# DATASCI 207

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#### Bio

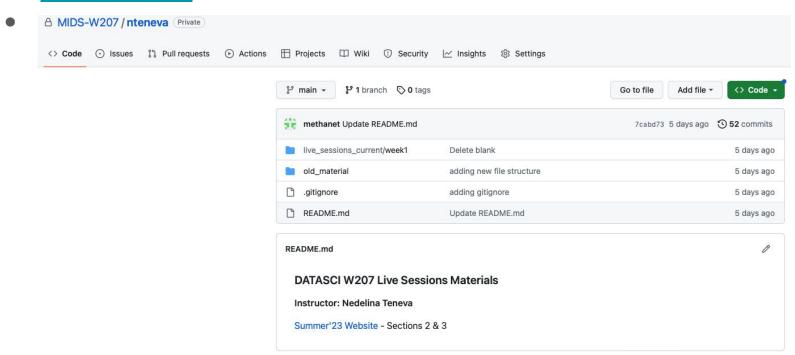
- Currently at Megagon Labs (R&D lab focusing on fundamental ML research)
- Previously at ML Science Manager at Amazon Alexa
- PhD from University of Chicago (focusing on optimization)
- Background in Molecular Biology

#### You?

- (Under) graduate major
- Current job/occupation (if any)
- Why a Masters in Data Science?

#### **Announcements**

Course Website



#### Objectives

- Intro to our first ML technique: linear regression (LR)
- Learning about how to solve LR
- Basic LR and a Tensorflow example: review after class!
  - https://github.com/MIDS-W207/nteneva/blob/main/live sessions current/week2/Week 2 Linear Regression Lipynb

#### Linear Regression

- Why do we use linear regression?
- What assumptions does LR make for the relationship between outcomes (y) and features (X)?

#### **Linear Regression**

- Why do we use linear regression?
- What assumptions does LR make for the relationship between outcome (y) and features (X)?
- Linear Algebra notation

X: matrix of size (n, m) - inputs/features/covariates/independent var's...

y: vector of size n (column by definition) - output/dependent var's/response...

**Model**:  $y = X\beta + e$ 

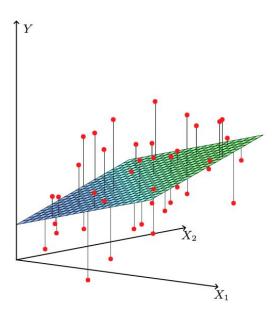
 $\beta$ : vector of size m - parameters/weights

e: vector of size n - error/noise

**Goal**: estimate  $\beta$  s.t. the noise/error e is minimized

### **Linear Regression**

Source: ESL II



**FIGURE 3.1.** Linear least squares fitting with  $X \in \mathbb{R}^2$ . We seek the linear function of X that minimizes the sum of squared residuals from Y.

#### Example

Based on the data and regression line, what is:

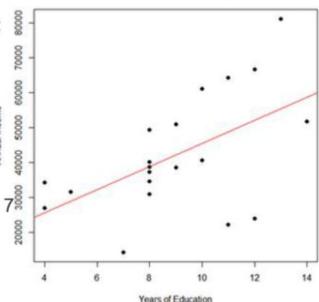
 the actual income for the individual with 7 years of education?

#### \$5000

the predicted income for an individual with 7<sup>g/g</sup> years of education?

#### \$35000





#### How do we compute LR?

- Direct methods
  - See <a href="https://www.cs.toronto.edu/~rgrosse/courses/csc321\_2017/readings/L02%20Linear%20Regression.pdf">https://www.cs.toronto.edu/~rgrosse/courses/csc321\_2017/readings/L02%20Linear%20Regression.pdf</a>

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Iteratively

## What is gradient descent?

#### Gradient descent: key components

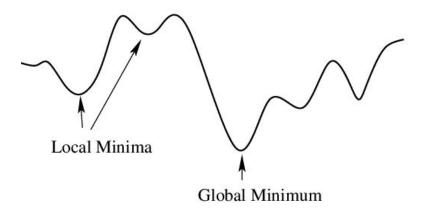
- Model
- Parameters
- Cost function
- Objective: minimize the cost function

#### Optimization

- What is global minimum?
- What is local minimum?
- How how we avoid local minima?

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### When do we stop iterating?

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- When the validation error stops improving (i.e., difference between step t and t +1 is below some threshold)
- Based on the loss

#### Hyperparameters

- What are hyperparameter? Examples?
- How are they different from the parameters?

# Hyperparameters

- Examples
  - Batch size
  - Learning rate
  - o Epochs

How do we set their values?

### Hyperparameters

- Examples
  - Batch size
  - Learning rate
  - Epochs

- How do we set their values?
  - Hyper parameter optimization using e.g. cross validation