

**Week 01**

# **Law & Ethics**

Web Data Science

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University of Colorado  
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**Tuesday**

# Agenda

- 00:00 – 00:20 → Course Overview
- 00:20 – 00:40 → Documentation and Professionalization
- 00:40 – 01:00 → Loading Data
- 01:00 – 01:15 → Final Project, Next Class

# Introductions

- Name and pronouns
- Program and year
- Goals for the class this semester
- Favorite web data source
- Greatest achievement over summer

# My background

- Grew up outside of Las Vegas, Nevada
- Undergraduate degrees in Mechanical Engineering and Science, Technology, Society @ MIT
- Bartender and oral historian for a year
- Graduate school in Media, Technology, Society @ Northwestern School of Communication
- Post-doctoral research in computational social science @ Northeastern University
- Senior Research Associate and Data Scientist @ Harvard Business School
- CU Boulder Information Science, 2016 – present
- High-tempo online collaborations, public interest data science, demography and extremism
  - <https://www.brianckeegan.com/>
- Cannabis policy, local politics, astronomy, composting & gardening, rowing

# Course Overview

# Motivation

- My graduate students and I rely on web data for much of our research
  - How does Wikipedia cover breaking news events? How does it remember recent historic events?
  - How does collective behavior on Twitter change during sporting events?
  - How can bots help govern or disrupt online communities?
  - How can gig workers improve their working conditions?
  - How effective are moderation strategies for limiting polarization and extremist recruiting?
  - How does extremist content about calls for violence move across platforms?
  - How are people migrating from platforms like Twitter to alternatives like Threads, Mastodon, and Bluesky?
- Access to high-resolution behavioral data published on the web has been foundational to my research disciplines of computational social science, network science, and information science

**But researchers' ability to access to web data is rapidly disappearing**

# Course Design

- Lectures are Tuesdays and Thursdays, 9:30 am – 10:45 am
  - Eaton 135
  - **Tuesdays:** Lecture, notebook, exercises
  - **Thursdays:** Review exercises, guest lectures, reading discussion
- Canvas is King: announcements on Canvas override syllabus



# Evaluation

- **Attendance:** 15% total
  - Attendance is required. Sign-ups or random cold-calls will be used.
- **Module Assignments:** 3 modules x 20%/module = 60% total
  - Exploratory data analyses and/or research designs
- **Final Project:** 25% total
  - Final paper combining research design, data collection, and exploratory analysis
- No midterm or final exam

**Please submit all assignments on Canvas, emailed assignments will be ignored.**

# Course Overview

Module	Week	Dates	Topics
<i>Fundamentals</i>	1	Aug 27; Aug 29	Law & ethics
	2	Sep 3; Sep 5	Post-A(P)I Age
	3	Sep 10; Sep 12	XML & JSON
	4	Sep 17; Sep 19	IP & HTTP
<b>Module Assignment 1 due September 23</b>			
<i>Documents</i>	5	Sep 24; Sep 26	Static web pages
	6	Oct 1; Oct 3	Archived web pages
	7	Oct 8; Oct 10	Dynamic web pages
	8	Oct 15; Oct 17	PDFs
<b>Module Assignment 2 due October 21</b>			
<i>APIs</i>	9	Oct 22; Oct 24	Wikipedia
	10	Oct 29; Oct 31	Government
	11	Nov 5; Nov 7	Social
	12	Nov 12; Nov 14	AI
	13	Nov 19; Nov 21	Automation
<b>Module Assignment 3 due December 2</b>			
	14	Nov 26; Nov 28	<b>No Class: Fall Break</b>
<i>Final projects</i>	15	Dec 3; Dec 5	Final projects
	16	Dec 10; Dec 12	

# COVID-19 Contingencies

- If you require sequestration, treatment, convalescence:
  - I will try to accommodate through extensions and incompletes
- If a roommate, partner, or family member's diagnosis will affect you:
  - I will also try to accommodate through extensions and incompletes
- We are bound by and will enforce campus COVID-19 policy



Do not ghost me! Notify us *as soon as possible* of diagnoses or events that will impact your ability to participate in class so we can accommodate without end-of-term scrambling.

# Computing Requirements

- Code will be delivered with Jupyter Notebooks of Python 3.10
  - Download [Anaconda Individual Edition](#) if you haven't already
  - Update your Anaconda installation. From a Terminal (MacOS) or Anaconda Prompt (Windows)  
`conda update conda`  
`conda install anaconda=2024.06`
- Readings, code, data will be posted to Canvas: <https://canvas.colorado.edu/courses/109074>
- We will be using pandas, matplotlib, and seaborn but you can explore others if you like
  - Plotly, Altair, Bokeh, etc.
- Students **are not** permitted to use spreadsheet or business intelligence software
  - Excel, Numbers, Tableau, PowerBI

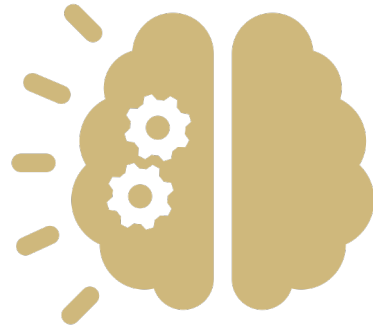
**If you cannot reliably access Anaconda and Canvas or don't have a laptop:  
please contact the instructors immediate to work out an accommodation**

# **Documentation and Professionalization**

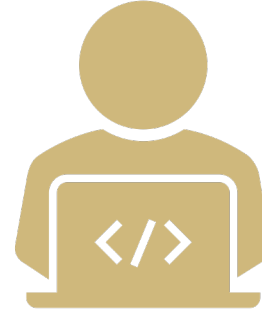
# Data Science Mindset Components



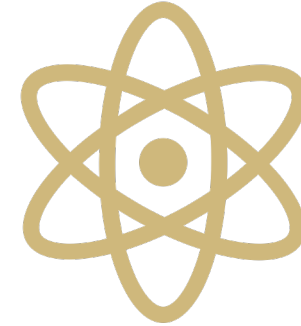
**Growth  
Mindset**



**Computational  
Thinking**



**Hacker  
Ethic**



**Scientific  
Norms**

- Growth Mindset: effort not ability, continual improvement, challenge-seeking, resilience
- Computational Thinking: concepts, practices, perspectives of applying computing technologies
- Hacker Ethic: sharing, openness, creativity, autonomy, curiosity, bias towards action
- Scientific Norms: communalism, skepticism, responsibility, communication, collaboration

# Using Documentation

- Your previous classes may have discouraged using online resources → training wheels are off now!
- Finding, reading, interpreting, and writing documentation are essential skills
  - “Documentation is for ‘real’ developers, not newbies like me” → **WRONG!**
  - Bookmark documentation for [numpy](#), [scipy](#), [pandas](#), [matplotlib](#), and [seaborn](#)
- “It’s not working” is not an acceptable request for help
  - What have you tried? What can you get to work? What does the documentation say?

# Escalating Issues

- **Examples, tutorials, user guides** → *super* helpful general resources, accessible writing style
  - Common use cases and combining multiple functions, check these first to get oriented
- **Reference or API reference** → details about specific functions & methods, more technical
  - If the tutorials or user guides don't address your issue, look to the specifics for your function, method, *etc.*
- **Question-Answer website** → ask (and answer!) questions on StackOverflow
  - Copy-and-paste error messages, search for a generalized version, *etc.*
- **Developers or Development** → details about contributing code, reporting bugs, early releases
  - Maybe you've encountered a genuine bug or boundary case → see if others have had the same problem
  - Most libraries are developed on GitHub, go to the library's repo, and search under "Issues"



# Credit External Resources

- If you use an external resource (documentation, Q&A, blog post, repository/gist) to implement a feature or solve a bug beyond what we've covered in class, just include a link in your code!

```
f, ax = plt.subplots(1,1)

# https://matplotlib.org/stable/tutorials/text/text\_intro.html
ax.text(2,6,r'an equation:  $E=mc^2$ ', fontsize=15)
```

- Using advanced functionality that we haven't covered in class and you're not citing is a reliable signal that you're using external resources without credit → just include a link in your code!
- We reserve the right to request a code review for any submitted assignment. If you're unable or unwilling to explain how something was implemented, you could lose all credit on the assignment
  - Repeated violations will be escalated to the Honor Code office
  - Just include a link in your code!

# Documenting Your Own Code

- The class notebooks make extensive use of Markdown cells to organize and narrate the analysis
- You should develop a similar practice and style of making clear and well-organized notebooks
  - Importing all libraries in one place, loading data in one place, cleaning data after loading, *etc.*
  - Sectioning (and sub-sectioning!) so different steps are easy-to-find
  - Markdown with narrative of what's happening, hyperlinks to resources/documentation
  - Use hanging indentation to help with legibility instead of cramming into single lines
  - Check out style guides like the [Space Telescope Science Institute](#)

# Notebook Time!

- Download the “Week 01.ipynb”
  - Please create a dedicated folder for class instead of keeping everything in Downloads, Desktop, *etc.*
  - Put both these files in the same folder
- Open the “Week 01.ipynb” notebook file
  - From Anaconda Prompt (Windows) or Terminal (Mac), navigate to class folder
  - Launch Jupyter Notebook: `jupyter notebook`
- Make sure the first few cells work
- No grading on exercises, we’ll cover solutions on Thursday

# Final project

- Creating an accessible dataset of all laws before the Colorado Legislature each session
  - <https://leg.colorado.gov/bills-by-bill-number>
  - Bill summaries, sponsors, committees, history, votes
  - What could we do with more accessible data?
- Portions of this data is available in (regrettable) data formats
  - <https://leg.colorado.gov/agencies/house-representatives/session-publications>
  - <https://leg.colorado.gov/agencies/senate/session-publications>
  - <https://leg.colorado.gov/prior-session-information>
- Even as data from a public institution, there are terms and policies
  - <https://leg.colorado.gov/sites/default/files/privacypolicy.pdf>
  - What rules should we be aware of? What disclosures are they making?

**We will return to this through (ungraded) Weekly Assignments and Module Assignments.**

# Next Class

- Do the exercises at the bottom of the Week 01 notebook
- Discuss readings
  - “When the Terms of Service Change to Make Way for A.I. Training”
  - “The Backlash Against AI Scraping is Real and Measurable”
  - “Websites are Blocking the Wrong AI Scrapers”
- Daily note: <https://bit.ly/info4871f24note>
- Today’s number is...

**Thursday**

# Agenda

- 00:00 – 00:05 → Daily Note check-in
- 00:05 – 00:25 → Exploring User-Agents and robots.txt
- 00:25 – 01:00 → Discuss readings and explore Terms of Service and Privacy Policies
- 01:00 – 01:15 → More brainstorming about Final Project

# Daily Note



# Exploring User-Agents and robots.txt

- Jump back into the notebook
- User-Agents Experiment with other

# Take-aways from readings

- “When the Terms of Service Change to Make Way for A.I. Training”
- “The Backlash Against AI Scraping is Real and Measurable”
- “Websites are Blocking the Wrong AI Scrapers”

# Terms of Service and Privacy Policies

- Based on your birthday, skim through a platform's terms of service or privacy policy
  - **Even month, even day, even year:** Instagram terms of service
  - **Even month, even day, odd year:** Instagram privacy policy
  - **Even month, odd day, even year:** TikTok terms of service
  - **Even month, odd day, odd year:** TikTok privacy policy
  - **Odd month, even day, even year:** Twitter/X terms of service
  - **Odd month, even day, odd year:** Twitter/X privacy policy
  - **Odd month, odd day, even year:** Reddit terms of service
  - **Odd month, odd day, odd year:** Reddit privacy policy
- January 1, 2003 → odd months, odd day, odd year → Reddit privacy policy
- Look for keywords related to “scrape”, “API”, “research”, “data”, “abuse”

# Notes

- What's interesting? Unusual? Hard-to-understand?
- Is a college class allowed to retrieve data for research?
- How does this compare to another website's or platform's terms and policies?

# Next class

- Daily note: <https://bit.ly/info4871f24note>
- Today's number is...