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CS540 Introduction to Artificial Intelligence Lecture 1

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Based on lecture slides by Jerry Zhu, Yingyu Liang, and Charles Dyer

May 23, 2022

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- Download the Socrative App or go to the Socrative website.
- Use Room CS540E log in with wisc ID.
- Choose "E" for the first question Q1.

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Logistics, Grading

- Everything is on the course website.
- Talk about these and answer questions at the end of the lecture.

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What is Al Motivation

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Is This Face Real

- Which face is real?
- *A* : Left
- B :
- C :
- D :
- E : Right
- (Do not choose B, C, D.)

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Is This Face Real

- How is the real face different from the fake one?
- Short answer.
- (Write something random if you do not know: Do not leave it blank.)

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Socrative Admin

• Submit a regrade request if you missed any questions or selected the incorrect answer by mistake.

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Generative Adversarial Network Motivation

- Generative Adversarial Network (GAN):
- **(** Generative part: input random noise and output fake images.
- Oiscriminative part: input real and fake images and output labels real or fake.
- The two parts compete with each other.

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Supervised Learning Example 1

| Data | images of cats and dogs |
|------------------|----------------------------|
| Features (Input) | height, length, eye color, |
| Labels (Output) | cat or dog |

| Data | images of 1000 object classes |
|------------------|-------------------------------|
| Features (Input) | pixel information |
| Labels (Output) | turtle or rifle |

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Supervised Learning Example 2 Motivation

| Data | handwritten characters |
|------------------|---------------------------------------|
| Features (Input) | pixel intensity, stroke, |
| Labels (Output) | δ or $\sigma, arphi$ or ψ |

| Data | voice recording |
|------------------|--|
| Features (Input) | signal, sound (phoneme), |
| Labels (Output) | recognize speech or wreck a nice beach |

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Supervised Learning Example 3 Motivation

| Data | medical records |
|------------------|--------------------------------|
| Features (Input) | scan, blood, and test results, |
| Labels (Output) | cancer or no cancer |

| Data | patient information |
|------------------|-------------------------------|
| Features (Input) | age, pre-existing conditions, |
| Labels (Output) | cancer or no cancer |

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Supervised Learning Example 4

| Data | emails |
|------------------|-----------------------------|
| Features (Input) | word count, capitalization, |
| Labels (Output) | spam or ham |

| Data | comments |
|------------------|-----------------------------|
| Features (Input) | word count, capitalization, |
| Labels (Output) | offensive or not |

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Supervised Learning Example 5 Motivation

| Data | face images |
|------------------|------------------|
| Features (Input) | edges, corners, |
| Labels (Output) | face or non-face |

| Data | self-driving car data |
|------------------|------------------------------------|
| Features (Input) | color, distance (depth), movement, |
| Labels (Output) | road or car or pedestrian |

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Supervised Learning Example 6

| Data | book or movie reviews |
|------------------|-----------------------------|
| Features (Input) | word count, capitalization, |
| Labels (Output) | positive or negative |

| Data | financial transactions |
|------------------|------------------------|
| Features (Input) | amount, frequency, |
| Labels (Output) | fraud or not |

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Supervised Learning Example 7 Motivation

| Data | painting | |
|------------------|--------------------|--|
| Features (Input) | appearance, price, | |
| Labels (Output) | art or garbage | |

| Data | essay | | |
|------------------|--------------------|--|--|
| Features (Input) | length, key words, | | |
| Labels (Output) | A+ or F | | |

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Motivation

• Supervised learning:

| Data | Features | Labels | - |
|--------|----------------------------------|-------------------|-------------------------------|
| Sample | $\{(x_{i1},,x_{im})\}_{i=1}^{n}$ | $\{y_i\}_{i=1}^n$ | find "best" \hat{f} |
| - | observable | known | - |
| New | $(x'_1,, x'_m)$ | у′ | guess $\hat{y} = \hat{f}(x')$ |
| - | observable | unknown | - |

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Training and Test Sets

• Supervised learning:

| Data | Features | Labels | - |
|------------|-----------------------------------|----------------------|-------------------------------|
| Training | $\{(x_{i1},,x_{im})\}_{i=1}^{n'}$ | $\{y_i\}_{i=1}^{n'}$ | find "good" \hat{f} |
| - | observable | known | - |
| Validation | $\{(x_{i1},,x_{im})\}_{i=n'}^n$ | $\{y_i\}_{i=n'}^n$ | find "best" \hat{f} |
| - | observable | known | - |
| Test | $(x'_1,, x'_m)$ | y' | guess $\hat{y} = \hat{f}(x')$ |
| - | observable | unknown | _ |

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Simple 2D Example Diagram

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Linear Classifier

- One possible guess is in the form of a linear classifier. $\hat{y} = \mathbb{1}_{\{w_1 x_1 + w_2 x_2 + ... + w_m x_m + b \ge 0\}}$ $= \mathbb{1}_{\{w^T x_+ b \ge 0\}}$
- The 1 (open number 1) is the indicator function.

$$\mathbb{1}_E = \begin{cases} 1 & \text{if } E \text{ is true} \\ 0 & \text{if } E \text{ is false} \end{cases}$$

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Brute Force LTU Learning

Motivation

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Perceptron Algorithm

- Initialize random weights.
- Evaluate the activation function at one instance x_i to get \hat{y}_i .
- If the prediction ŷ_i is 0 and actual y_i is 1, increase the weights by x_i.
- If the prediction ŷ_i is 1 and actual y_i is 0, decrease the weights by x_i.
- Repeat for all data points and until convergent.

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Perceptron Algorithm Diagram Description

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Perceptron Algorithm

• Update weights using the following rule.

$$w = w - \alpha (a_i - y_i) x_i$$
$$b = b - \alpha (a_i - y_i)$$
$$a_i = \mathbb{1}_{\{w^T x_i + b \ge 0\}}$$

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Perceptron Algorithm

• Let the learning rate be $\alpha = 0.2$. Currently $w = \begin{bmatrix} 0.2 & 0.7 & 0.9 \end{bmatrix}^T$, b = -0.7, and $x_i = \begin{bmatrix} 0 & 0 & 1 \end{bmatrix}^T$ and $y_i = 0$. What is the updated weights $\begin{bmatrix} w \\ b \end{bmatrix}$?

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Perceptron Algorithm, Answer

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Perceptron Algorithm, Another One

• Let the learning rate be
$$\alpha = 0.1$$
. Currently
 $w = \begin{bmatrix} 0.2 \\ -0.3 \end{bmatrix}, b = 0.4$, and $x_i = \begin{bmatrix} 0 \\ 1 \end{bmatrix}$ and $y_i = 1$. What is the
updated weights $\begin{bmatrix} w \\ b \end{bmatrix}$?
• $A : \begin{bmatrix} 0.2 \\ -0.3 \\ 0.4 \end{bmatrix}, B : \begin{bmatrix} 0.2 \\ -0.2 \\ 0.5 \end{bmatrix}, C : \begin{bmatrix} 0.2 \\ -0.4 \\ 0.3 \end{bmatrix}$
• $D : \begin{bmatrix} 0.2 \\ -0.2 \\ 0.3 \end{bmatrix}, E : \begin{bmatrix} 0.2 \\ -0.4 \\ 0.5 \end{bmatrix}$

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Perceptron Algorithm, Another One, Answer Quiz

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Perceptron Algorithm, Another One Too

• Let the learning rate be
$$\alpha = 0.1$$
. Currently
 $w = \begin{bmatrix} 0.2 \\ -0.3 \end{bmatrix}, b = 0.4, \text{ and } x_i = \begin{bmatrix} 0 \\ 1 \end{bmatrix} \text{ and } y_i = 0.$ What is the
updated weights $\begin{bmatrix} w \\ b \end{bmatrix}$?
• $A : \begin{bmatrix} 0.2 \\ -0.3 \\ 0.4 \end{bmatrix}, B : \begin{bmatrix} 0.2 \\ -0.2 \\ 0.5 \end{bmatrix}, C : \begin{bmatrix} 0.2 \\ -0.4 \\ 0.3 \end{bmatrix}$
• $D : \begin{bmatrix} 0.2 \\ -0.2 \\ 0.3 \end{bmatrix}, E : \begin{bmatrix} 0.2 \\ -0.4 \\ 0.5 \end{bmatrix}$

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Perceptron Algorithm, Another One Too, Answer