



**Experiences from Social Data Science 2018-20**  
**Knowing how to use the microwave,  
...not how to build it**

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**BUSINESS SCHOOL**  
AALBORG UNIVERSITY

# About me

- BA Governance & Public Policy (Uni Passau)
- MSc Innovation Economics (AAU)
- PhD – Innovation Economics – Mapping the Development of the Danish Smart Grid
  
- Never been really good at mathematics
- Needed to solve a problem during my PhD
- Started with Python, NLP, Network analysis ...
  
- Extended into ML/AI methods
  
- AI Denmark – [aidenmark.dk](http://aidenmark.dk)
- Lead: AI Growth Lab

## From catching up to industrial leadership: towards an integrated market-technology perspective. An application of semantic patent-to-patent similarity in the wind and EV sector

Daniel S Hain, Roman Jurowetzki ✉, Primoz Konda, Lars Oehler

*Industrial and Corporate Change*, Volume 29, Issue 5, October 2020, Pages 1233–1255,

<https://doi.org/10.1093/icc/dtaa021>

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## The Privatization of AI Research(-ers): Causes and Potential Consequences

– From university-industry interaction to public research brain-drain? –

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## Need for non-coders

Industry demand for SAMF students with strong quantitative / computational skill. Yet, current DS/ML teaching mostly for CS students.

Data & ML literacy becoming crucial across managerial positions → Transfer of ML to **business & policy opportunities.**

## Need for data literacy



## Need for stronger analytics

Need for stronger applied method training to support exciting master projects, transition into PhD, and advanced BI positions.



## Students want to get challenged

Put into a situation where they have to solve problems that are **hard**, real, **measurable** but **fair** and **solvable**.

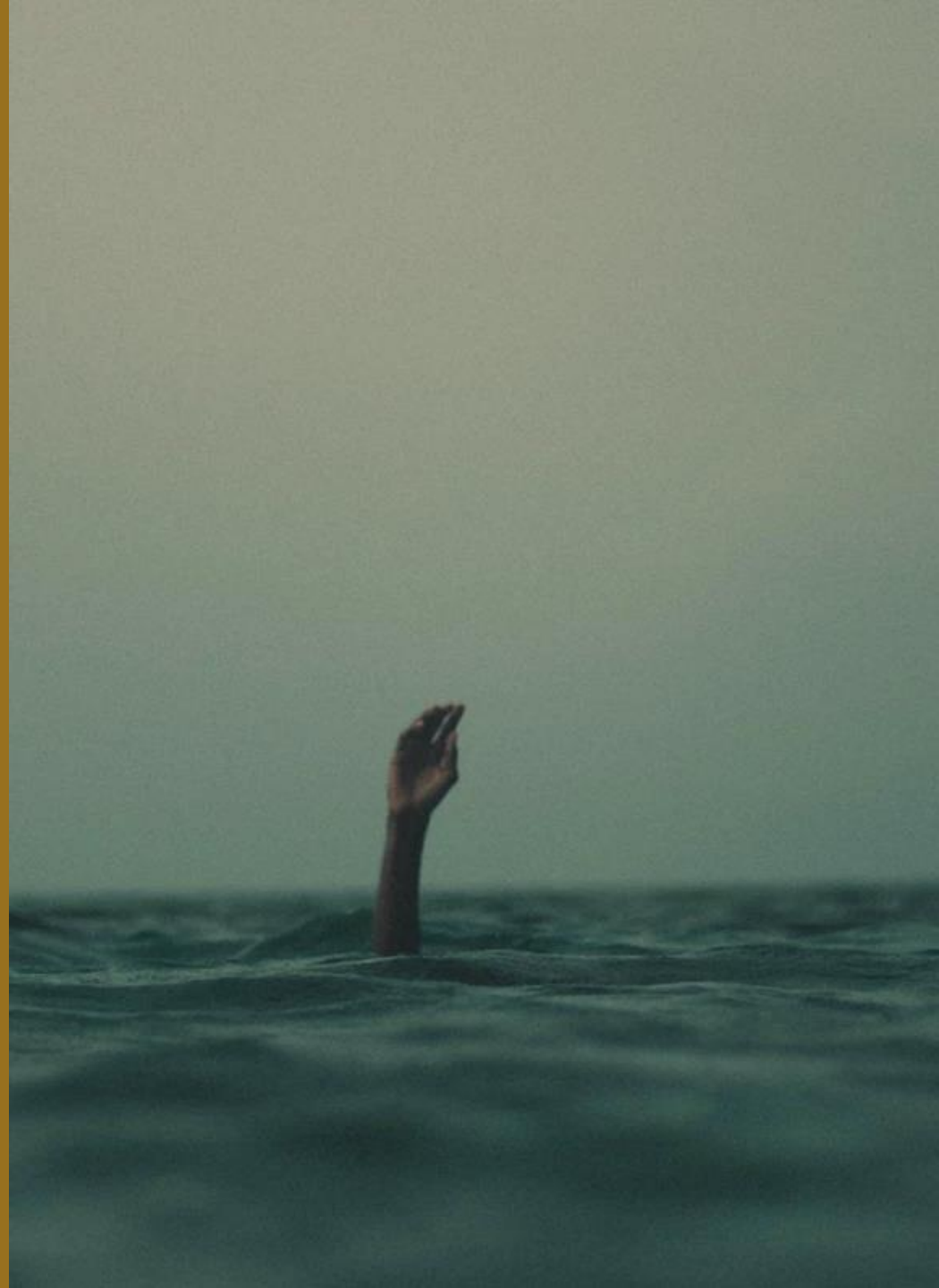
real PBL (my view...)





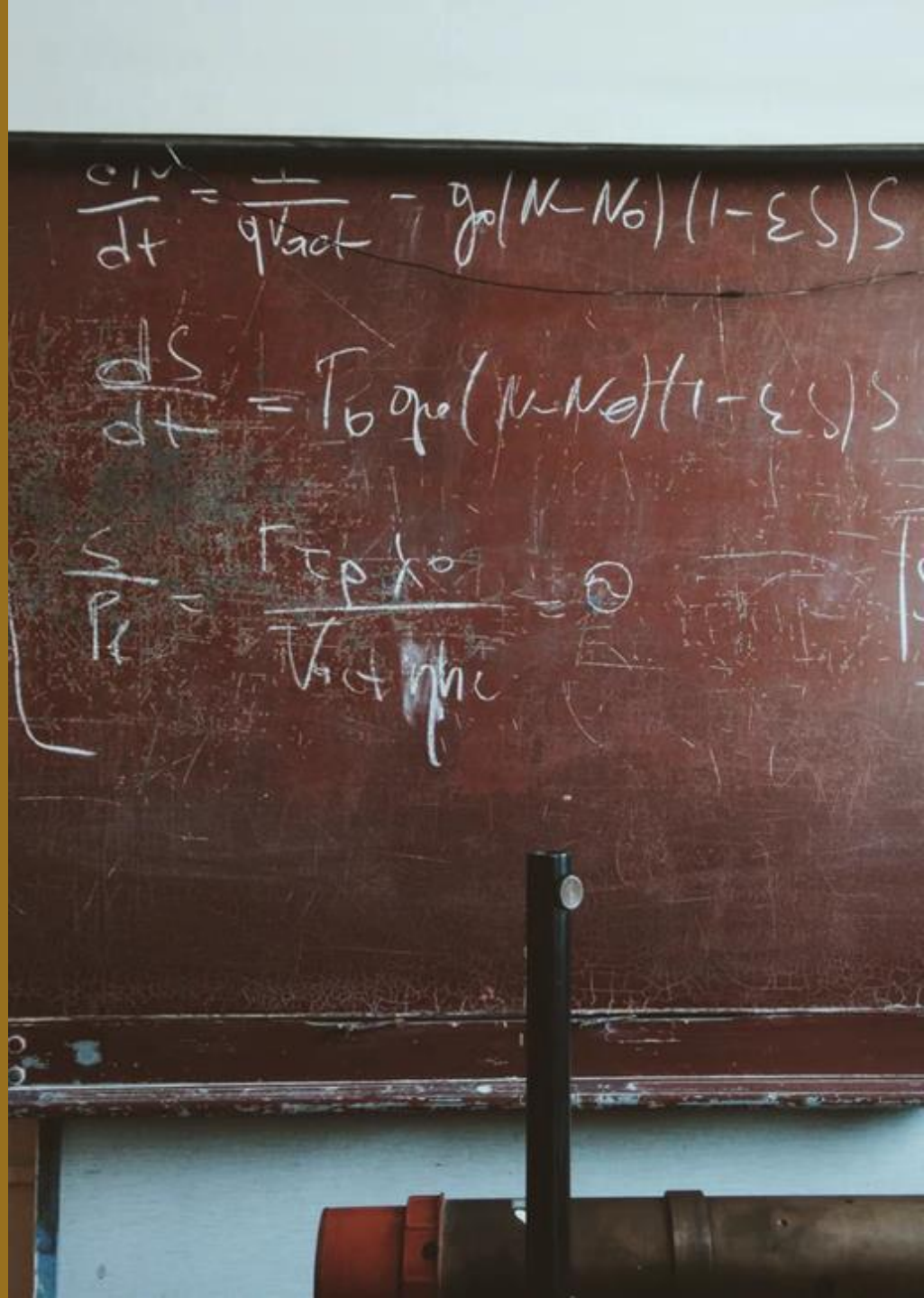
# Too little PBL in SAMF/HUM

- Lack of tangible problems
- Lack of measurable goals
- Broad scope and (too) much freedom
- Very few quantitative projects
- Little problem-solving



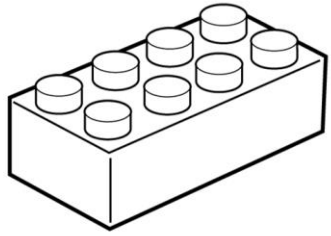
# Disconnect of methods training and application

- Mathematics mainly thought in a theoretical vacuum
- Statistics and econometrics mostly thought with strong formal emphasis and
- main focus on inferential statistics (causality and variations of OLS) while predictive analytics runs the world



# Lack of motivation and legitimacy





Bottom Up 

method first

VS.

Top Down 

**problem first**



- Are my students going to compete with mathematicians or ML engineers?
- How many of my students are going to do a PhD?



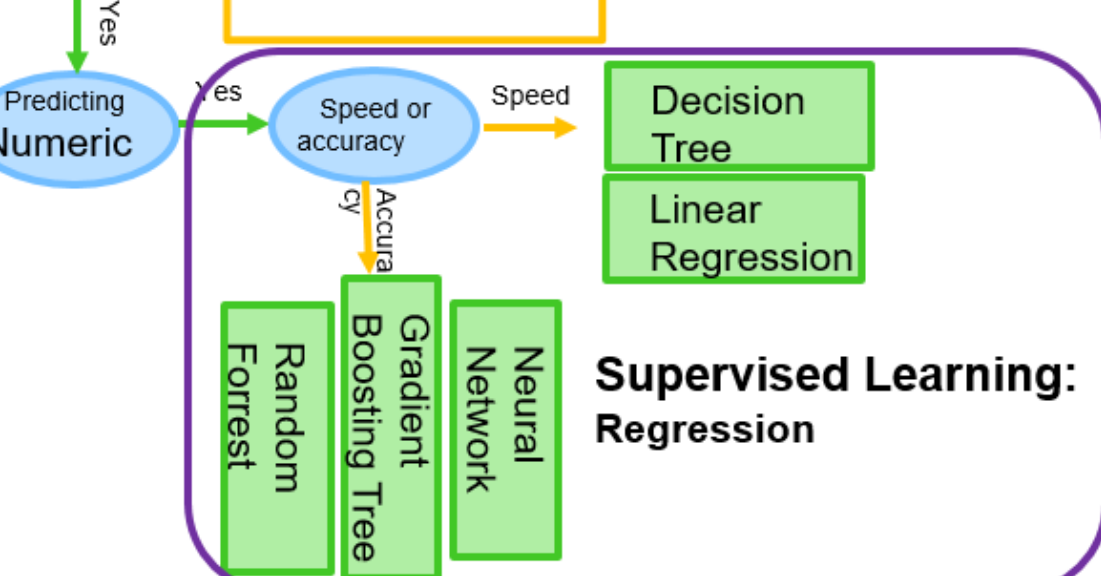
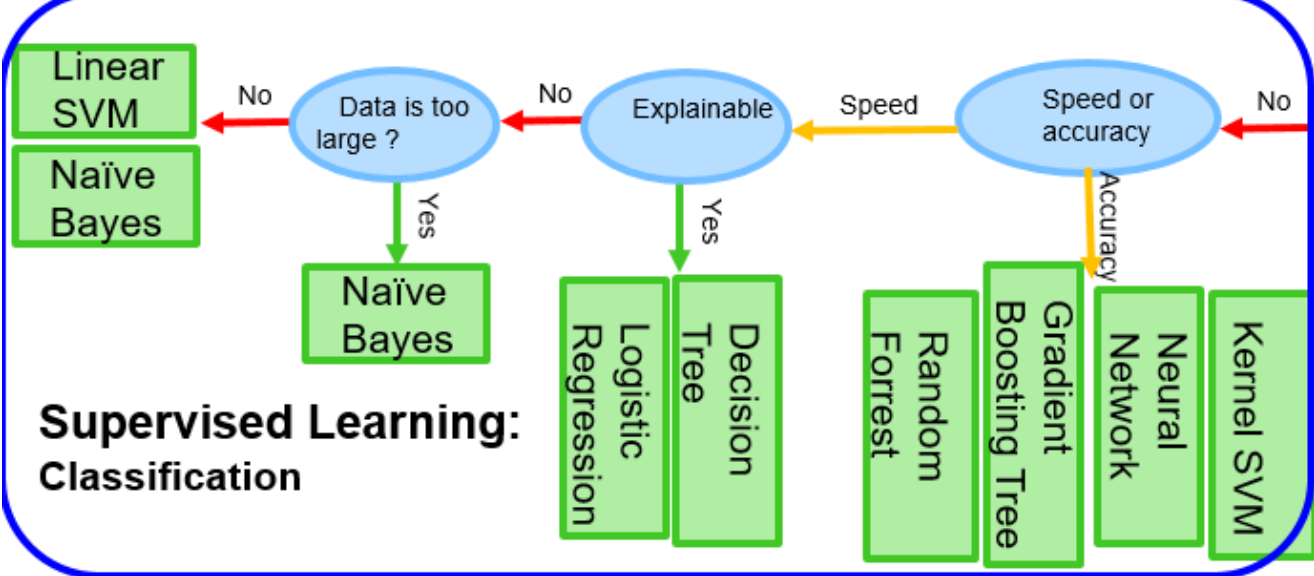
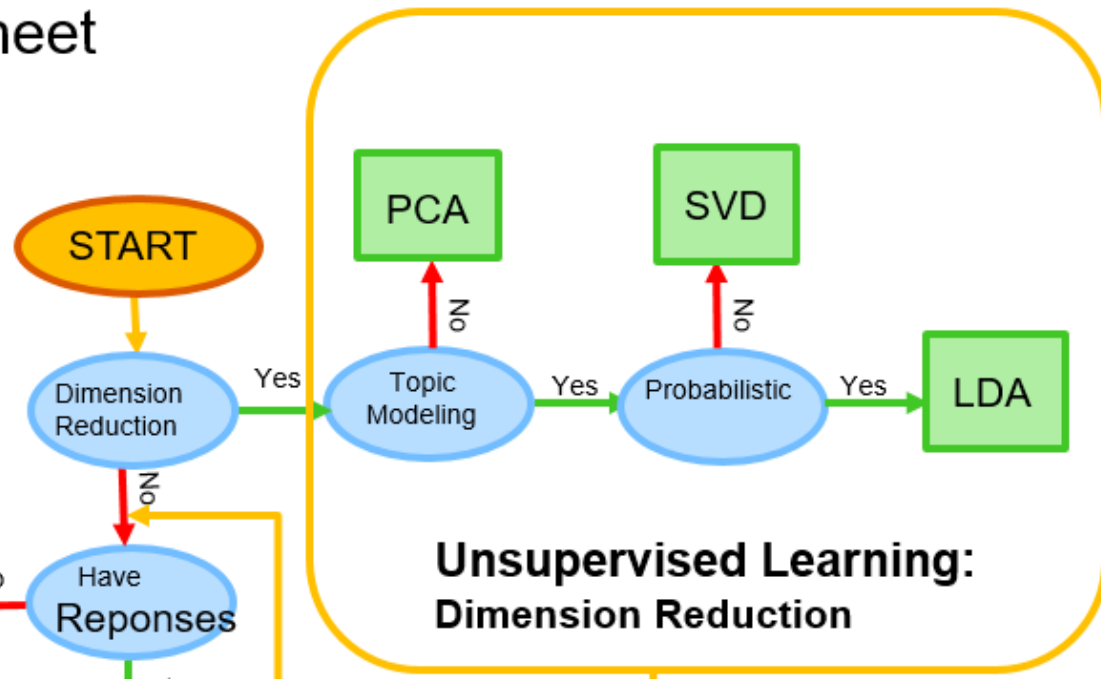
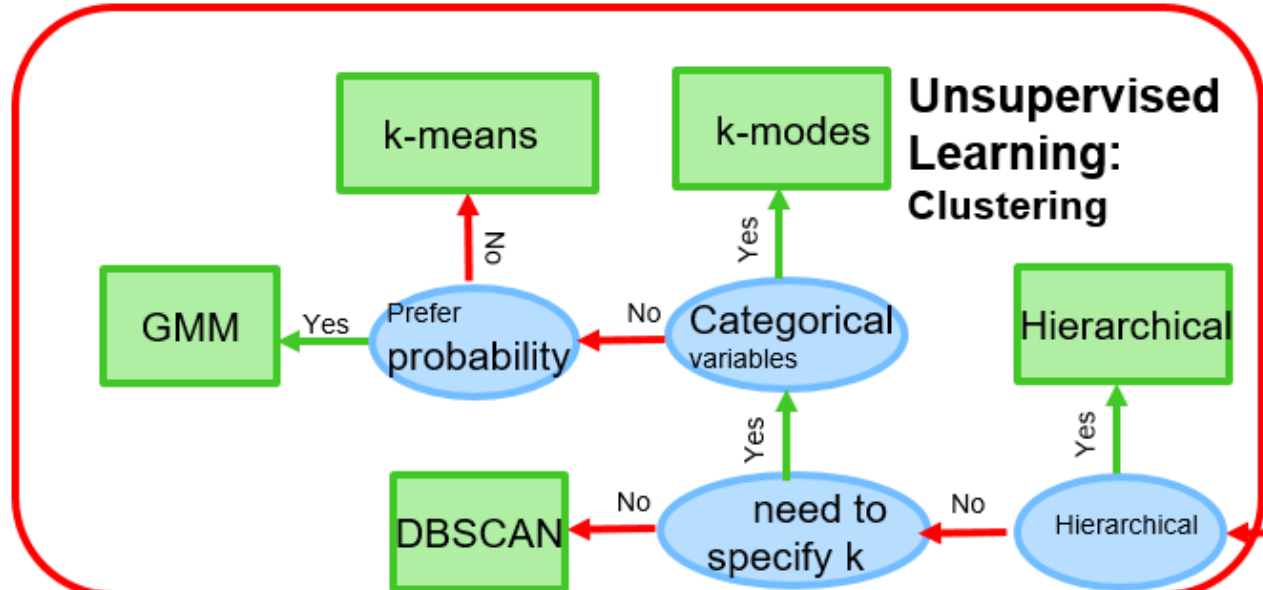


*“You do not need to have a PhD in electrical engineering to be allowed to use a microwave!”*

*- Cassie Kozyrkov - Chief Decision Scientist - Google*



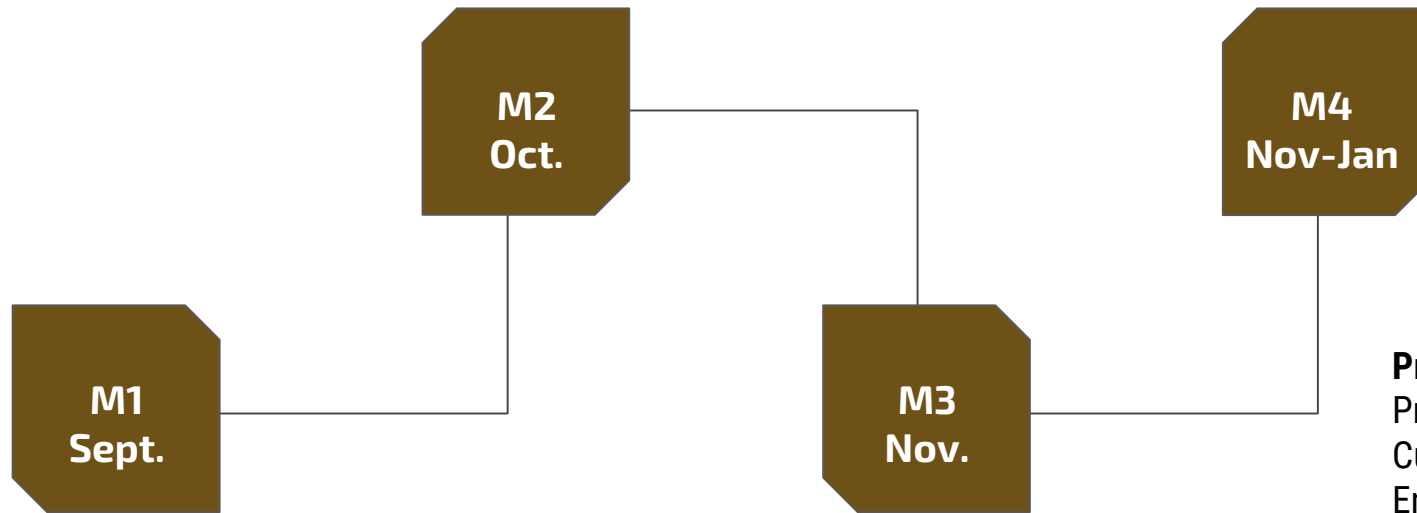
# Machine Learning Algorithms Cheat-sheet



# SEMESTER SCHEDULE

**NLP and Networks (5ECTS)**  
Working with unstructured and relational data. Modelling semantic and relationships.

**Capstone Project (15 ECTS)**  
Usually, work on a real-world data science problem in collaboration with companies and organizations.



**Intro to applied Machine Learning (5ECTS)**  
Working with data, “traditional” machine learning, model evaluation

**Intro to Deep Learning and AI (5ECTS)**  
Designing artificial neural network architectures to get state-of-the-art results. Also: When not to use them.

**Predicting**  
Production errors  
Customer churn  
Employee turnover  
Energy prices  
Street maintenance





## We teach R and Python



**David Keyes**  
@dgkeyes

Teaching students to use software they won't have access to after graduation is immoral.

3:00 PM · May 1, 2020 · Buffer

236 Retweets 70 Quote Tweets 1,604 Likes

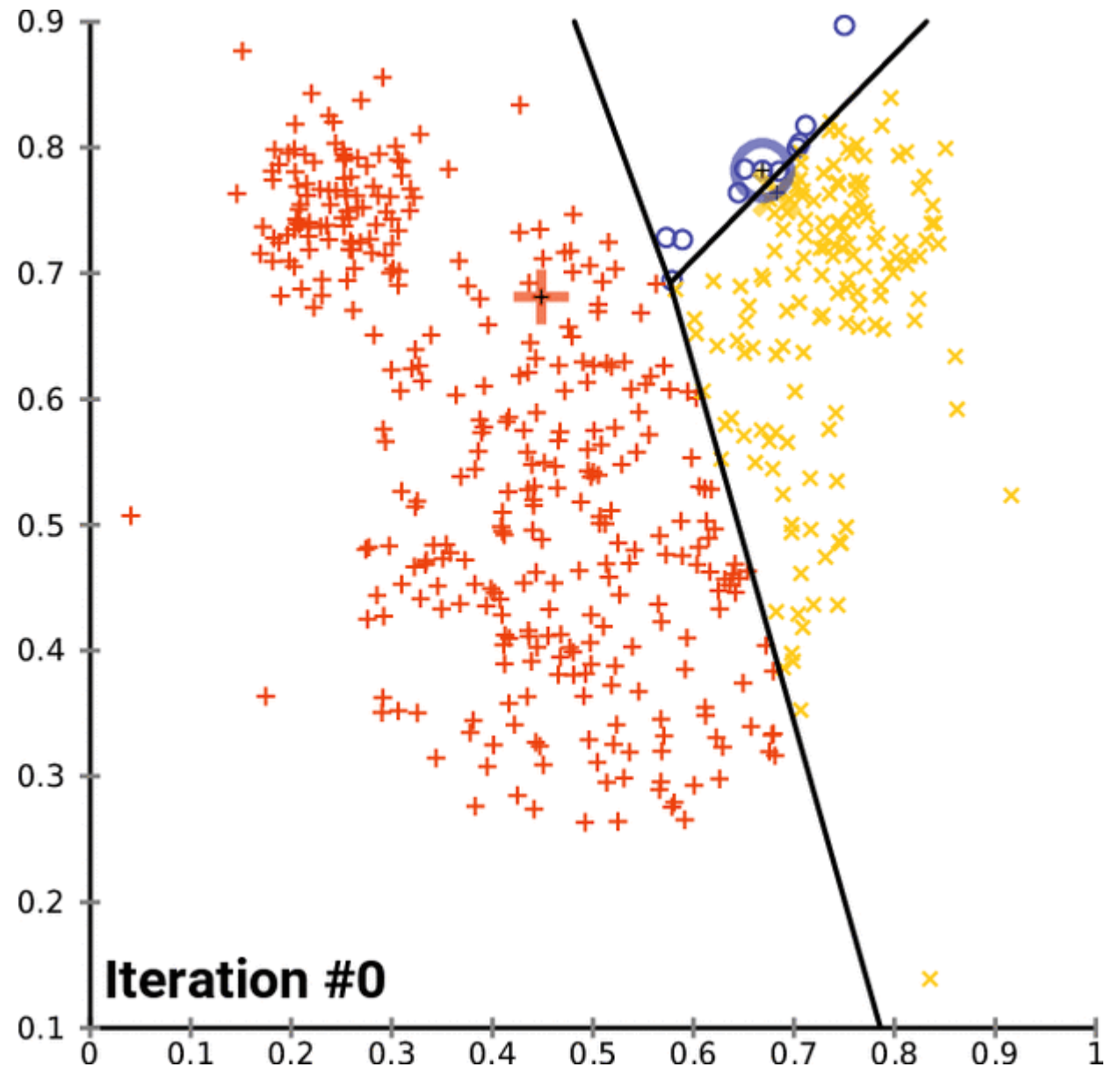
We host our material on  
**GitHub** and encourage  
students to upload their  
projects there





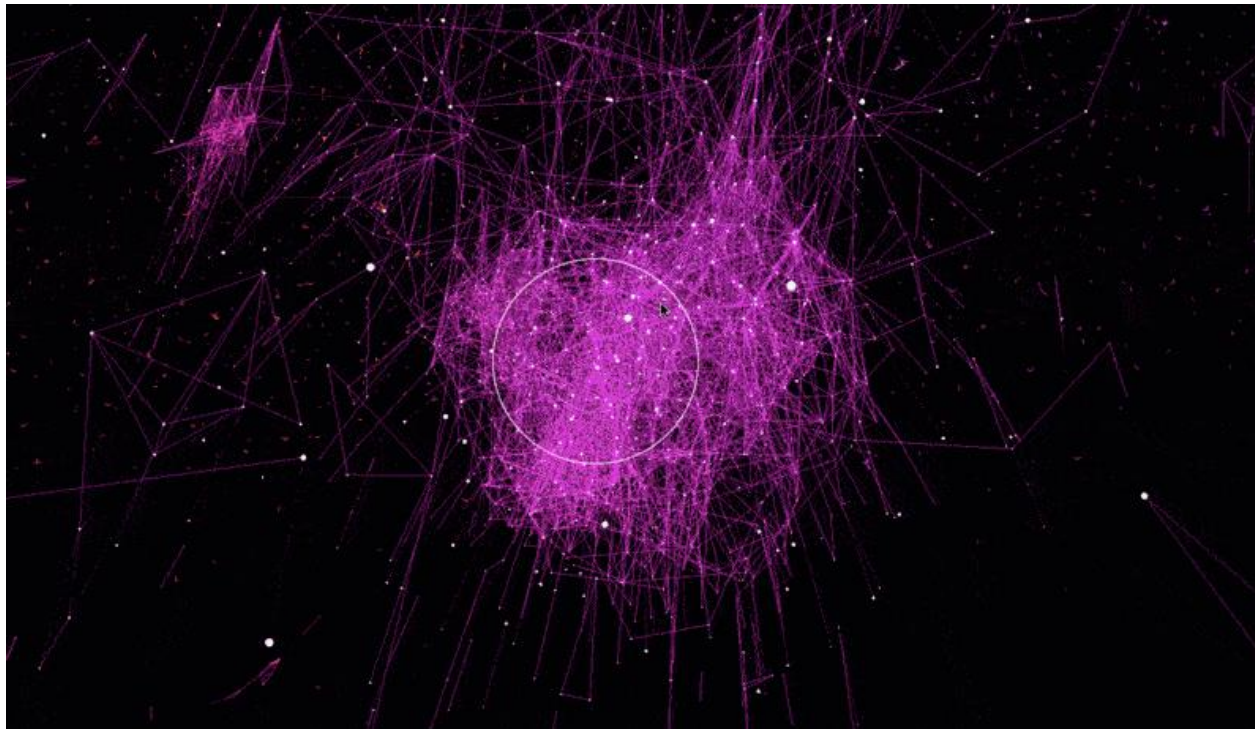
# Module 1

- Intro to machine learning
- Intro to “communities of practice”
- Data handling
- Descriptive statistics / Exploratory Data Analysis
- Data Visualization
- “Traditional” ML - supervised / unsupervised
- Evaluation
- Ethics, Algorithmic bias & other issues



```
[12] text = """Donald Trump vowed that his second meeting with Kim Jong-un would be at  
In Hanoi on Wednesday evening, every effort was made in recreating the circumstan
```

```
[ ] import spacy  
from spacy import displacy  
  
doc = nlp(text)  
displacy.render(doc, style='ent', jupyter=True)
```

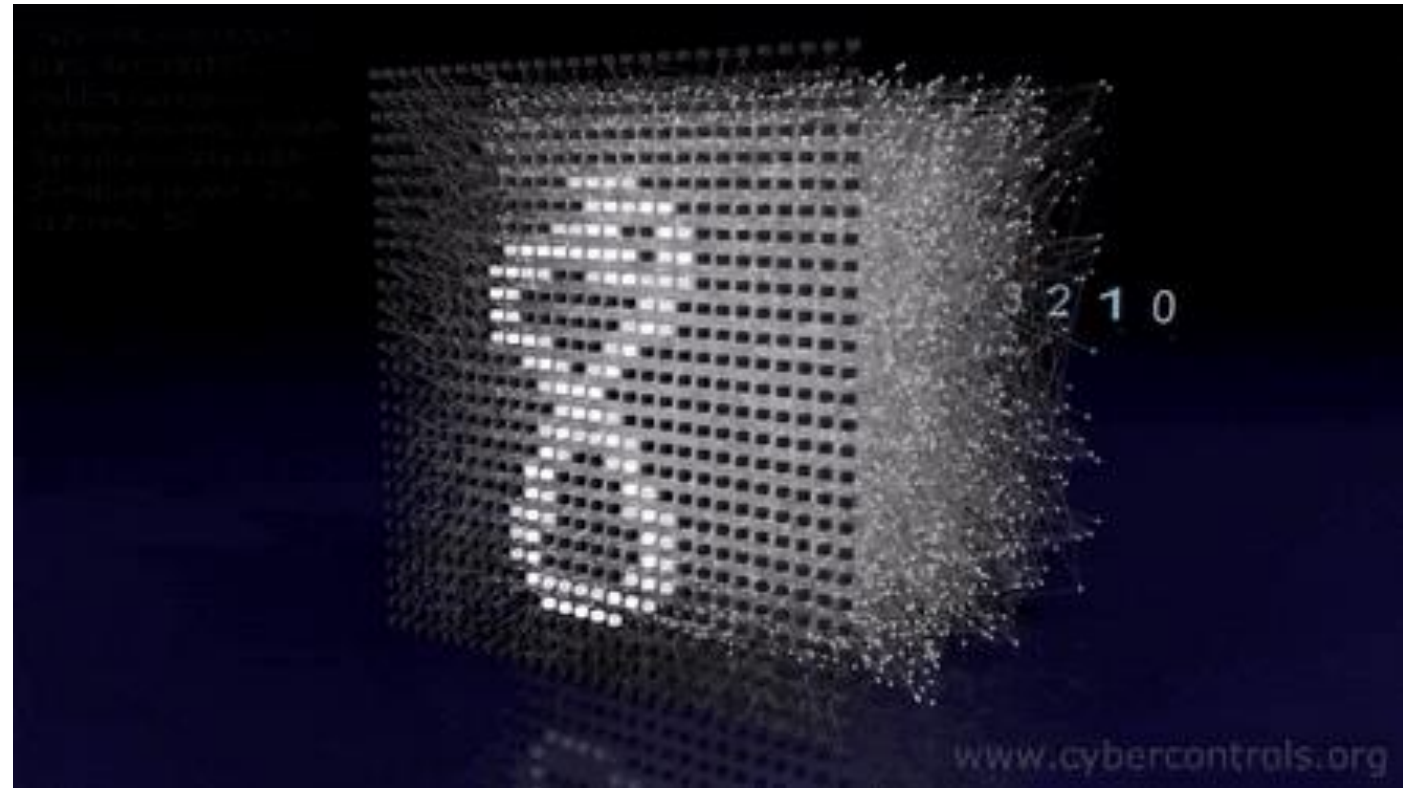


# Networks & NLP

- Understanding / handling relational data
- Network statistics / indicators / visualizations
- Complex networks (multiplex / edge color)
  
- Intro to natural language processing (working with text data)
- Bag-of-word models and derivatives
- Introduction to embedding
- Vectorization and use in ML pipelines

# Deep Learning

- Intro to neural models and Keras-Tensorflow
- Common DL architectures
  - Feed forward nets
  - Convolutional nets
  - Recurrent nets
- Advanced architectures
  - Autoencoders
  - Multibranch models
  - Advanced work with embeddings
  - Transformers

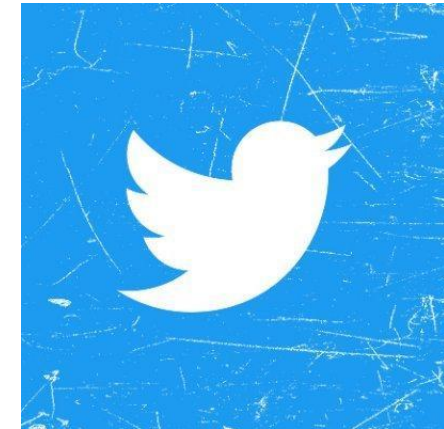


# Stock Movement Prediction and Trading Strategy based on Tweets: An Analysis on the Streaming Sector

Designing an algo-trading bot that uses

- Stock data
- Twitter sentiments 😊 😞

To propose a trading strategy





# Stock Movement Prediction and Trading Strategy based on Tweets: An Analysis on the Streaming Sector

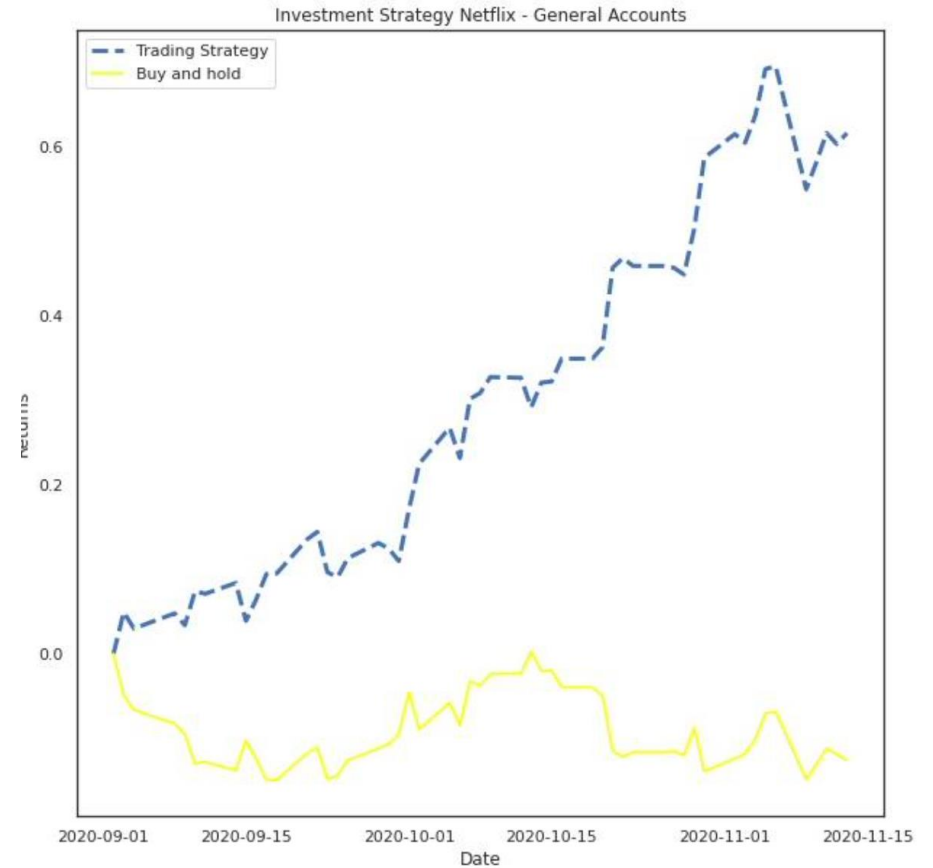


Figure 15: Investment Strategy Netflix



- Source, clean and assemble data (financial & twitter)
- Identify networks of relevant twitter profiles (network analysis)
- Preprocess text data and run sentiment analysis
- Aggregate results and align with stock market data
- Train machine learning model (training, fine-tuning etc.)
- Define, assemble and run back-testing
- Document and communicate process and results



# So what?

- Motivation first!
- Create more opportunities to learn from solving *real* problems
- Courage to confront SAMF/HUM students with real “engineering problems”
- Acknowledge that Github, Medium, tech. documentation and ArXiv are often better/timlier than journal articles or books
- Courage to leave some details to STEM

