## Training All Chemical Engineers in Computing and Data Science





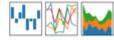
#### **Prof. Alexander Dowling**

adowling@nd.edu dowlinglab.nd.edu

Department of Chemical and Biomolecular Engineering
University of Notre Dame, Notre Dame, IN
November 11, 2019 AIChE Annual Meeting Orlando, FL



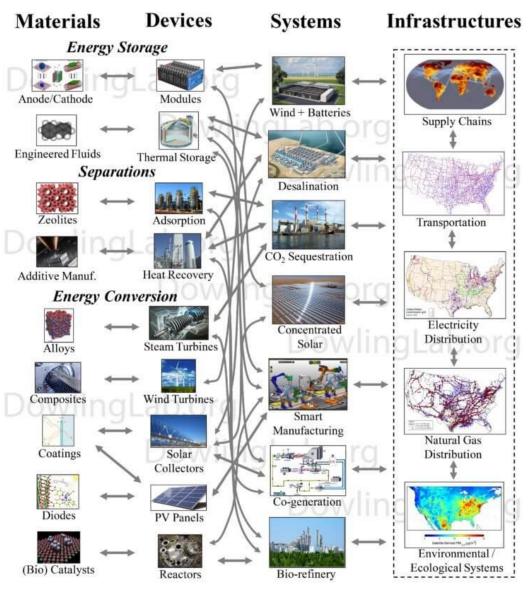






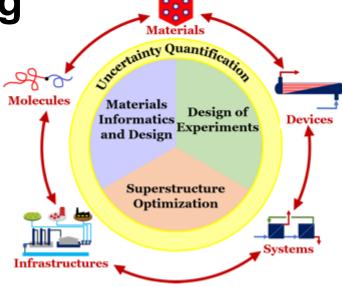


Research: Molecular-to-Systems Engineering



#### **Themes**

- Mathematical Modeling
- Computational Optimization
- Applied Bayesian Statistics & Uncertainty Quantification
- Energy & Sustainability
   Applications









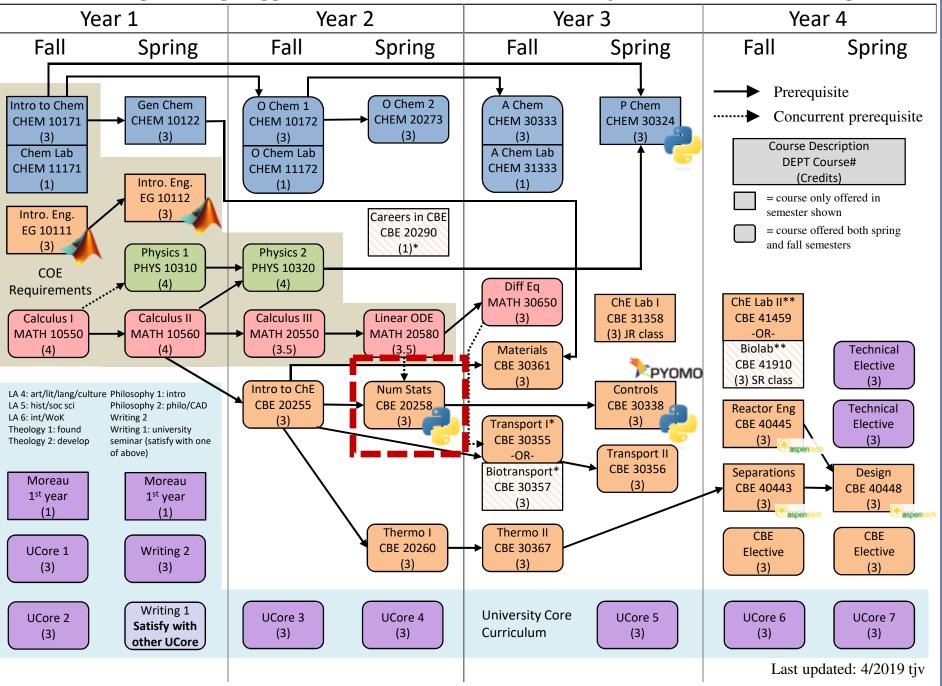








#### Chemical Engineering Suggested 4 Year Curriculum University of Notre Dame entering FA18



## Current Practice: Computing & Statistics

MATLAB in freshman engineering sequence

Sophomore-required

Numerical & Statistical

Analysis (NSA)

Ad-hoc computing & statistics in upper-level classes:

"You learned this as sophomores... just figure it out" – Prof. Anonymous

#### **Vision**

Vertically integrate computing and statistics throughout the undergraduate curriculum

## Vertical Integration: Opportunities and Challenges

labs

#### **Numerical Methods**

Equation solving (thermo., separations)
Optimization (controls, design)
Numeric integration (transport, reactions)

### **Statistics and Data Analysis**

Probability (physical chemistry)

Visualization

Regression

**Error Analysis** 

**Uncertainty Propagation** 

#### **Challenges**

Difficult to learn advanced topics sophomore year (e.g., PDEs, BVPs)

"Brain drain" without repeated exposure

Common software tools?

How to avoid burdening all faculty?



## Modernizing Numerical and Statistical Analysis

## Backward Course Design Set Clear Learning Objectives

At the end of the semester, you should be able to...

- 1. Create mathematical models and apply computational methods to analyze systems using basic principles of chemical engineering (e.g., mass and energy balances, thermodynamic equilibrium, etc.)
- Analyze data and quantify uncertainty using standard statistical techniques and mathematical models grounded in engineering fundamentals
- 3. Independently plan, implement, and debug short (100 to 300 lines) Python computer programs to analyze data, solve engineering mathematical models, and visualize results

### **Major Changes**

#### Reorganized class topics

- Removed advanced topics (QR factorization, compression with SVD, trust regions, BVPs, PDEs)
- Emphasized fundamentals, especially probability & statistics
- Added mass and energy balance examples

Switched to Python, with great student buy-in

Incorporated active learning into lectures

**Shortened assignments** 



## Active Learning is Essential for Computing and Statistics



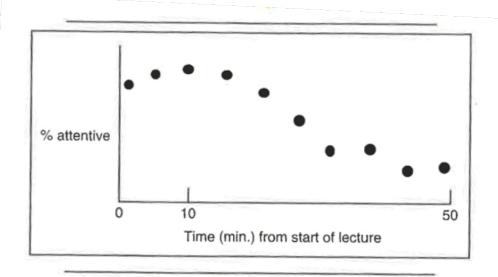
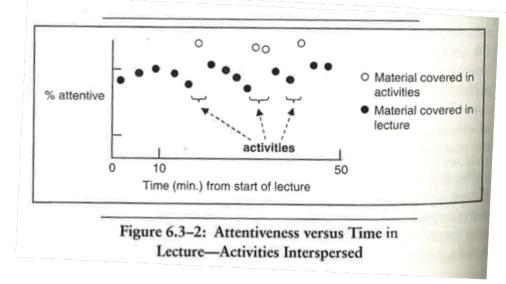


Figure 6.3-1: Attentiveness versus Time in Lecture—No Activities





## Spring 2019: Cloud-based Google Colaboratory (Jupyter Notebooks)

colab.research.google.com

#### **Benefits of Google Colaboratry:**

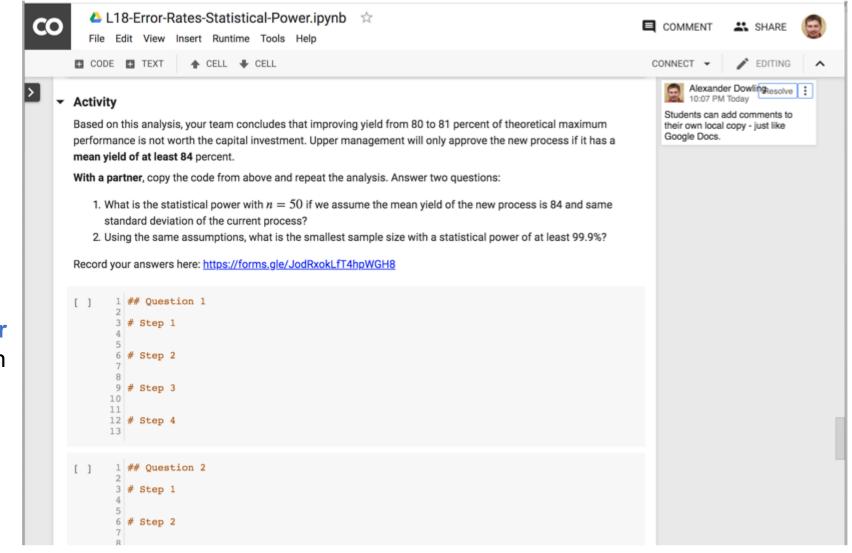
Like Google Docs, but for code

Integrated with Google Drive: automatic versioning, easy sharing

Removes barriers to access: students can complete assignments from any internet connect computer – no need to support 80+ local Python installations

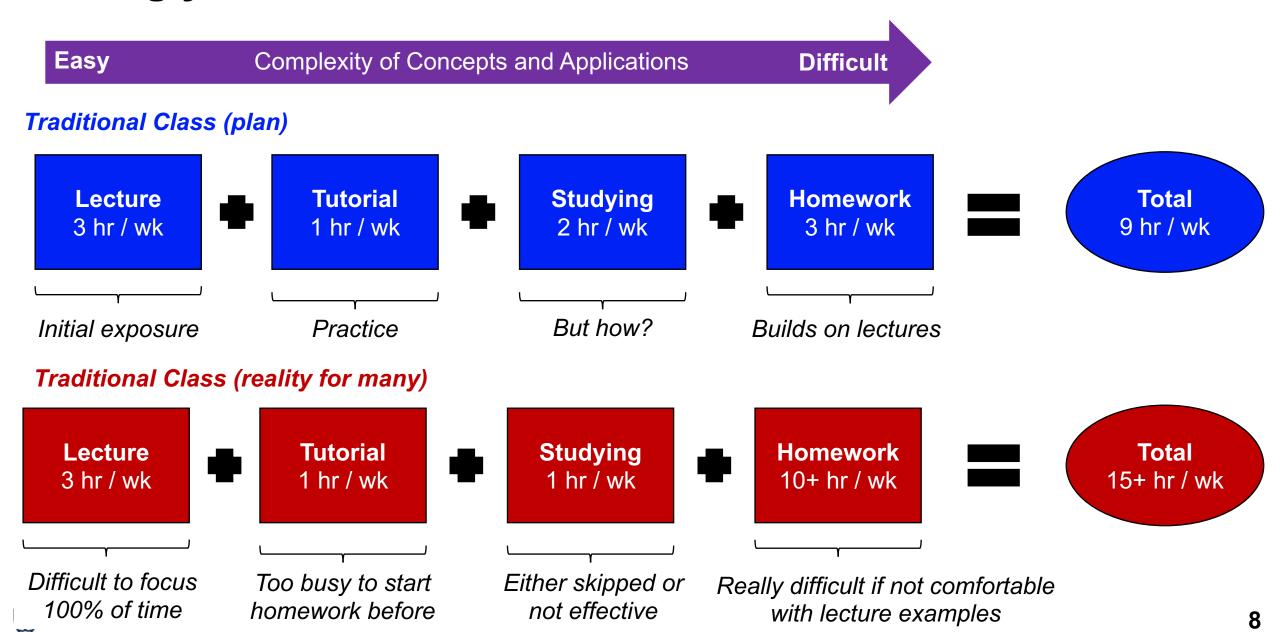
Facilitates active learning

Free





## Making your time more effective



## Making your time more effective

Easy Complexity of Concepts and Applications Difficult

\*We'll start some homework problems during class.

# This Semester Class

Class
Preparation
2 hr / wk

Initial exposure at home

Tutorial 1 hr / wk

Practice & jump-start homework

Studying 1 hr / wk

I'll teach you how to do this & give extra practice problems Class\* 3 hr / wk

Problem solving together

Homework\* 2 - 4 hr / wk

Easy extensions of home and class activities

Total 9 - 11 hr / wk

> This is 100% on task time... i.e., Facebook closed, not watching Netflix, not texting



## Fall 2019: Cloud-based Vocareum (Jupyter Notebooks)

www.vocareum.com

#### **Benefits of Vocareum:**

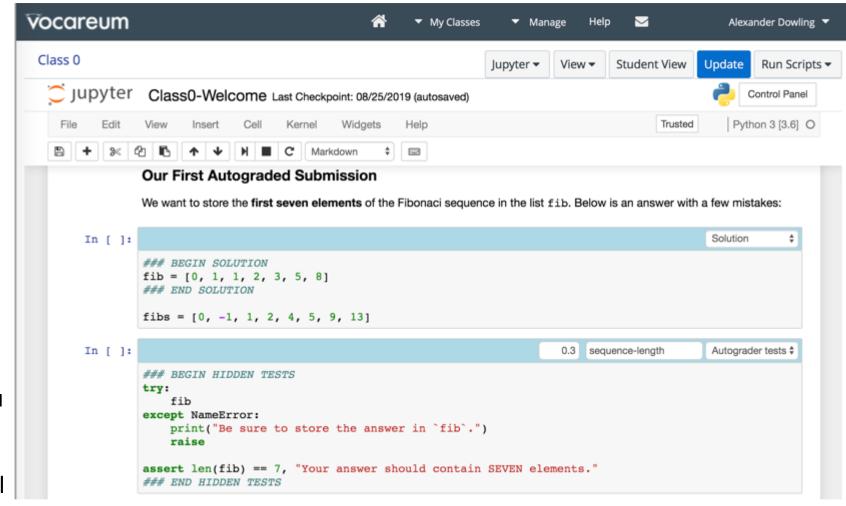
Many of the same cloud-based benefits as Colaboratory

Integrated with Learning
Management System (e.g., Sakai)
and gradebook

Supports **autograding** via nbgrader (with some enhancements)

Supports plagiarism detections (if you want it)

Paid service, but responsive technical support





## Fall 2019: Cloud-based Vocareum (Jupyter Notebooks)

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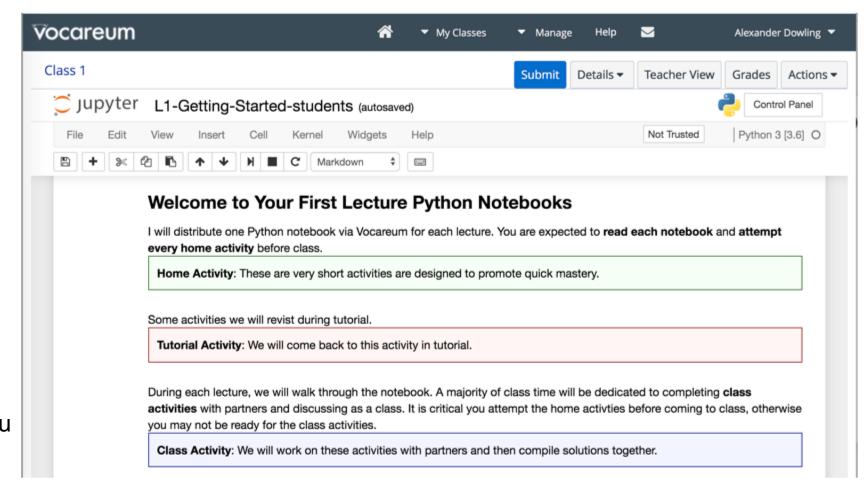
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Supports plagiarism detections (if you want it)



**Bottom Line:** Autograder (Vocareum) enables accountability for meaningful home activities before class, which translates to more engaging class sessions.



## **Excited Students Become Long-Term Learners**

Success Stories and Lessons Learned

Show students how computing and statistics:

- Makes them competitive for jobs
- Helps them in future classes & career
- Connects to chemical engineering & society

#### **Extension Assignments**

Watch TED talk, listen to podcast, etc.

Answer brief reflection questions

Completion grade, counts towards dropped homework

#### Examples:

Planet Money, "What Causes What?" Hidden Brain, "The Scientific Process" TED Talks: Bias and Algorithms

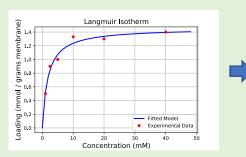
### Set them up for early success

- Require pseudocode
- Embrace the autograder

Show them how to study & learn independently

#### **Final Project: Heavy Metal Water Treatment** Draw

Fit Isotherm Model & Estimate Uncertainty



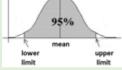
Calculate Filter Lifespan



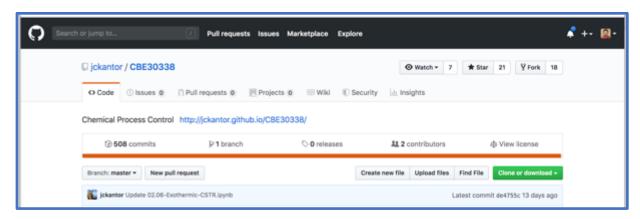
$$\frac{d}{dt}q(t) = \frac{F}{m}(c_{in} - c(t))$$

Conclusions with Uncertainty





## **Special Thanks to Prof. Jeff Kantor**



#### https://github.com/jckantor

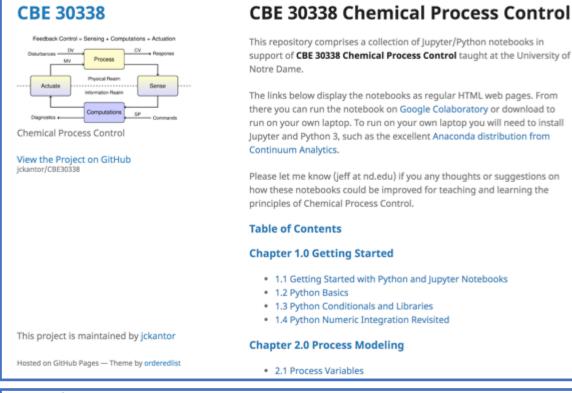
**Chemical Process Control** 

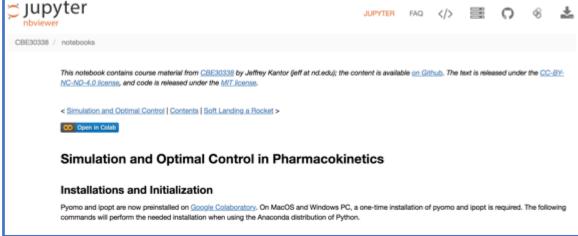
Introduction to Chemical Engineering Analysis

Introduction to Operations Research

**Process Operations** 









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