Setting Up Your Public Data for Success

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Why share data?

- 1. "Broader impact"
- 2. 9% more citations(Piwowar & Vision, 2013)
- 3. A philosophical commitment to the ideals of open science
- 4. You want people to use it



Expectation!



Reality:'(



How can you make your public datasets successful?

- Success = someone using your dataset
 - Downloads are probably the easiest things to track
- What needs to happen for someone to download your data?
 - They know that it exists
 - They know how to use it
 - They need to find the content interesting enough to work with

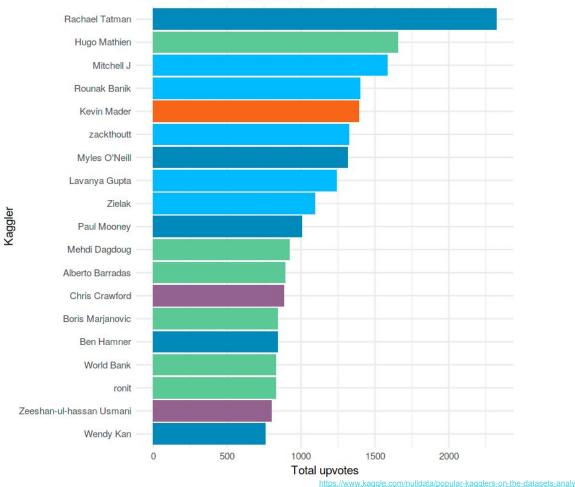


How come I can help?

- I've seen Kaggle's datasets platform grow from 500 to more than 15k datasets (and uploaded around 100 of my own)
- I spend a lot of time interacting with the most voracious consumers of public data: aspiring data scientists
- I ran the numbers! We make our own data <u>public</u>, through, so you're free to poke around on your own.

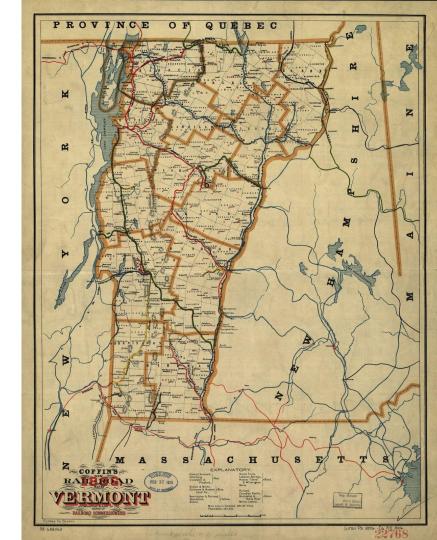


Kagglers whose datasets most upvoted
Top 20 Kagglers aggregated by the upvotes their Datasets received





- 1. During data collection
- 2. Before data release
- 3. After data release



During Data Collection

- Consider the potential audience for your data
 - Researchers
 - Journalists
 - Learners and educators
 - Hobbyists
- Collect data that's as rich as possible while maintaining anonymity (if relevant)
 - Think about what potential audiences might be interested in investigating
 - Consider reporting k-anonymity, t-closeness, l-diversity
 - If you're sharing raw data files you can't use differential privacy



Before Data Release:

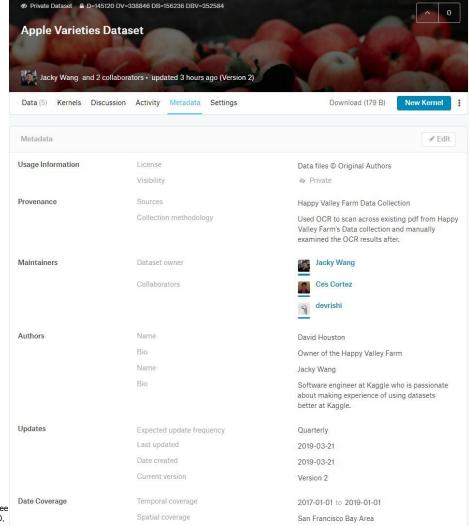
- Prepare clear documentation and metadata
- Provide sample code
- Release data as drop-in replacement for a popular dataset
- Pose questions that could be answered using your data



Before Data Release:

Prepare clear documentation and metadata

- Consider including:
 - License
 - Procenance
 - Maintainers
 - Authors
 - Update schedule
 - Dataset coverage
- Gebru et al 2018 has a nice discussion of metadata for machine learning datasets



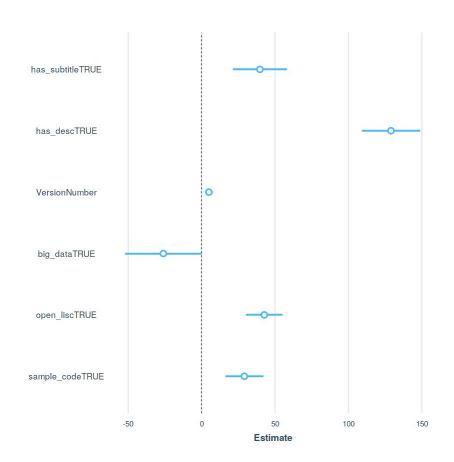
T. Gebru, J. Morgenstern, B. Vecchione, J. W. Vaughan, H. Wallach, H. Daumee III, and K. Crawford. Datasheets for ´datasets. arXiv preprint arXiv:1803.09010, 2018.

Effects of Documentation & Metadata

If you hold everything else steady, then you can increase the # of dataset downloads by:

- Updating your dataset (+5 per update)
- Adding sample code (+29)
- Adding a subtitle (+39)
- Using an open license like CC-BY-NA or CC (+40)
- Adding a description of what's in your dataset (+129)

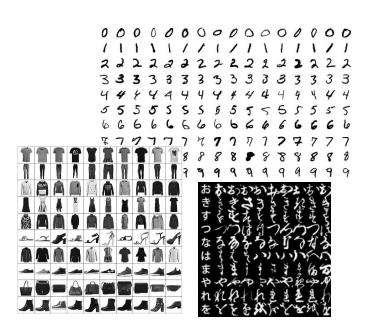
Large (>1 Gigabyte) datasets aren't downloaded more; **people are happy to use small data!**



Before Data Release:

Release data as drop-in replacement for a popular dataset

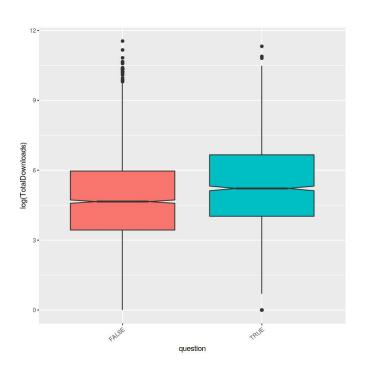
- Example: MNIST (LeCun et al 2010) is a digit recognition dataset and <u>one of the</u> <u>most popular machine learning datasets</u> <u>ever released</u>
- Datasets released as drop-in replacements:
 - Fashion-MNIST (Xaio et al 2017)
 - KMNIST (Clanuwat et al 2018, NerulPS)
- Extremely appealing to learners



Before Data Release:

Pose questions that could be answered using your data

Kaggle datasets with a "?" in their descriptions are downloaded an extra 450 times (on average).



After Data Release

- Update your dataset periodically
 - On average a datasets is downloaded an additional 5 times for every update
- Reach out to relevant communities
- Consider hosting your data on multiple platforms



After Data Release:

Reach out to relevant communities

- Send an announcement to relevant professional organization's mailing lists
- Release a data paper
- Announce your data release on social media
 - Relevant Facebook groups
 - Tweet about it!
 - Don't forget platforms that aren't US-Centric (WeChat, WhatsApp)
- Talk to your university's PR department



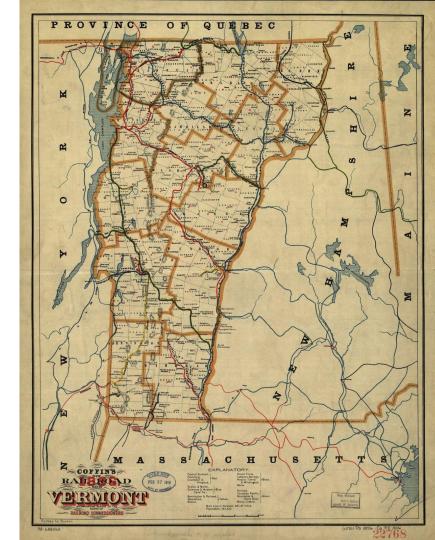
After Data Release:

Host your data on multiple platforms

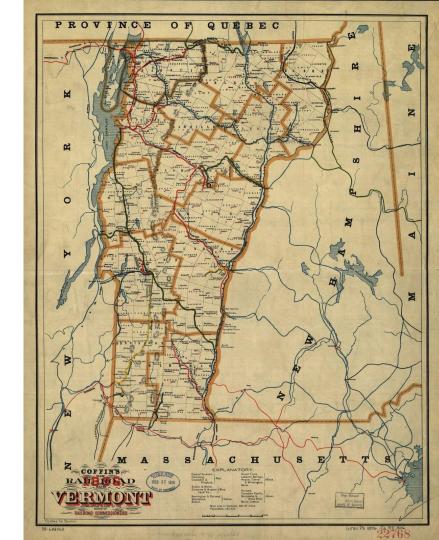
- Redundancy is good and will save your butt (RIP SQLShare)
 - 20% of links NLP papers are dead within a year (Mieskes 2017)
- Sharing on platforms with existing communities can help surface your data to them
- Make sure at least one dataset hosting uses schema.org standards so your data will be included in Google's <u>Dataset</u> Search



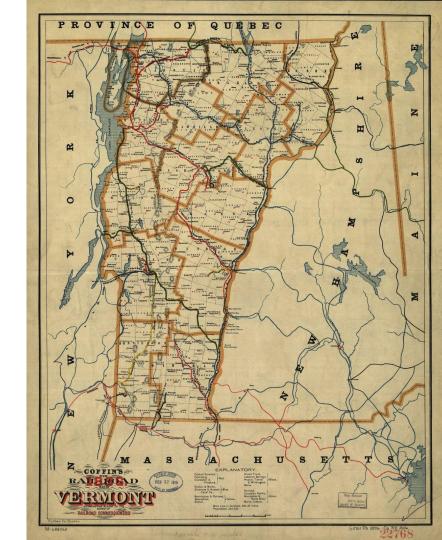
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- 2. Before data release
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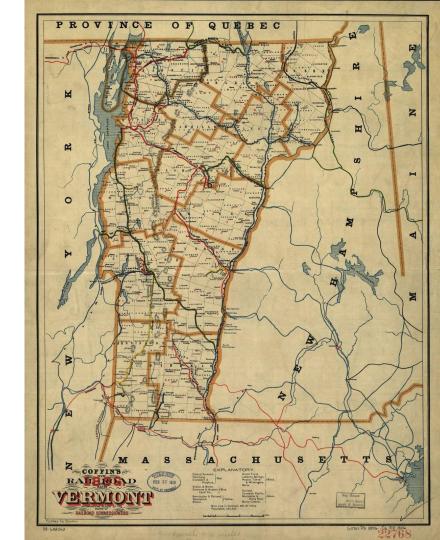
- 1. During data collection
 - a. Consider your audience
 - b. Collect rich data
- 2. Before data release
- 3. After data release



- 1. During data collection
- 2. Before data release
 - a. Documentation & metadata
 - b. Sample code
 - c. Drop-in replacement
 - d. Pose questions
- 3. After data release



- 1. During data collection
- 2. Before data release
- 3. After data release
 - a. Update your data
 - b. Reach out to relevant communities
 - c. Redundant hosting



Thanks! Questions?

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Slides: http://www.rctatman.com/talks/

Data: https://www.kaggle.com/kaggle/meta-kaggle

Code: https://www.kaggle.com/rtatman/what-makes-a-dataset-successful

