While we wait to begin, please remember to fill out the pre-workshop knowledge survey if you haven't already!

Reproducible Data Science (mini) Workshop



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Note that this workshop will be recorded, and this recording and my slides will be available to participants afterward.

What is **data science**?

Data science is the field of study that combines **domain expertise**, **programming skills**, and knowledge of **mathematics and statistics** to extract meaningful insights from data

> "What is data science?" https://www.datarobot.com/wiki/data-science/

What is **reproducible research**?

Research is reproducible when others can reproduce scientific results given only **the original data, code, and documentation**

> Essawy et al. (2020) https://doi.org/10.1016/j.envsoft.2020.104753

What is **open science**?

...the practice of science in such a way that **others can collaborate and contribute**, where research data, lab notes and other research processes are freely available, under terms that enable reuse, redistribution and reproduction of the research and its underlying data and methods

> Foster Open Science, "What is Open Science?" https://www.fosteropenscience.eu/learning/what-is-openscience/

...the idea that scientific knowledge of all kinds should be **openly shared as early as is practical** in the discovery process... the overall goal of open science is to **accelerate scientific progress and discoveries** and to turn these discoveries into *benefits for all*

> Masuzzo & Martens (2017), "Do you speak open science? Resources and tips to learn the language" <u>https://doi.org/10.7287/peerj.preprints.2689v1</u>

Principles of open science

Principles of open science

Open notebook	Open data	Open code
Open research (community science)		
	Open access	Open
Science communication	papers	peer review

Why is open and reproducible science beneficial?

contributes to knowledge equity and justice

accelerates scientific progress and discoveries and to turn these discoveries into benefits for all

increases the transparency and accessibility of scientific research

makes it **easier to remember** what you

did, explain to others, or to re-do analyses on the same or future projects

enables **follow-up research** and meta-analyses

reduces research misconduct (both intentional and unintentional)

Increases paper citation rates

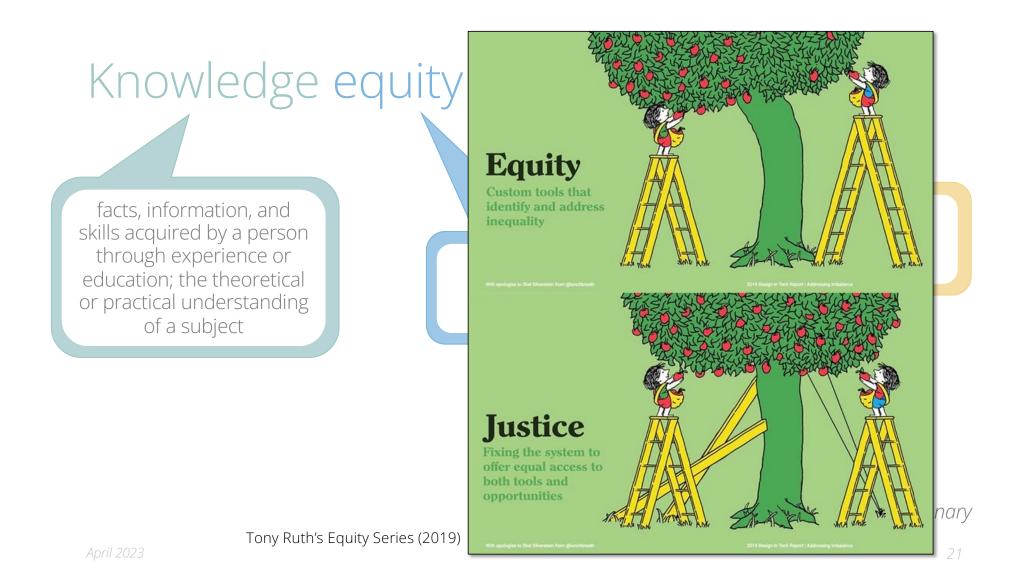
April 2023

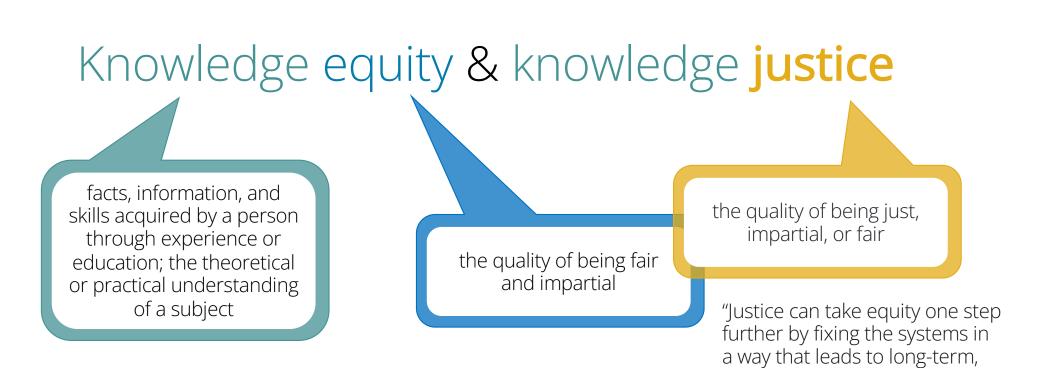
Knowledge equity & knowledge justice

April 2023



Oxford English Dictionary





Erdmann (2021), "Defining: Equity, Equality and Justice" https://achievebrowncounty.org/2021/05/defining-equity-equality-and-justice/

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sustainable, equitable access

for generations to come."

Knowledge equity & knowledge justice

Both can be advanced by facing and acknowledging biases in **who generates** knowledge, **who has access** to information, and **who controls** the distribution of information

> The movement toward open science is a step toward restructuring the system to make it more equitable & just

Principles of open science

How does each of these		
address the issues of		
knowledge (in)equities or		
knowledge (in)justices?		

Open	Open
data	code
Open access	Open
papers	peer review

April 2023

The reality of open and reproducible research

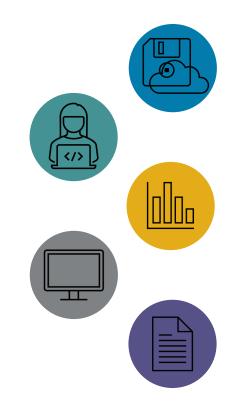
What are <u>two to three tools/practices</u> in your field that facilitate reproducibility or make it **easier** for researchers to make their work reproducible?

What is <u>one area</u> where you think that there is room for **improvement**?



Okay, but how?

Sound **data management** practices Thorough data and analysis **documentation Data-driven** table and figure generation **Public archiving** of data and analyses Manuscript **pre-printing** (as possible)



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RESEARCH DATA MANAGEMENT SERVICE GROUP

Comprehensive Data Management Planning & Services

The Research Data Management Service Group (RDMSG) is a collaborative, campus-wide organization that assists with creating and implementing data management plans, applying best practices for managing data, and finding data management services at any stage of the research process.

https://data.research.cornell.edu/