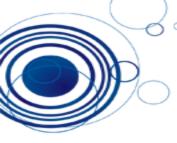


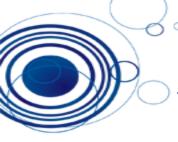
#### We covered...

- Python Basics
  - Basic functions, Types, List, Dictionary
- Numpy library
- Pandas Library
  - Series data structure
  - Dataframe data structure
  - Indexing/Merge/Groupby
- Matplotlib
  - Scatter/Line/Bar chart
  - Subplot, histogram
- Data acquisition



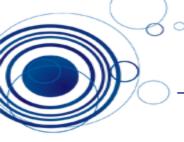
## **Today's Subjects**

- Applied Machine Learning for data analysis
- Machine learning workflow with data



#### What is Machine Learning (ML)?

- The study of computer programs (algorithms) that can learn by example
- ML algorithms can generalize from existing examples of a task
- e.g. after seeing a training set of labeled images, an image classifier can figure out how to apply labels accurately to new, previously unseen images



# **Speech Recognition**

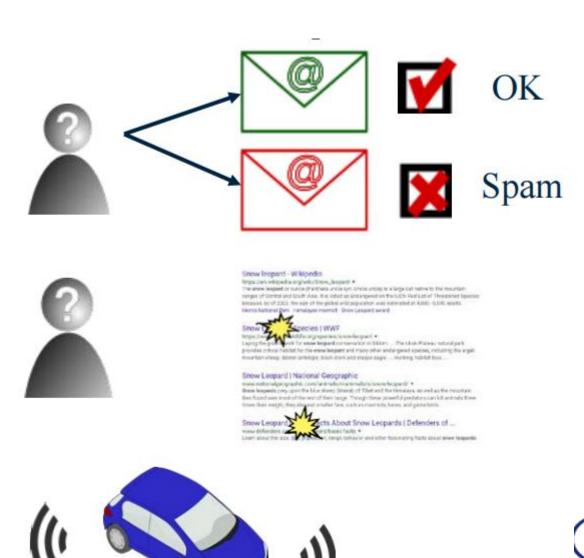


Speech recognition rules

"How do I get to Ann Arbor?

# Machine Learning models learn from experience

- Labeled examples (Email spam detection)
- User feedback (Clicks on a search page)
- Surrounding environment (self-driving cars)





## Machine Learning for fraud detection

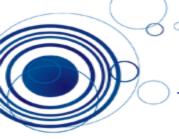
Data instance/example

\$\$\$
Credit card transaction

**Features** 

- Time
- Location
- Amount

ML algorithm User feedback Fraud rules Notification User history



#### **Feature Representation**

#### **Email**

To: Chris Brooks From: Daniel Romero

Subject: Next course offering

Hi Daniel,

Could you please send the outline for the next course offering? Thanks! -- Chris



Feature	Count
to	1
chris	2
brooks	1
from	1
daniel	2
romero	1
the	2
-	

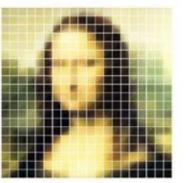
#### Feature representation

A list of words with their frequency counts









A matrix of color values (pixels)

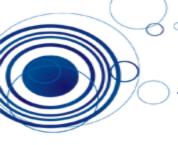
Sea Creatures





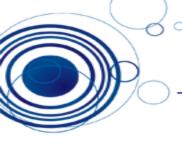
Feature	Value
DorsalFin	Yes
MainColor	Orange
Stripes	Yes
StripeColor1	White
StripeColor2	Black
Length	4.3 cm

A set of attribute values



# What is **Applied Machine Learning?**

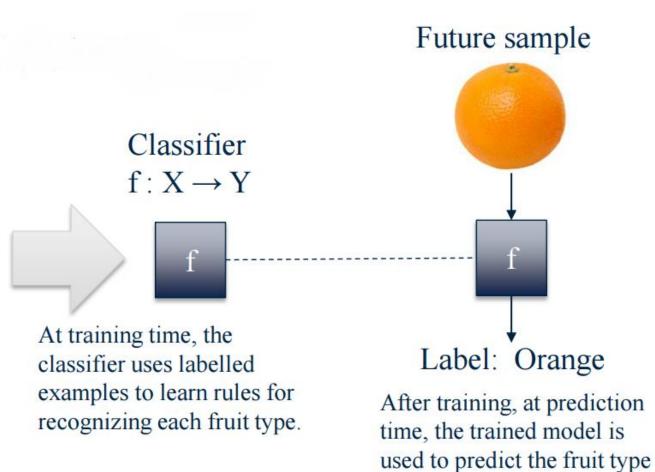
- Understand basic ML concepts and workflow
- How to properly apply 'black-box' machine learning components and features
- Learn how to apply machine learning algorithms in Python using the <u>scikit-learn</u> package



## **Supervised Machine Learning**

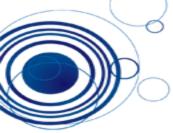
#### Training set

X Sample	Y Target Value (Label)
$x_1$	Apple $y_1$
$x_2$	Lemon y <sub>2</sub>
$x_3$	Apple $y_3$
$x_4$	Orange $y_4$

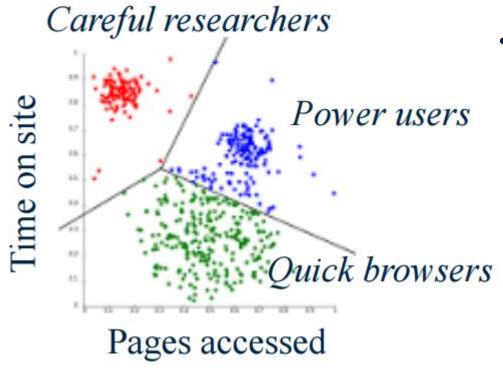


for new instances using the

learned rules.

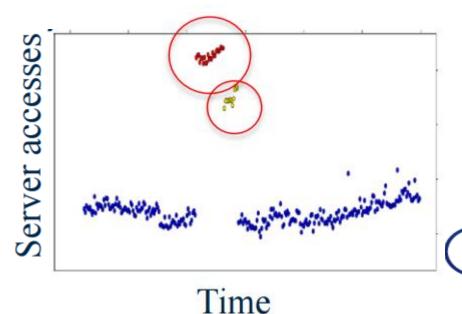


#### **Unsupervised Machine Learning**



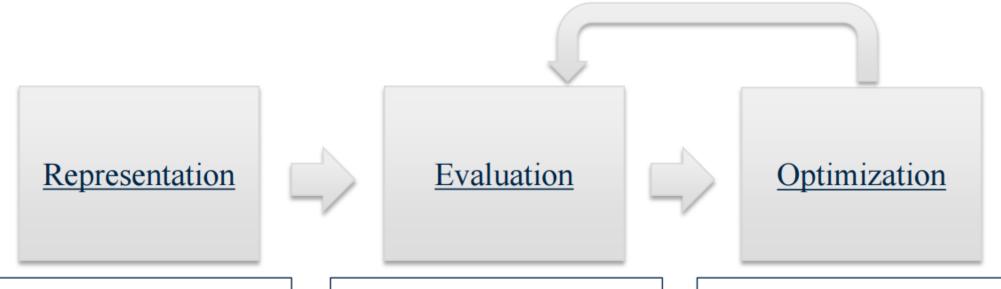
 Detecting abnormal server access patterns (unsupervised outlier detection)

Finding clusters of similar users (clustering)





## A Basic Machine Learning Workflow



#### Choose:

- A feature representation
- Type of classifier to use
- e.g. image pixels, with k-nearest neighbor classifier

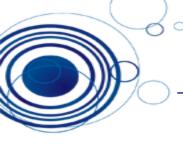
#### Choose:

- What criterion distinguishes good vs. bad classifiers?
- e.g. % correct predictions on test set

#### Choose:

 How to search for the settings/parameters that give the best classifier for this evaluation criterion

e.g. try a range of values for "k" parameter in k-nearest neighbor classifier



# Represent / Train / Evaluate / Refine Cycle



Extract and select object features



#### <u>Train models</u>:

Fit the estimator to the data





Feature and model refinement



Evaluation





## List of skills for data analysis

- Data Visualization
  - Matplotlib, Seaborn, Plotly
  - Data mining
  - Pandas, numpy
- Feature engineering
  - Time series features
  - Categorical features
  - Numerical features
  - Aggregation features
  - Ratio features
  - Product features

- Data preparation
  - Up-sampling
  - Down-sampling
  - SMOTE

- Model development
  - Sklearn : linear, non-linear, tree model
  - Xgboost
  - Lightgbm
  - Catboost
  - LibFFM