# KNEAREST NEIGHBORS

#### **60 GENERAL ASSEMBLY**

Whats cool in ML? <a href="http://www.sciencemag.org/content/350/6266/1332.full">http://www.sciencemag.org/content/350/6266/1332.full</a>

Review / Exit Tickets Numpy

Project Overview Various topics Milestone 1

#### **AGENDA**

Goals for the session:

- Finish up Pandas
- First Learning model!

#### **PANDAS OVERVIEW**

Let's see some more interesting tools using pandas

**Pandas**– A scientific computing library built for python on top of numpy, providing high performance data structures and operations on those data structures

Brings data aggregation and split-apply-combine features to Python, ala Excel++.

#### categorical continuous supervised classification regression unsupervised dimension reduction clustering

# Here's (part of) an example dataset:

#### Fisher's iris dataset (1936)

sepal_length	sepal_width	petal_length	petal_width	species
5.1	3.5	1.4	0.2	setosa
4.9	3.0	1.4	0.2	setosa
7.0	3.2	4.7	1.4	versicolor
6.4	3.2	4.5	1.5	versicolor
6.3	3.3	6.0	2.5	virginica
5.8	2.7	5.1	1.9	virginica

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independent variables (also called *features*)

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independent variables (also called *features*)

class labels (qualitative)

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X = independent variables
 (also called features)

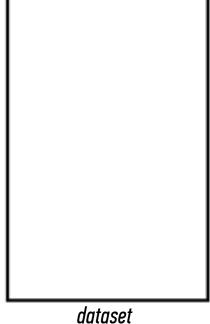
y = class labels
 (qualitative)

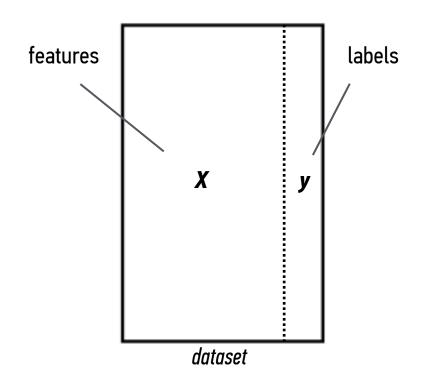
Q: What does "supervised" mean?

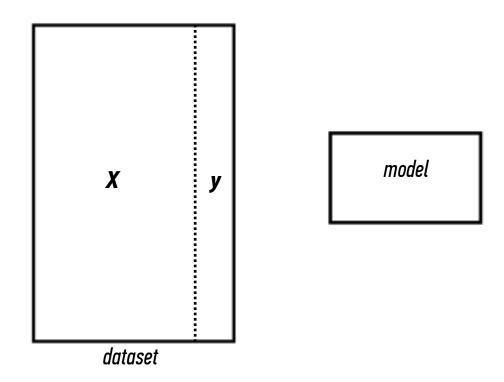
# Q: What does "supervised" mean?

A: We know the labels.

sepal_length	sepal_width	petal_length	petal_width	species
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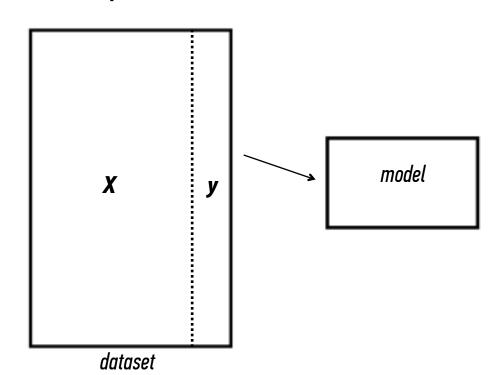


1) train model

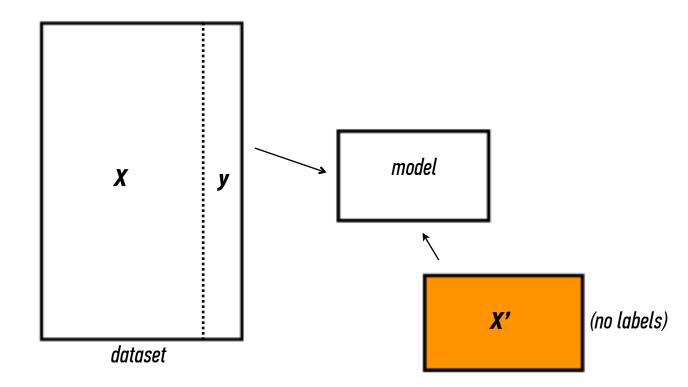
model 'learns' how

X and y relate to

each other

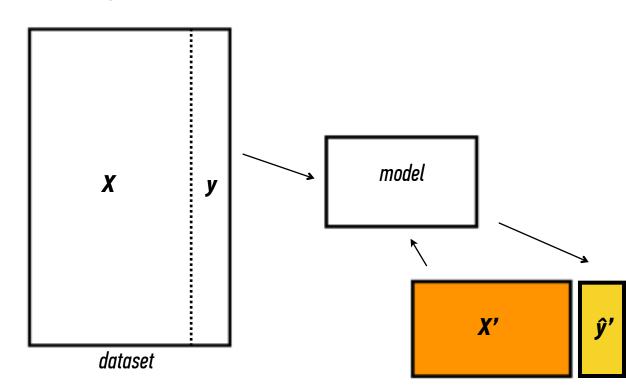


- 1) train model
- 2) make predictions



- 1) train model
- 2) make predictions

model applies
what it learned
to new dataset **X'** 



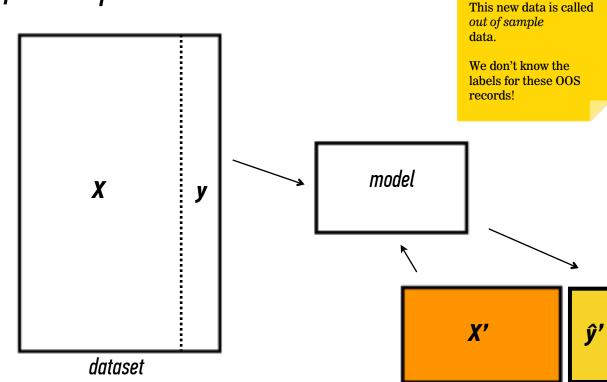
NOTE

#### **CLASSIFICATION PROBLEMS**

Q: How does a classification problem work?

- 1) train model
- 2) make predictions

model applies
what it learned
to new dataset **X'** 

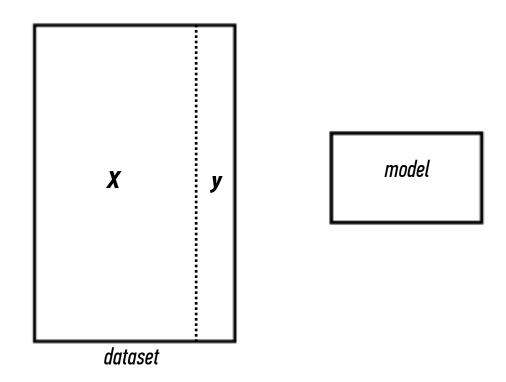


# HOW DO YOU MEASURE

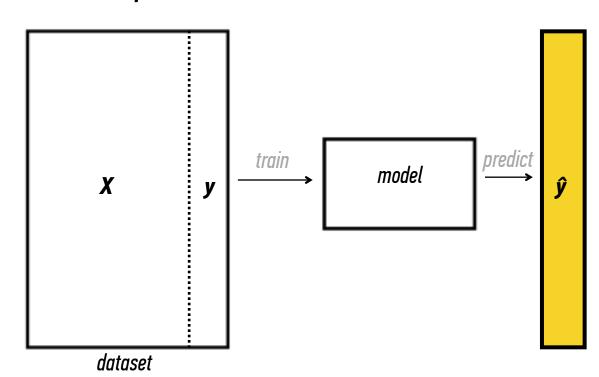
THE QUALITY?

# supervised

test out your predictions

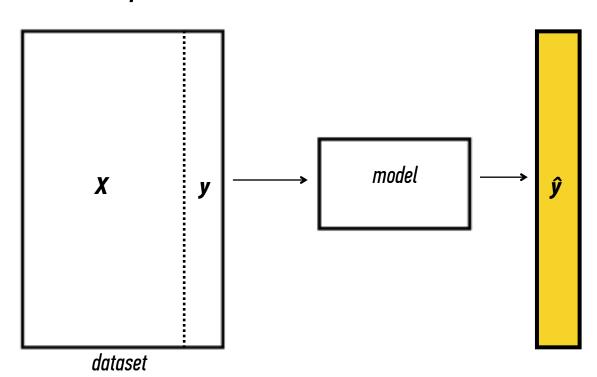


We could apply the model on the given dataset **X** and test predictions **y** 



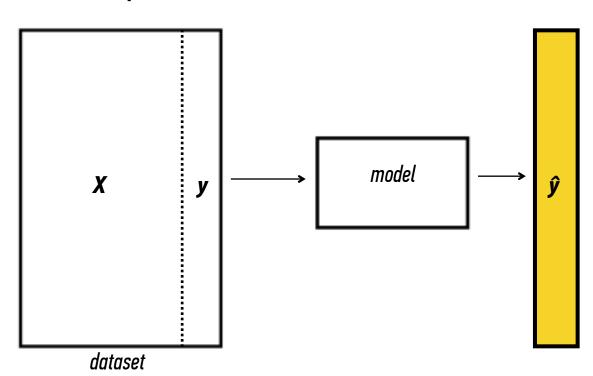
We could apply the model on the given dataset **X** and test predictions **y** 

What could possibly go wrong here?

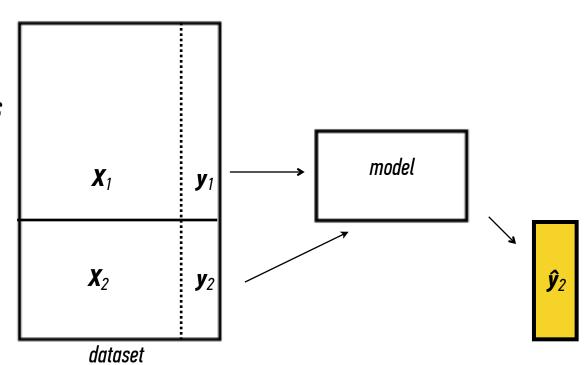


We could apply the model on the given dataset **X** and test predictions **y** 

Model could just have memorized all labels (like a cheating student)



Train model on a part of **X**, and test the results on the rest of the data



Q: What steps does a classification problem require?



dataset

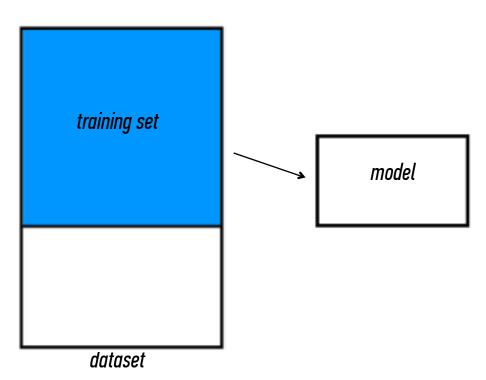
Q: What steps does a classification problem require?

1) split dataset

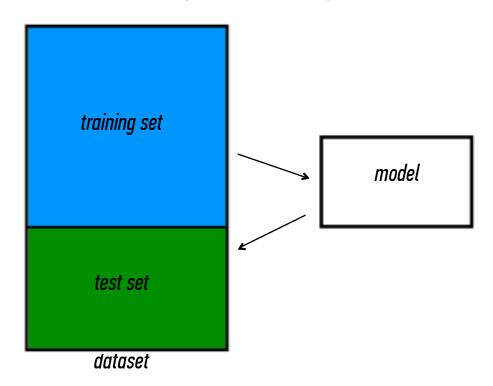


dataset

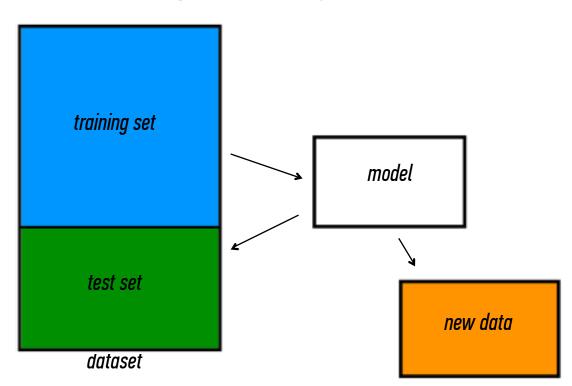
- 1) split dataset
- 2) train model



- 1) split dataset
- 2) train model
- 3) test model



- 1) split dataset
- 2) train model
- 3) test model
- 4) make predictions



#### continuous categorical supervised classification regression unsupervised dimension reduction clustering

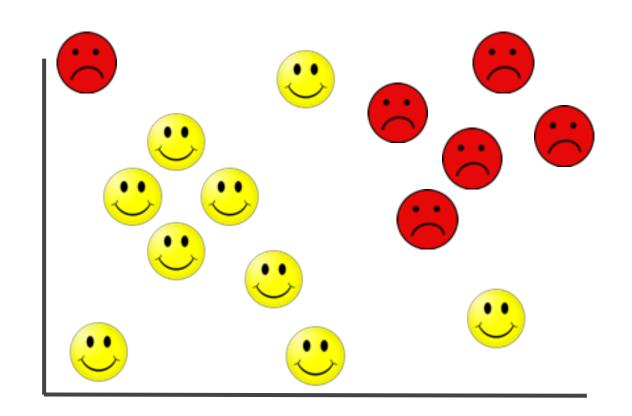
All supervised machine learning problems require using a training and test set

# KNN CLASSIFICATION

#### categorical continuous **kNN** supervised classification regression unsupervised dimension reduction clustering

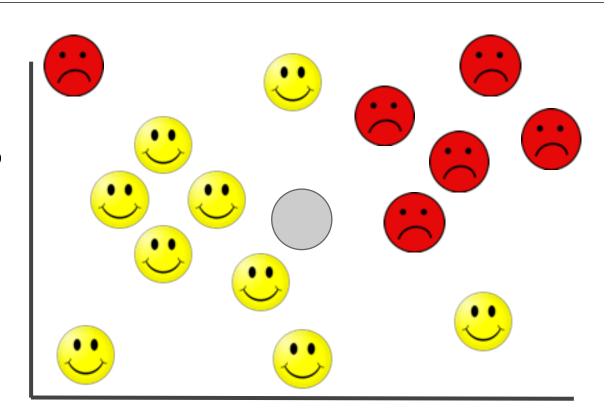
Supervised problem (labeled data)

Categorical data (happy vs. sad)



Want to predict:

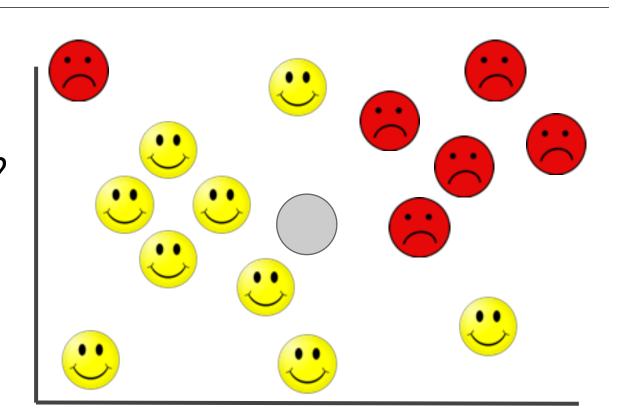
is the grey face happy?



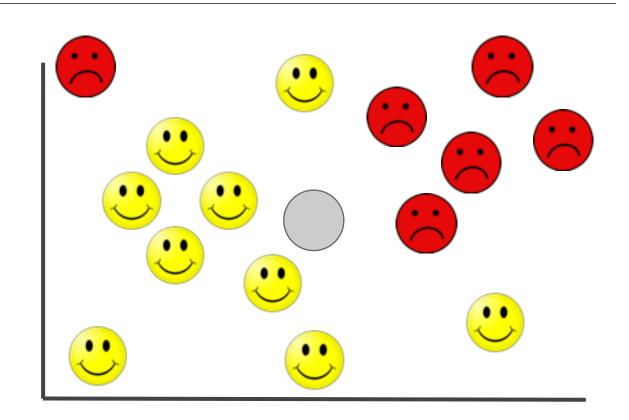
Want to predict:

is the grey face happy?

what do **you** think? why?

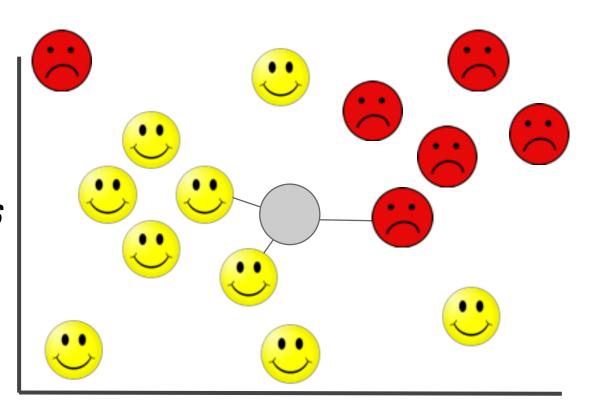


Choose k e.g., k = 3



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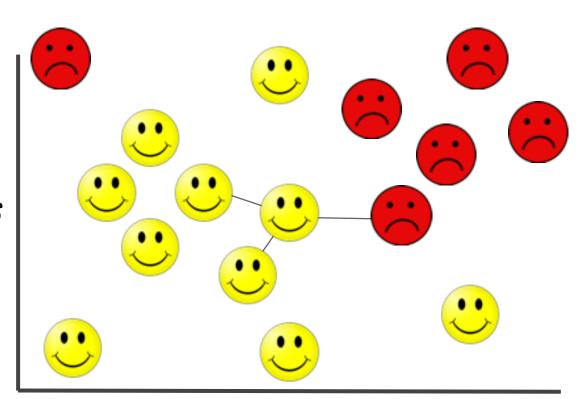
Find k nearest neighbors



Choose k e.g., k = 3

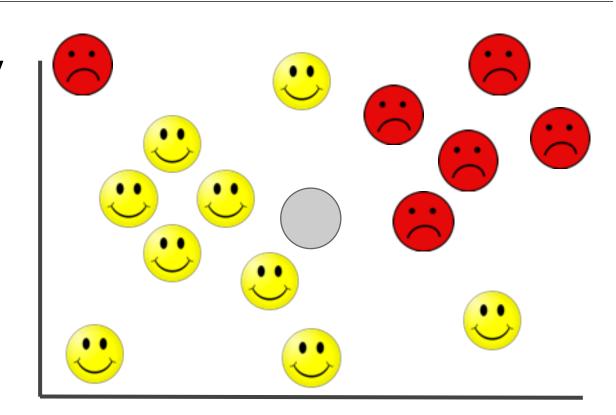
Find k nearest neighbors

Take majority vote



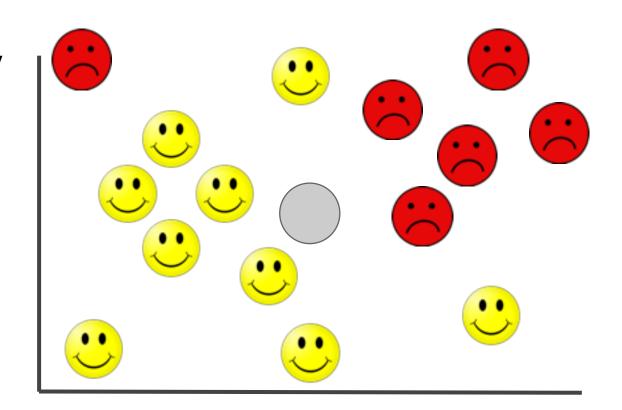
# CAVEATS OF KNN

Q: What could possibly go wrong here?



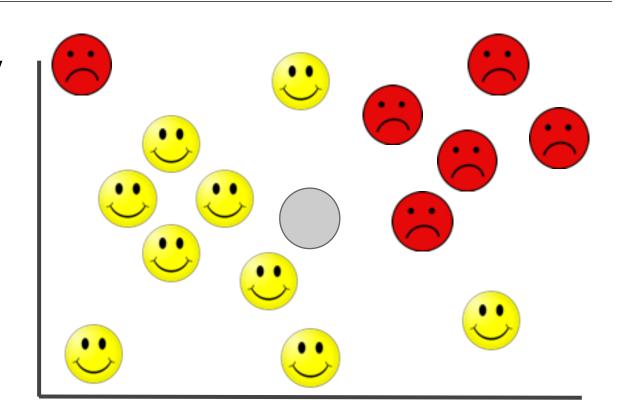
Q: What could possibly go wrong here?

What k?



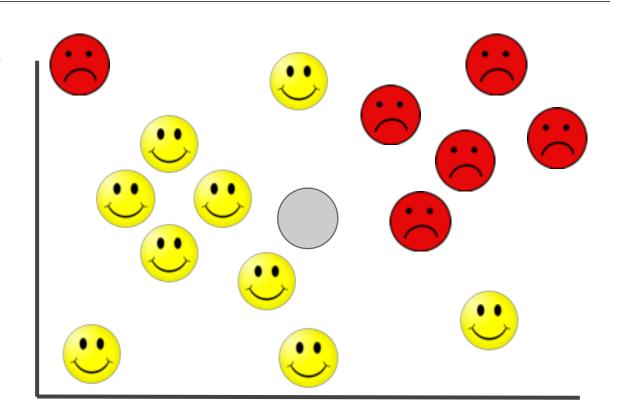
Q: What could possibly go wrong here?

What k? What if k = 1000?



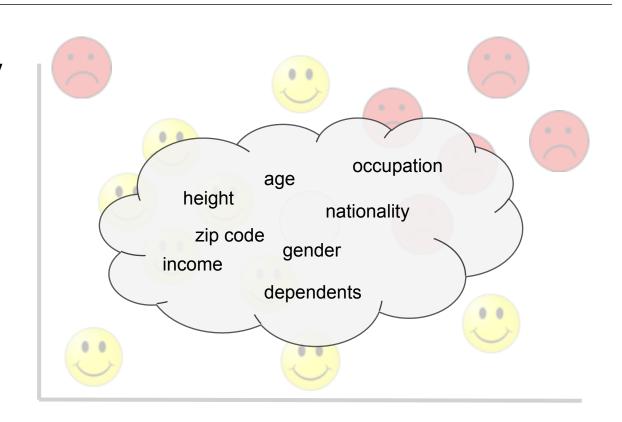
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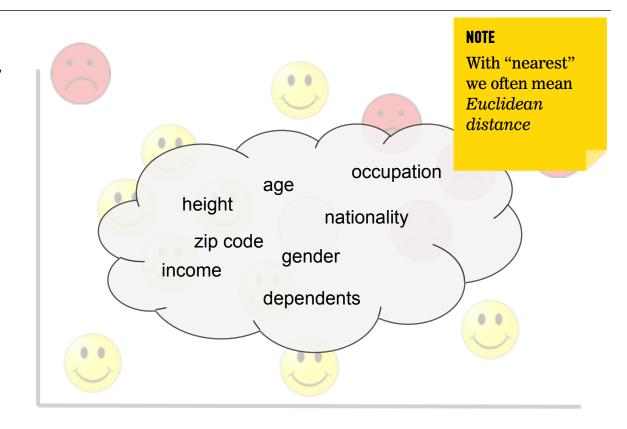
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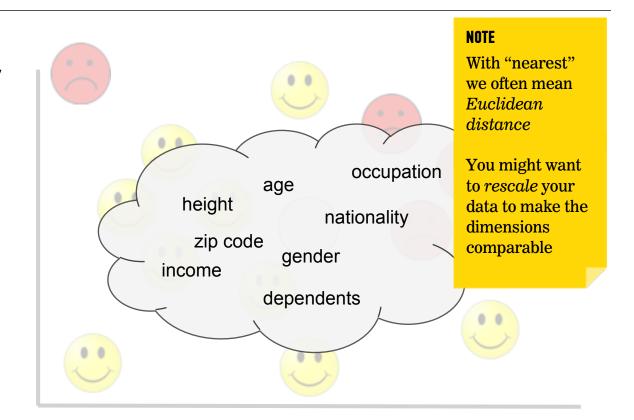
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# INTRO TO DATA SCIENCE

# DISCUSSION

# **60 GENERAL ASSEMBLY**

Exit Tickets! DAT-1, Lesson 3, KNN

Homework 2 Due Dec 16 before class I will be available after class to help with homeworks

Project Milestone 1 Due Jan 21 before class