{(i)})$$

$$x^0, y^0$$

$$x^1, y^1$$

$$x^2, y^2$$

$$\vdots$$



Area = 100
Floors = 2

$\chi^{(i)}$ → i^{th} example

$x_j^{(i)}$ → j^{th} feature of
 i^{th} example.

Price = 1000.

Supervised Learning

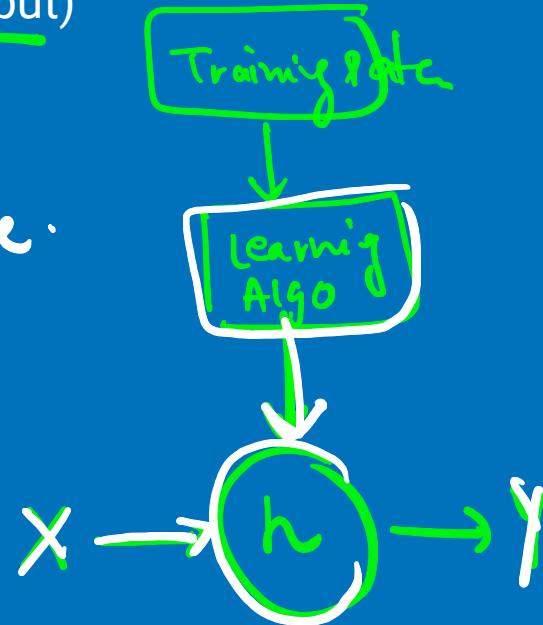
Goal : To find a hypothesis that maps X(input) to Y(output)

$$H: X \rightarrow Y$$

$$\underline{h(x)} = \theta_0 + \theta_1 x_i$$

↓
Predicted value of the house.

$y_i \rightarrow$ Actual value.



Supervised Learning [\underline{X} , \underline{Y}]
for Training
Data
Two types of Problems in Supervised Learning

- 1) Regression (predict continuous value output)
 \rightarrow Housing Area, Stock Price.
- 2) Classification \rightarrow [Discrete classes.
 \downarrow (3 outputs) fruit size color shape]


Linear Regression

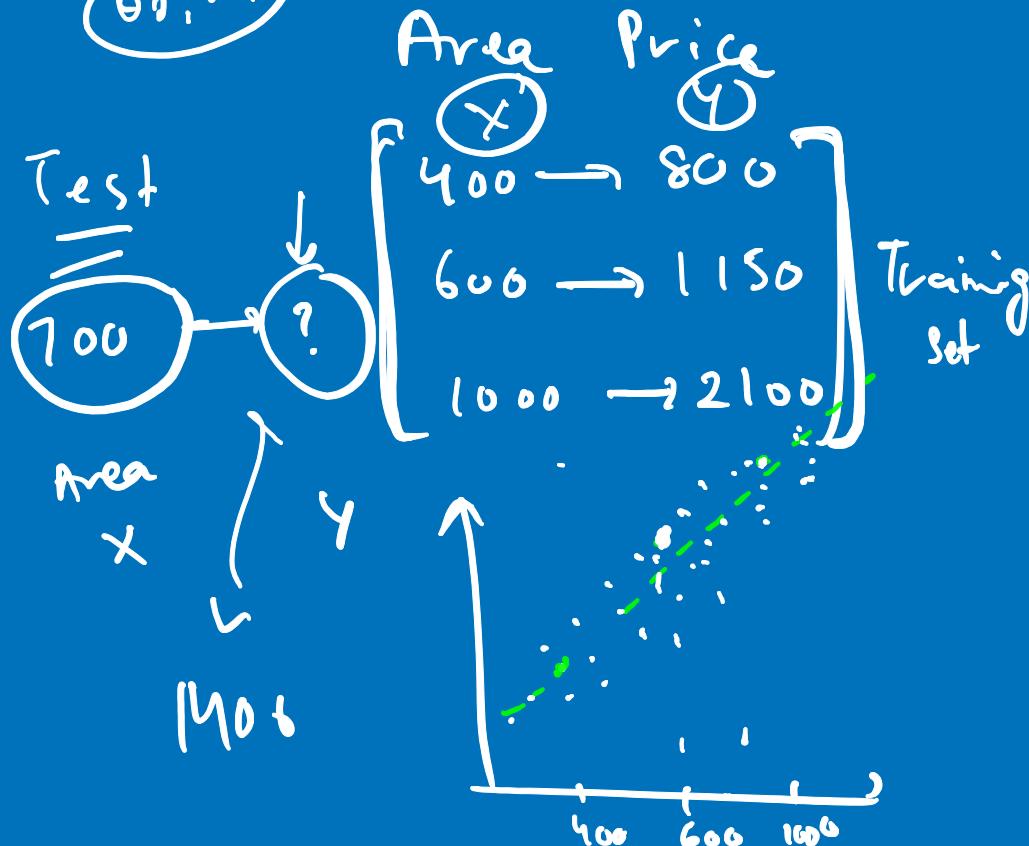
$$y = \underline{m}x + \underline{c}$$

$$y = \theta_1 x + \theta_0$$

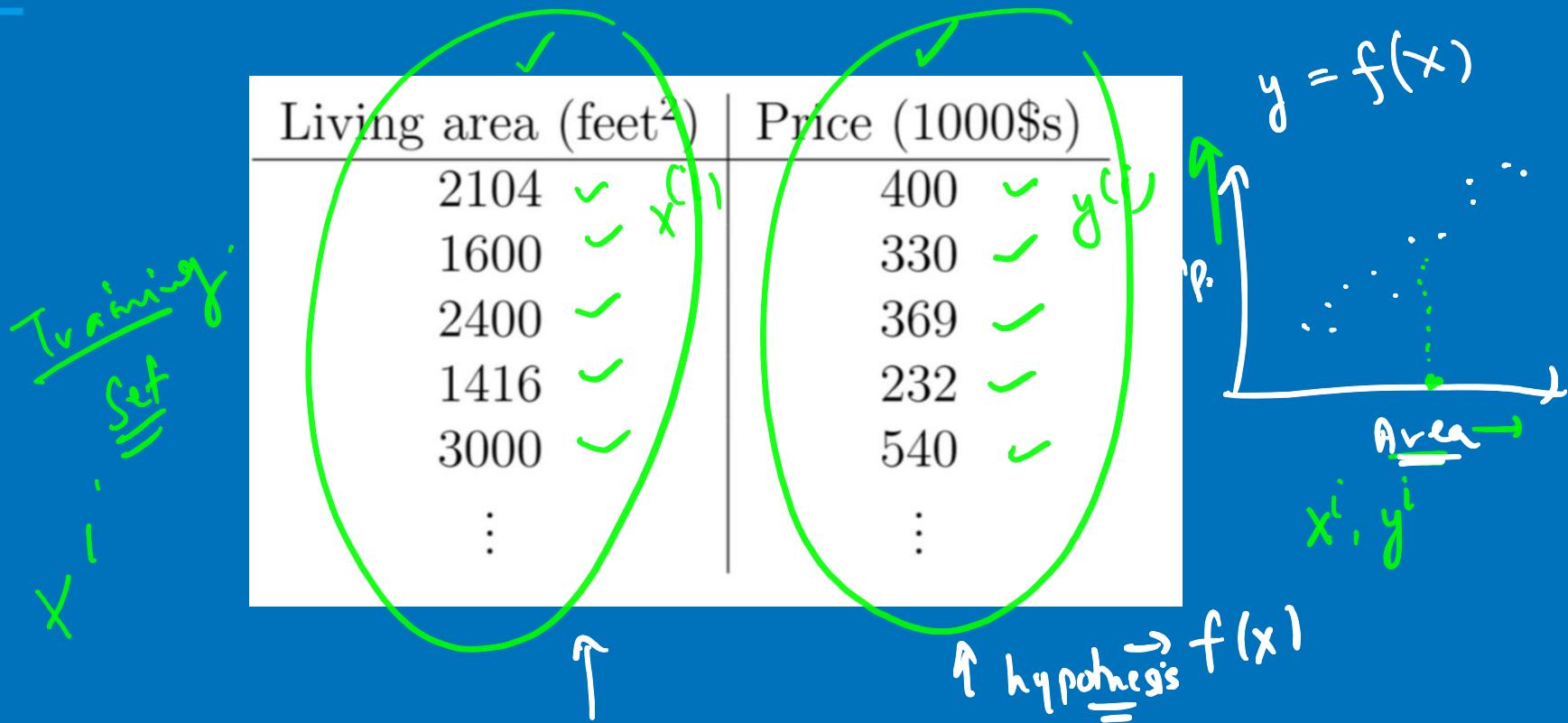
hypothesis → figure out θ_0, θ_1

Goal :

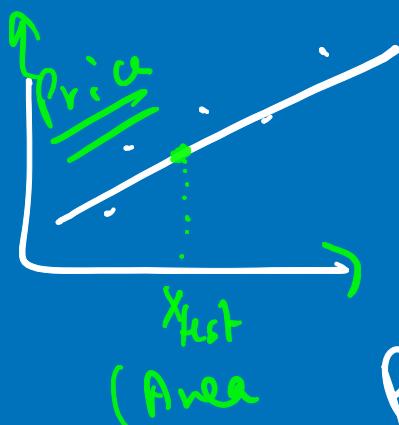
continuous output
Goal θ_0, θ_1



Motivational Problem - Housing Prices (Andrew Ng)



Goal ?



Given some. (x, y)

to find θ_0, θ_1 ?

x_0	y_0
x_1	y_1
x_2	y_2
\vdots	
x_n	y_n

Predict
given: x_{test} .
find $f(x_{test})$

$$= h(x_{test}) = \underline{\theta_0 + \theta_1 x_{test}}$$

Generalised Hypothesis

$$h(x) = \theta_1 x + \theta_0 \quad (\text{1 feature})$$

Area

Generalised

$$h(x) = \theta_0 + \theta_1 x_1 + \theta_2 x_2 + \theta_3 x_3 + \dots + \theta_n x_n$$

$$h(x) = \sum_{i=0}^n \theta_i x_i$$

(n features)

$$x = (x_0, x_1, x_2, \dots, x_n)$$

↓ ↓
Area Rooms ...

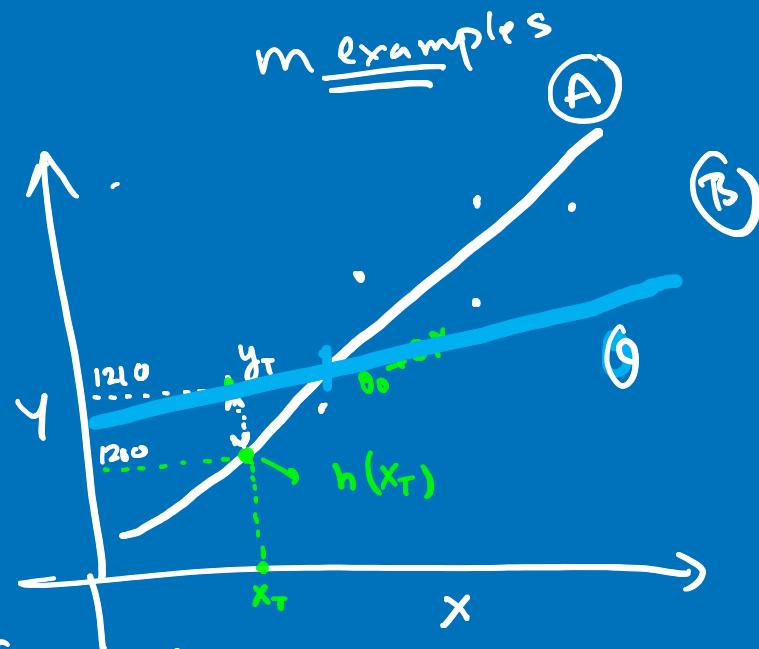
$$x_0 = 1$$

Good Measure of Error

which is the Best line?
↓
minimizers
total error.

how to measure the error?

Total squared error = $\sum_{i=1}^m \left(y_i - h(x_i) \right)^2$



- ① Differentiable
- ② (Nice Prob. Interpretation)

What should be the next step ?

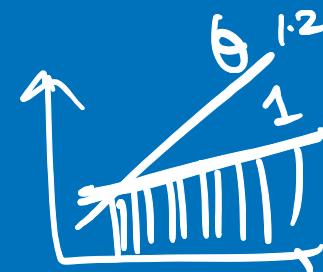
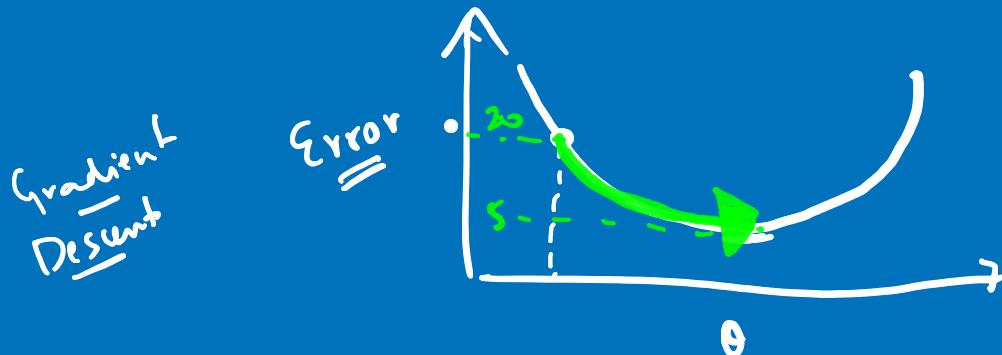
HINT : Most of the Machine Learning is about Optimization problems.

here we need \rightarrow Min Error over all examples.

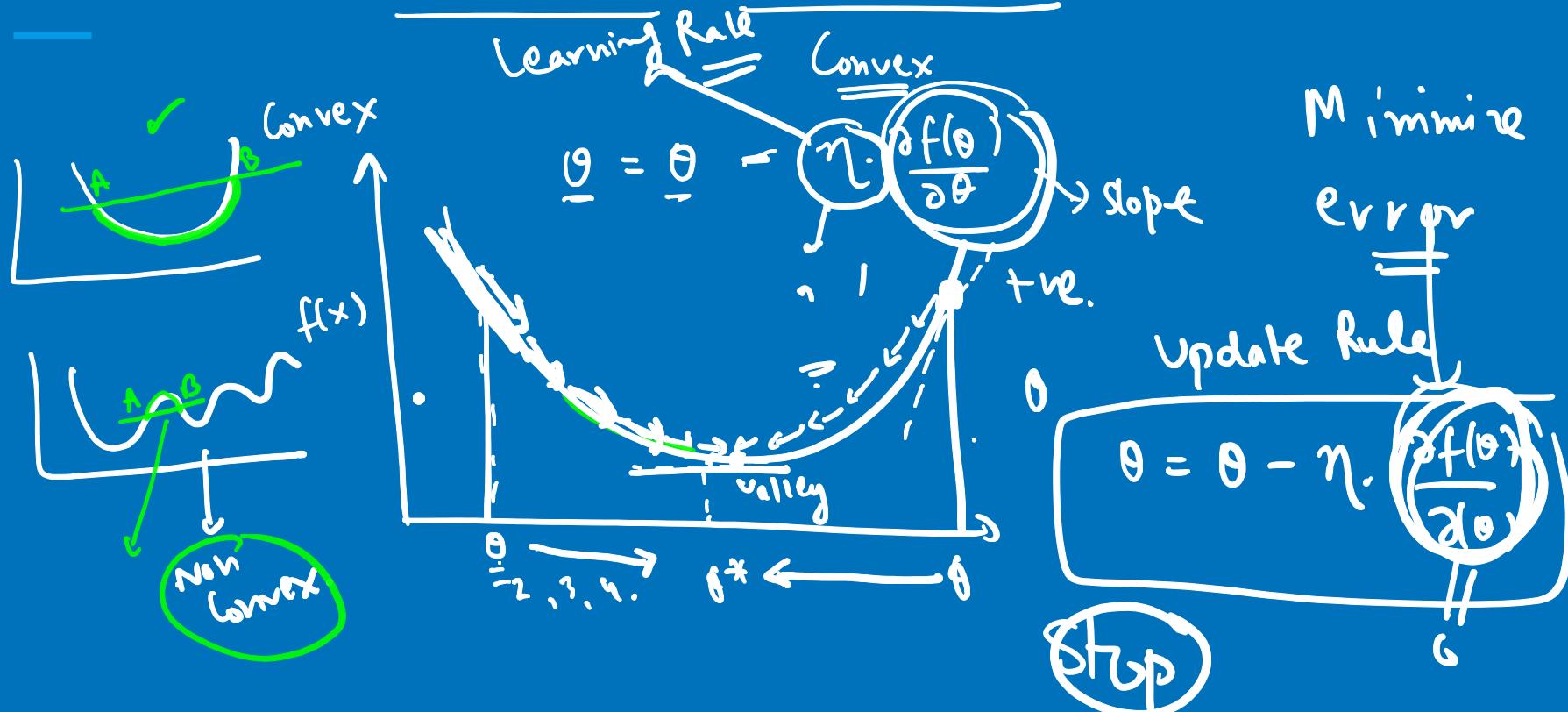
e \rightarrow polynomial in degree 2.

$$\underline{ax^2 + bx + c}$$

$$\text{Error} = f(\theta)$$

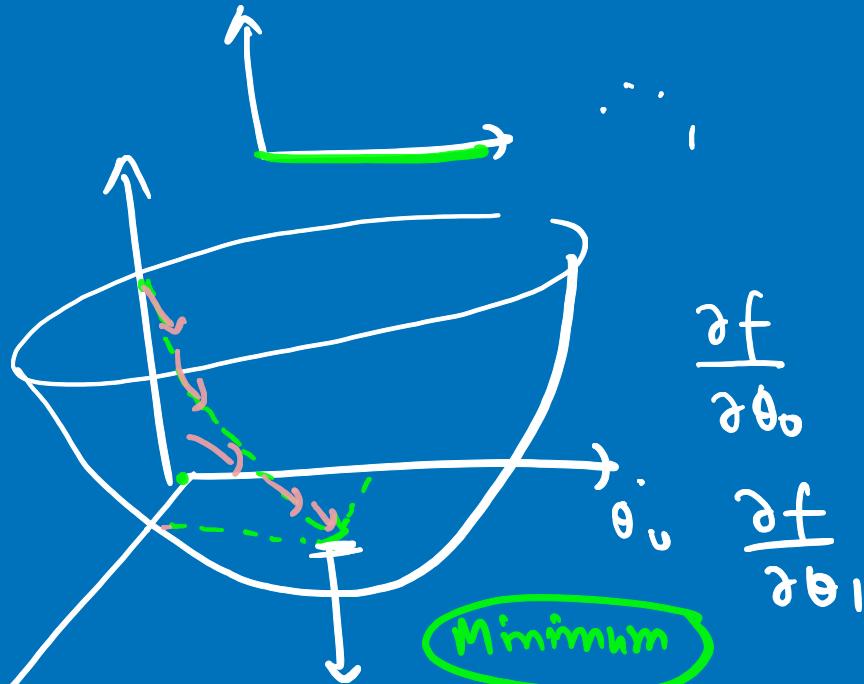


Optimize a Quadratic Polynomial in x



Convex Function

$$\text{Error} = \sum_{i=1}^m \left(\underline{h(x)} - y_i \right)^2$$
$$f(\theta_0, \theta_1) = \sum \left((\theta_0 + \theta_1 x_i)^2 - y_i \right)^2$$
$$\theta = \theta - \eta \cdot \frac{\partial f(\theta)}{\partial \theta}$$

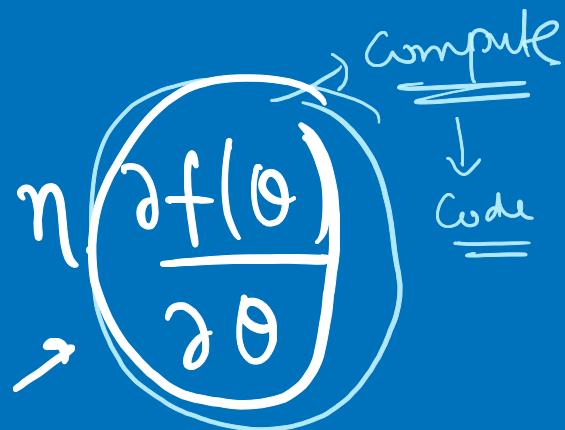


Gradient Descent | Algorithm

$$\theta = \text{Rand.} \quad \left. \begin{array}{l} \theta_0 = 0.1 \\ \theta_1 = 0.2 \end{array} \right\}$$

while (!converge)

$$\theta = \theta - n$$



$$\begin{array}{l} \theta_0 = \\ \theta_1 = \end{array}$$

Gradient Descent : Update Rule

Calculating Gradient

$$\begin{aligned}\frac{\partial}{\partial \theta_j} J(\theta) &= \frac{\partial}{\partial \theta_j} \frac{1}{2} (h_{\theta}(x) - y)^2 \\&= 2 \cdot \frac{1}{2} (h_{\theta}(x) - y) \cdot \frac{\partial}{\partial \theta_j} (h_{\theta}(x) - y) \\&= (h_{\theta}(x) - y) \cdot \frac{\partial}{\partial \theta_j} \left(\sum_{i=0}^n \theta_i x_i - y \right) \\&= (h_{\theta}(x) - y) x_j\end{aligned}$$

$x_0 = 1 \quad x_j$

θ_0
 $h_{\theta}(x) - y$
 $(h_{\theta}(x) - y) x_j$
 \leftarrow
 θ_1

Let us work it out!

for one example x, y .

$$J(\theta) = \frac{1}{2} (h_{\theta}(x) - y)^2$$

one example (1)

$$\frac{\partial J(\theta)}{\partial \theta_0} = \frac{1}{2} [h_{\theta}(x) - y] \cdot \frac{\partial}{\partial \theta_0} (\theta_0 + \theta_1 x) = 1$$

for examples (2)

$$\frac{\partial J(\theta)}{\partial \theta_1} = h_{\theta}(x) - y = - \sum_{i=1}^n (h_{\theta}(x_i) - y_i) \left(\frac{\partial J(\theta)}{\partial \theta_1} \right) = x$$

Final Update

$$= \sum_{i=1}^m (h_\theta(x) - y) \cdot x$$

$$\begin{cases} \theta_0 = \theta_0 + n \cdot (y - h_\theta(x)) \\ \theta_1 = \theta_1 + n \cdot (y - h_\theta(x)) \end{cases}$$

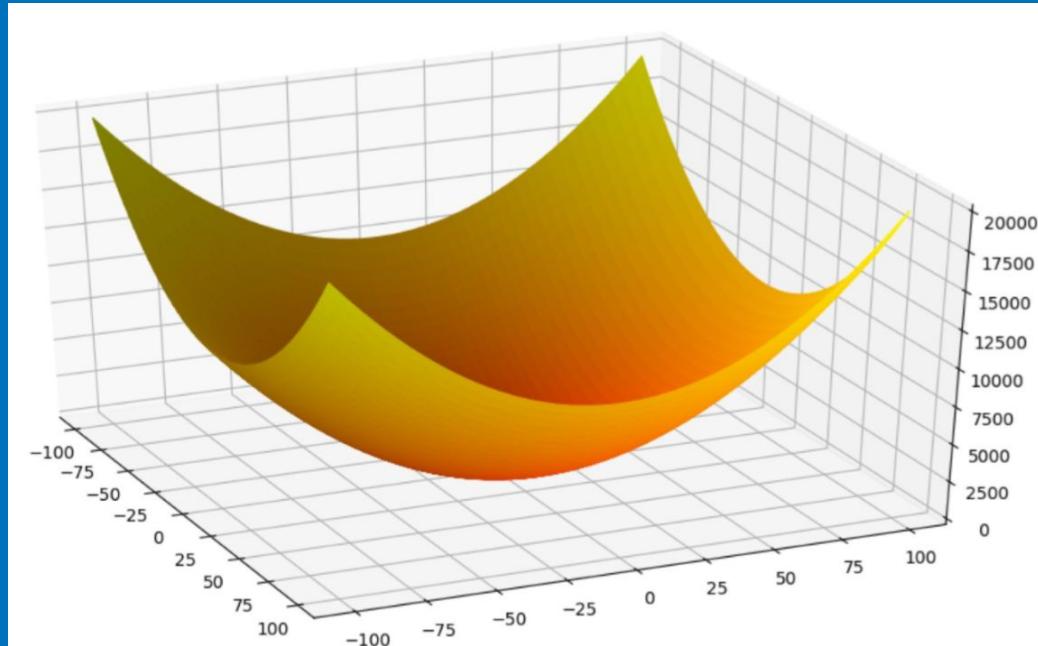
Repeat until convergence {

$$\theta_j := \theta_j + \alpha \sum_{i=1}^m (y^{(i)} - h_\theta(x^{(i)})) x_j^{(i)} \quad (\text{for every } j).$$

}



How does Error Surface look like ?

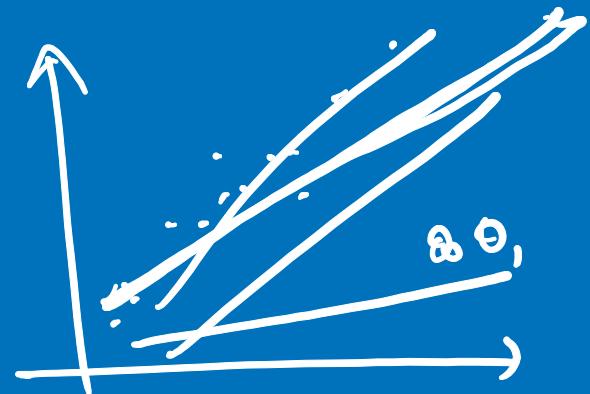


Gradient Descent Algorithm

Linear Regression is ...

- ~~Fit θ to minimize loss (Training Time)~~
- ~~Output $\theta^T X$ (Prediction)~~

$$x_T \Rightarrow \text{Predict}$$
$$\underline{\theta_0 + \theta_1 x_T}$$



Lets Code !

Developer Checklist

- Python3
- Jupyter-Notebook(optional)
- Pandas
- Numpy
- Matplotlib

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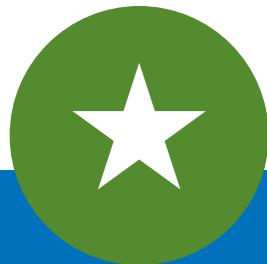
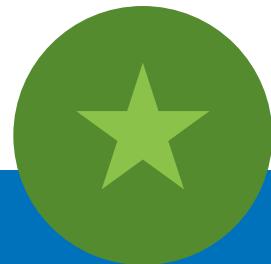
MCA
Logistic Regression
is — !

On the
July end / Aug
4 months
wt of stuff

- ① Regression
- ② Classification
- ③ Supervised
- ④ Unsupervised
- ⑤ None



Thank You



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