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# Agenda

## Boost your reproducibility with Binder

- 13:30 Registration and introductions
- 13:40 Introduction to the workshop and The Turing Way
- 13:50 Presentation: Why you need a reproducible computing environment and how Binder can help
- 15:00 Coffee break
- 15:30 Code along demo: Zero to Binder, build a Binder resource
- 16:30 Build your own Binder
- 16:50 Feedback, group picture and close

#TuringWay @kirstie\_j @mybinderteam

<https://doi.org/10.5281/zenodo.3632909>

**The  
Alan Turing  
Institute**

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# **The Turing Way**

**Boost your reproducibility  
with Binder workshop**

**Kirstie Whitaker**

Pronouns: she/her

#TuringWay @kirstie\_j @mybinderteam

<https://doi.org/10.5281/zenodo.3632909>



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#TuringWay @kirstie\_j @mybinderteam

<https://doi.org/10.5281/zenodo.3632909>

# The Turing Way is:

- a book
- a community
- a global collaboration
- a whole tonne of work



Rachael Ainsworth



Becky Arnold



Louise Bowler



Sarah Gibson



Patricia Herterich



James Hetherington



Rosie Higman



Anna Krystalli



Catherine Lawrence



Alex Morley



Martin O'Reilly

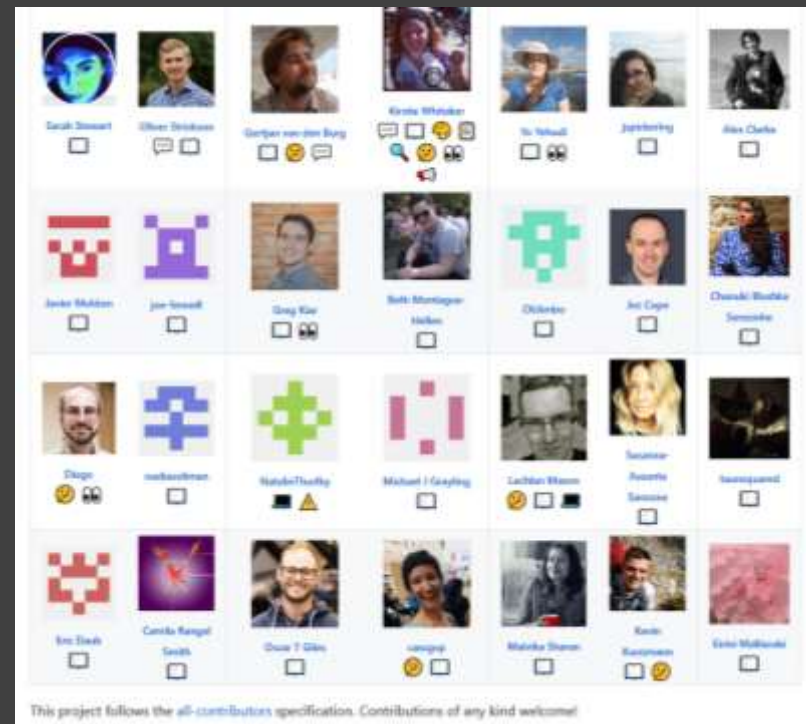


Malvika Sharan

#TuringWay @kirstie\_j @mybinderteam

<https://doi.org/10.5281/zenodo.3632909>

# Thank you to all our contributors



This project follows the [all-contributors](https://allcontributors.org/) specification. Contributions of any kind welcome!

<https://github.com/alan-turing-institute/the-turing-way#contributors>  
<https://allcontributors.org/docs/en/emoji-key>

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<https://doi.org/10.5281/zenodo.3632909>

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# The Turing Institute



<https://www.turing.ac.uk/news/enigma-machine-goes-display-alan-turing-institute>  
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<https://doi.org/10.5281/zenodo.3632909>





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<https://doi.org/10.5281/zenodo.3632909>



<https://www.bbc.co.uk/programmes/p0704h04>

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<https://doi.org/10.5281/zenodo.3632909>





<https://bletchleypark.org.uk>  
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# University network



THE UNIVERSITY  
of EDINBURGH



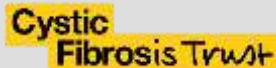
#TuringWay @kirstie\_j @mybinderteam

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# The Institute's partners and collaborators



Lloyd's Register  
Foundation

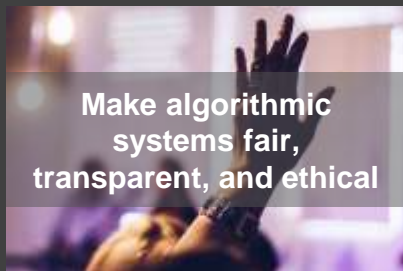


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# Challenges

Advance data science and artificial intelligence to...



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<https://doi.org/10.5281/zenodo.3632909>



# The Alan Turing Institute to spearhead new cutting-edge data science and AI research after £48 million government funding boost

Tuesday 18 Dec 2018

Learn more ↓

<https://www.turing.ac.uk/news/alan-turing-institute-spearhead-new-cutting-edge-data-science-and-artificial-intelligence>

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# The Turing Way



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<https://doi.org/10.5281/zenodo.3632909>

## 1. Introduction

## 2. Reproducibility

## 3. Open Research

## 4. Version Control

## 5. Collaborating on GitHub/GitLab

## 6. Research Data Management

## 7. Reproducible Environments

## 8. Testing

## 9. Reviewing

## 10. Continuous Integration

## 11. Reproducible Research with Make

## 12. Risk Assessment

# Welcome to the Turing Way

The Turing Way is a lightly opinionated guide to reproducible data science.

Our goal is to provide all the information that researchers need at the start of their projects to ensure that they are easy to reproduce at the end.

This also means making sure PhD students, postdocs, PIs and funding teams know which parts of the “responsibility of reproducibility” they can affect, and what they should do to nudge data science to being more efficient, effective and understandable.

### A bit more background

Reproducible research is necessary to ensure that scientific work can be trusted. Funders and publishers are beginning to require that publications include access to the underlying data and the analysis code. The goal is to ensure that all results can be independently verified and built upon in future work. This is sometimes easier said than done. Sharing these research outputs means understanding data management, library sciences, software development, and continuous integration techniques: skills that are not widely taught or expected of academic researchers and data scientists.

The Turing Way is a handbook to support students, their supervisors, funders and journal editors

<https://the-turing-way.netlify.com/introduction/introduction>

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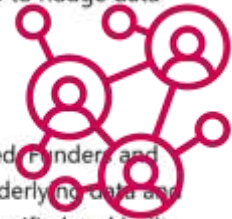
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<https://doi.org/10.5281/zenodo.3632909>

		Data	
		Same	Different
Analysis	Same	Reproducible	Replicable
	Different	Robust	Generalisable

<https://the-turing-way.netlify.com/reproducibility/03/definitions.html>

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<https://doi.org/10.5281/zenodo.3632909>



Is not considered  
for promotion

Held to higher  
standards than  
others

Publication bias  
towards novel  
findings

# Barriers to reproducible research

Requires  
additional  
skills

Plead the 5th

Support additional  
users

Takes time

<https://doi.org/10.6084/m9.figshare.5537101>  
#TuringWay @kirstie\_j @mybinderteam  
<https://doi.org/10.5281/zenodo.3632909>

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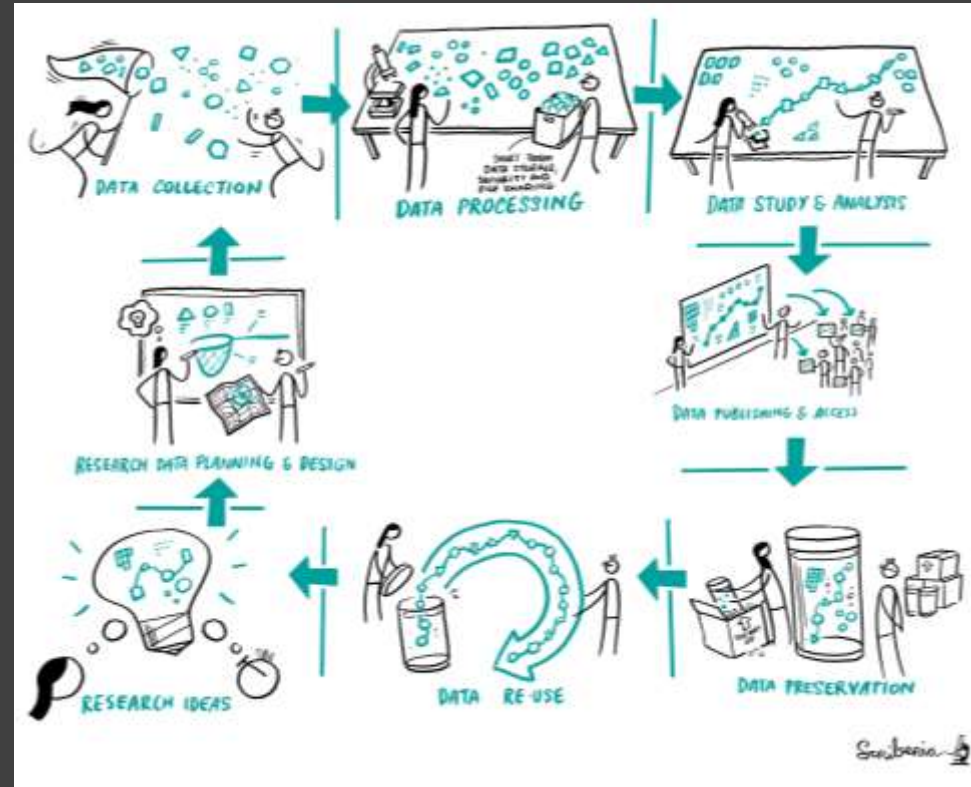
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#TuringWay @kirstie\_j @mybinderteam  
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To be fully reproducible  
we have to cover all the  
steps of the research  
cycle

And that is super  
overwhelming...but  
we're here to help





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<https://doi.org/10.5281/zenodo.3632909>

# Testing for research

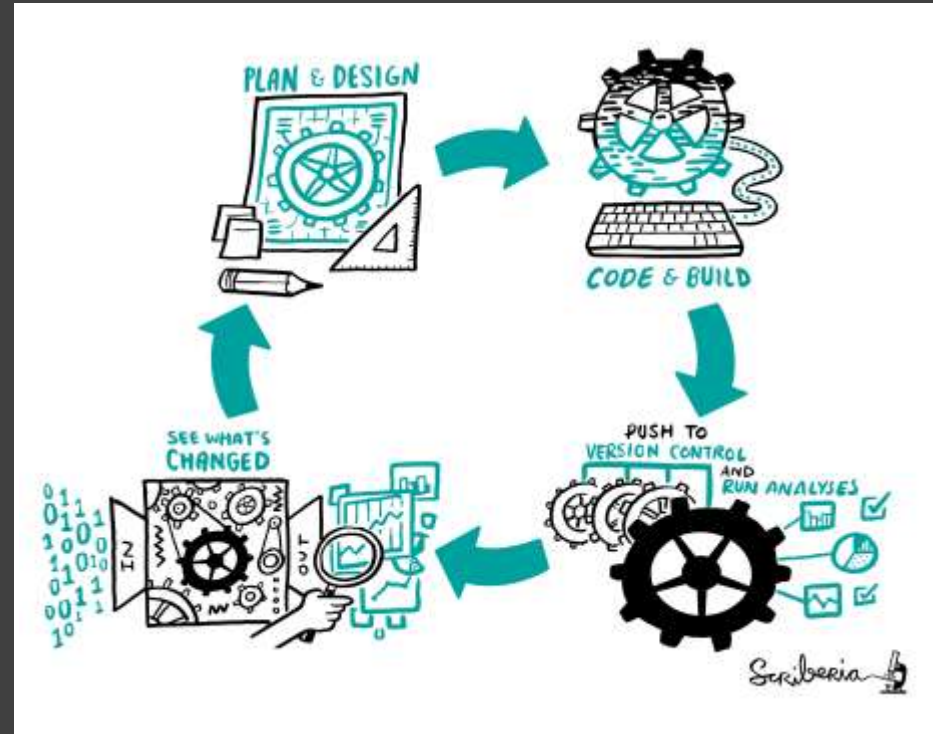
```
Assert.AreEqual(  
    GetTimeOfDay(),  
    "Morning" )
```

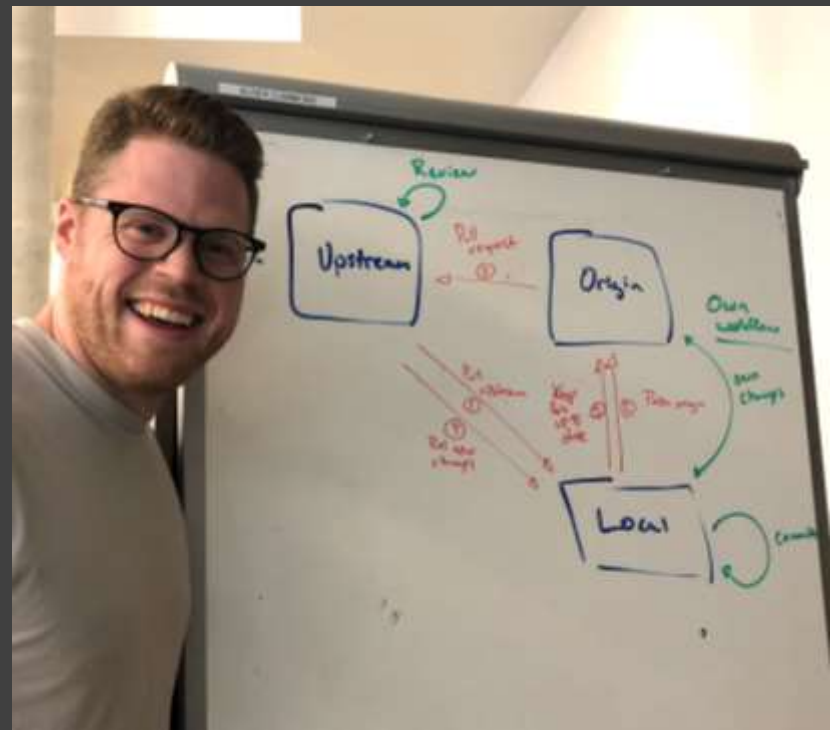
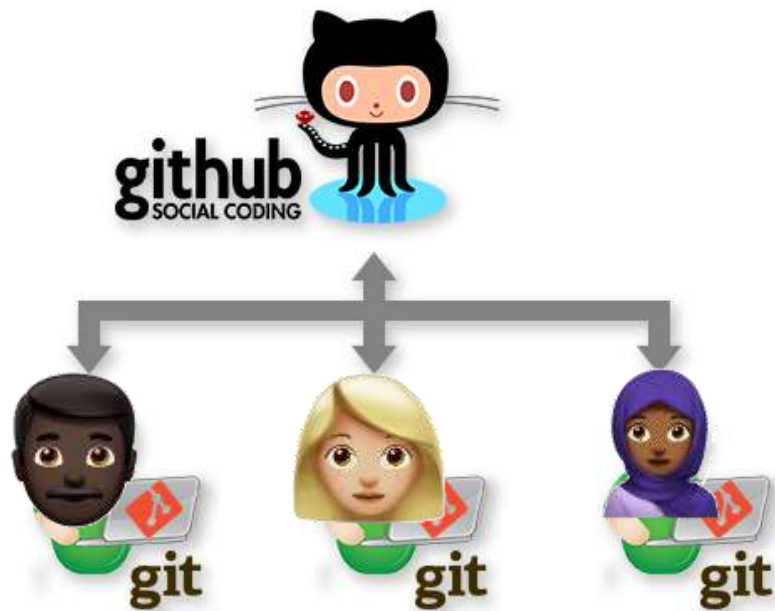




# Continuous integration

- Plan and design your experiment
- Write down the steps in code
- Push to version control and run the analyses
- Test to see what's changed





[https://the-turing-way.netlify.com/collaborating\\_github/collaborating\\_github.html](https://the-turing-way.netlify.com/collaborating_github/collaborating_github.html)

[https://the-turing-way.netlify.com/version\\_control/version\\_control.html](https://the-turing-way.netlify.com/version_control/version_control.html)

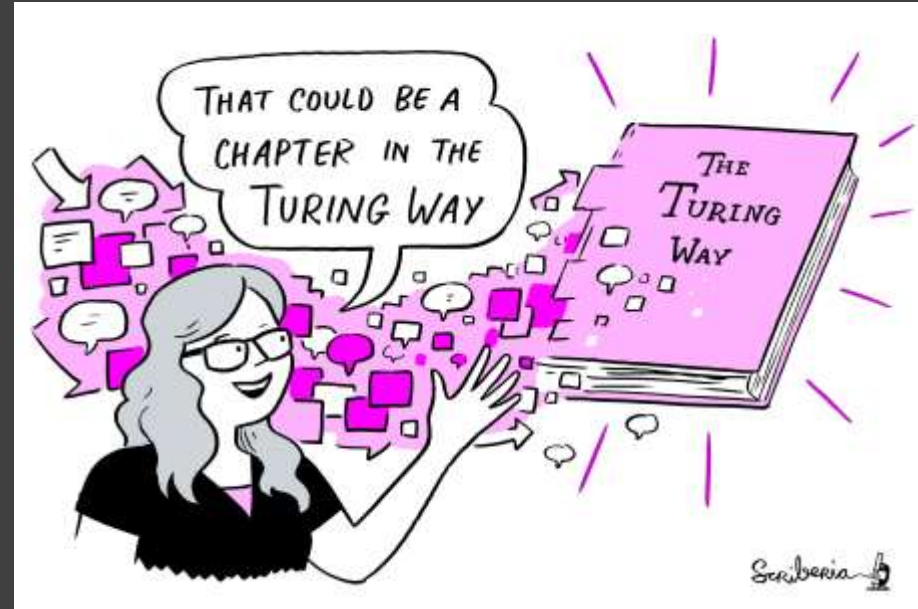
<https://neurohackademy.org>

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<https://doi.org/10.5281/zenodo.3632909>

# Extension in 2020

- Expand scope to all data science practices
  - Reproducibility
  - Scoping and designing a data science project
  - Ethics
  - Communication and visualisation
  - Collaborative working



[https://github.com/  
alan-turing-institute/the-turing-way/  
blob/master/project\\_management/  
tps-funding-application-20190429.md](https://github.com/alan-turing-institute/the-turing-way/blob/master/project_management/tps-funding-application-20190429.md)

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<https://doi.org/10.5281/zenodo.3632909>

---

# A global collaboration



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# Patricia Herterich

“What really sets The Turing Way apart is HOW we’re writing the book. The focus on community, the commitment to transparency and working open right from the beginning is an exciting (and terrifying) new way of working.”



<https://rd-alliance.org/users/patricia-herterich>  
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<https://doi.org/10.5281/zenodo.3632909>



# Open Leadership Principles



## Understanding

You make the work accessible and clear

**Read more**

<https://mozilla.github.io/olm-whitepaper>

**moz://a**



## Sharing

You make the work easy to adapt, reproduce, and spread



## Participation & Inclusion

You build shared ownership and agency to make the work inviting and sustainable for all.

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# Goals for the workshop

- Understand how your computational environment impacts reproducibility
- Learn what Binder is and how it can help make your research reproducible
- Build your own Binder!



# Our Code of Conduct

“The Turing Way team are dedicated to providing a welcoming and supportive environment for all people...we do not tolerate behaviour that is disrespectful to our community members or that excludes, intimidates, or causes discomfort to others.”



- Be respectful of different viewpoints and experiences.
- Use welcoming and inclusive language.
- Do not harass people.
- Respect the privacy and safety of others.

Please do not take pictures of anyone without their permission.

- Be considerate of others' participation.
- Don't be a bystander.



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- Respect the privacy and safety of others.

Please do not take pictures of anyone without their permission.

- Be considerate of others' participation.
- Don't be a bystander.
- **Anita, Felix and Jeremy** are here to help



# Thank you to current (& future) contributors



This project follows the [all-contributors](#) specification. Contributions of any kind welcome!

<https://github.com/alan-turing-institute/the-turing-way#contributors>  
<https://allcontributors.org/docs/en/emoji-key>

#TuringWay @kirstie\_j @mybinderteam  
<https://doi.org/10.5281/zenodo.3632909>

# Thank you

The  
Alan Turing  
Institute



- Book: <https://the-turing-way.netlify.com>
- Newsletter: <https://tinyletter.com/TuringWay>
- GitHub: <https://github.com/alan-turing-institute/the-turing-way>
- Chat: <https://gitter.im/alan-turing-institute/the-turing-way>
- This work was supported by The UKRI Strategic Priorities Fund under the EPSRC Grant EP/T001569/1, particularly the "Tools, Practices and Systems" theme within that grant, and by The Alan Turing Institute under the EPSRC grant EP/N510129/1
- Unsplash photos by Adolfo Felix, James Pond, Jose Alejandro Cuffia, Kinson Leung, Mateo Vrbnjak, Mimi thian, Omar Albeik, Perry Grone, Toa Heftiba, Tomasz Frankows, Wilmer Martinez
- Noun Project icons by Aybige, Luis Prado, Edward Boatman, Becris, Rose Alice Design, Hyemm.work
- Original artwork by Scriberia: <https://doi.org/10.5281/zenodo.3332807>

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# A note on the name

- I never thought the name would be approved!
- This is not a Turing project (although it has great support from the Institute)
- We are creating guidance together, the way is a journey not a set of rules





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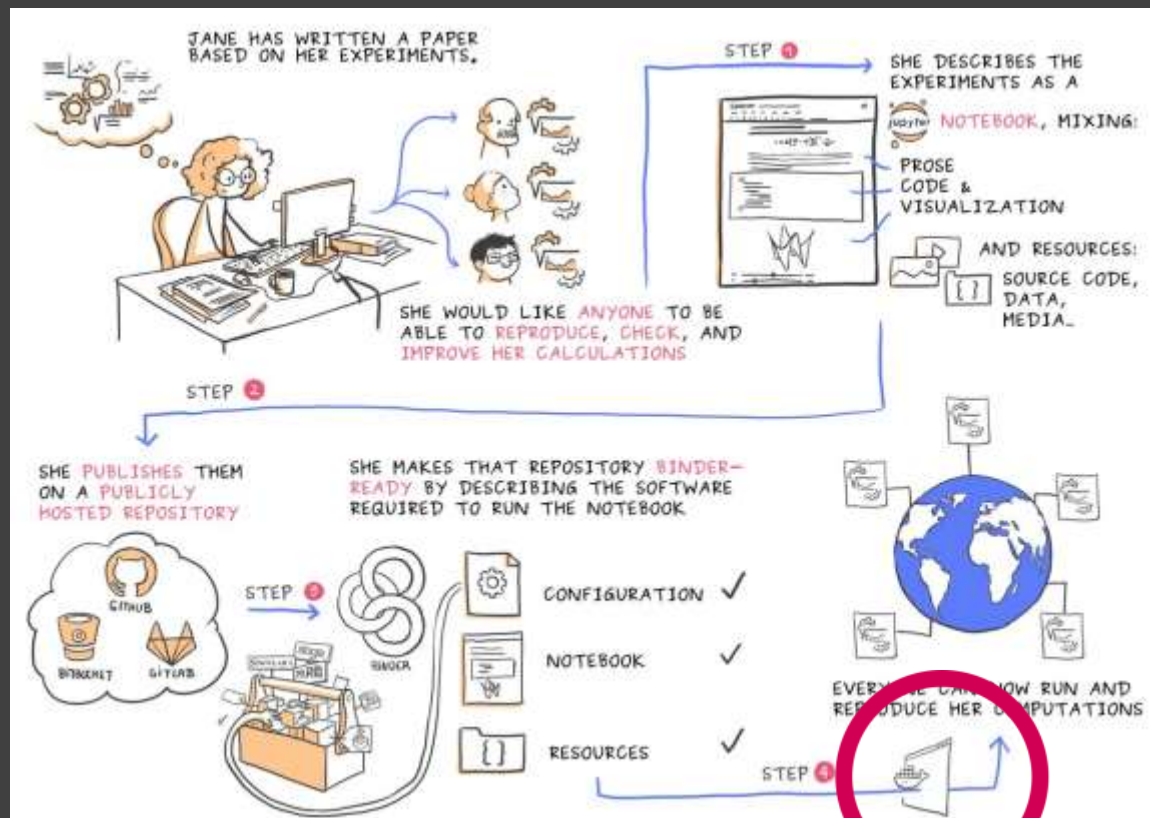
# Turing Way & Binder



#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

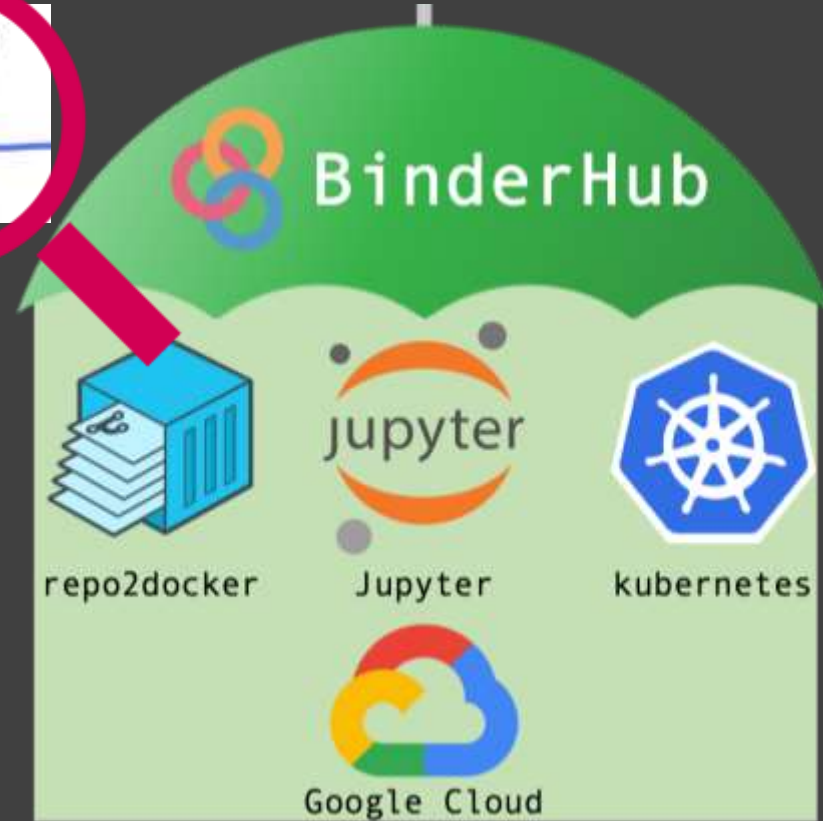


Courtesy of Juliette Taka: <https://twitter.com/mybinderteam/status/1082556317842264064>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>



Courtesy of Juliette Taka: <https://twitter.com/mybinderproject/status/1082556317842264064>  
#PyDataON #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

- Coordinate cloud computing resources with Kubernetes (k8s)
- Make it easy for users to access with a JupyterHub
- Set up the environment from your GitHub repository



<https://binderhub.readthedocs.io>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

# Sarah Gibson

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“It took me a while to feel like I knew enough to contribute to Binder. But the team are always so excited to have my input. Its really motivating to be part of such a welcoming community.”



<https://www.turing.ac.uk/people/researchers/sarah-gibson>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>



- Check analysis on my phone
- Share the responsibility with busy PIs
- Requires version control, capturing environment and new build for each change





## Table of Contents

### Getting started with Binder

Getting started with Binder  
Common usage patterns in Binder

### How to...

Choose languages for your environment  
Configure the user interface  
Generate custom launch badges for your Binder repository  
Track repository data on mybinder.org  
Change launch link

## What is mybinder.org?

mybinder.org is a single deployment of a BinderHub instance, managed by the Binder community. It serves as both a public service and a demonstration of the BinderHub technology, though it is by no means the only BinderHub in existence. If you're interested in deploying your own BinderHub for your own uses, please see the [BinderHub documentation](#) and don't hesitate to reach out to the [Binder community](#).

For more information, check out [About mybinder.org](#).

## Is mybinder.org free to use?

Yes! Though note that it has relatively [limited computational resources](#).

## How much does running mybinder.org cost?

Great question! If you're interested in the technical costs of running mybinder.org, we publish a semi-up-to-date dataset of our costs at the [binder-data](#) repository. In addition, you can explore these costs with the binder link below!



## How can mybinder.org be free to use?

### On this page

What is a Binder?  
What is the Binder community?  
What is BinderHub?  
What is mybinder.org?  
Is mybinder.org free to use?  
How much does running mybinder.org cost?  
How can mybinder.org be free to use?  
How much memory am I given when using Binder?  
How long will my Binder session last?  
Can I use mybinder.org for a live demo or workshop?  
How does mybinder.org ensure user privacy?  
How secure is mybinder.org?  
Where can I report a security issue?  
Can I push data from my Binder session back to my repository?  
Can I put my configuration files outside the root of the repository?  
What factors influence the time it takes a Binder session to start?  
Will repos with fewer notebooks launch faster? Should I split my

Thanks to Google Cloud and OVH for sponsoring our computers 🐛



Starting repository: jupyterhub/binder-billing/master

New to Binder? Check out the [Binder Documentation](#) for more information.

Build logs

show

Here's a non-interactive preview on [nbviewer](#) while we start a server for you. Your binder will open automatically when it is ready.



JUPYTER

FAQ



binder-billing

<https://mybinder.readthedocs.io/en/latest/faq.html#how-much-does-running-mybinder-org-cost>  
#PyDataLDN #TuringWay @kirstie\_j  
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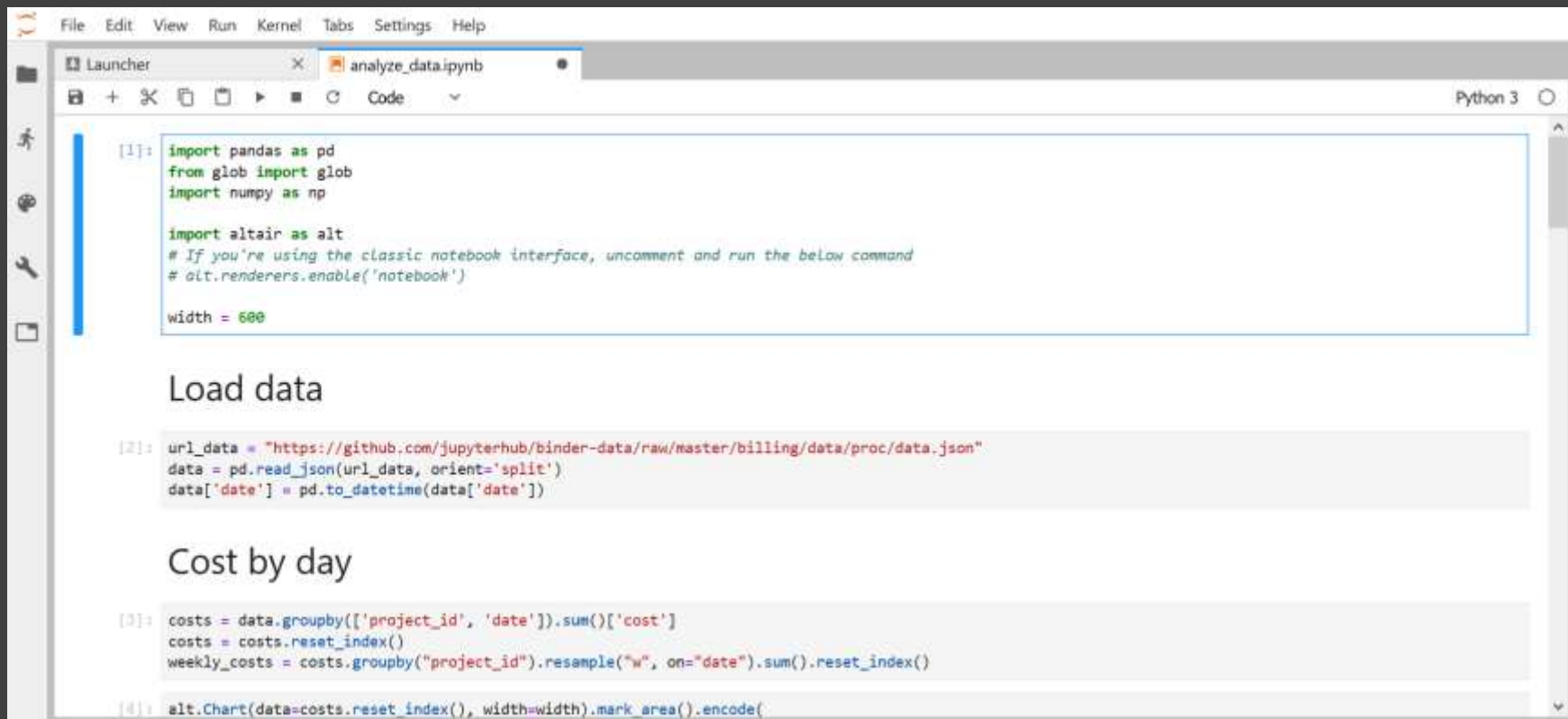
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The screenshot shows a Jupyter Notebook window titled 'analyze\_data.ipynb'. The interface includes a top menu bar with 'File', 'Edit', 'View', 'Run', 'Kernel', 'Tabs', 'Settings', and 'Help'. Below the menu is a toolbar with icons for saving, opening, and running code. The notebook content is divided into cells. The first cell contains import statements for pandas, glob, numpy, and altair, along with a comment about enabling altair's notebook renderer and a variable 'width' set to 600. The second cell, titled 'Load data', contains code to read a JSON file from a GitHub URL and convert the 'date' column to datetime. The third cell, titled 'Cost by day', contains code to group data by project\_id and date, calculate costs, and create a weekly cost series. The fourth cell contains code to create an altair chart from the weekly costs data.

```
[1]: import pandas as pd
from glob import glob
import numpy as np

import altair as alt
# If you're using the classic notebook interface, uncomment and run the below command
# alt.renderers.enable('notebook')

width = 600
```

## Load data

```
[2]: url_data = "https://github.com/jupyterhub/binder-data/raw/master/billing/data/proc/data.json"
data = pd.read_json(url_data, orient='split')
data['date'] = pd.to_datetime(data['date'])
```

## Cost by day

```
[3]: costs = data.groupby(['project_id', 'date']).sum()['cost']
costs = costs.reset_index()
weekly_costs = costs.groupby("project_id").resample("w", on="date").sum().reset_index()

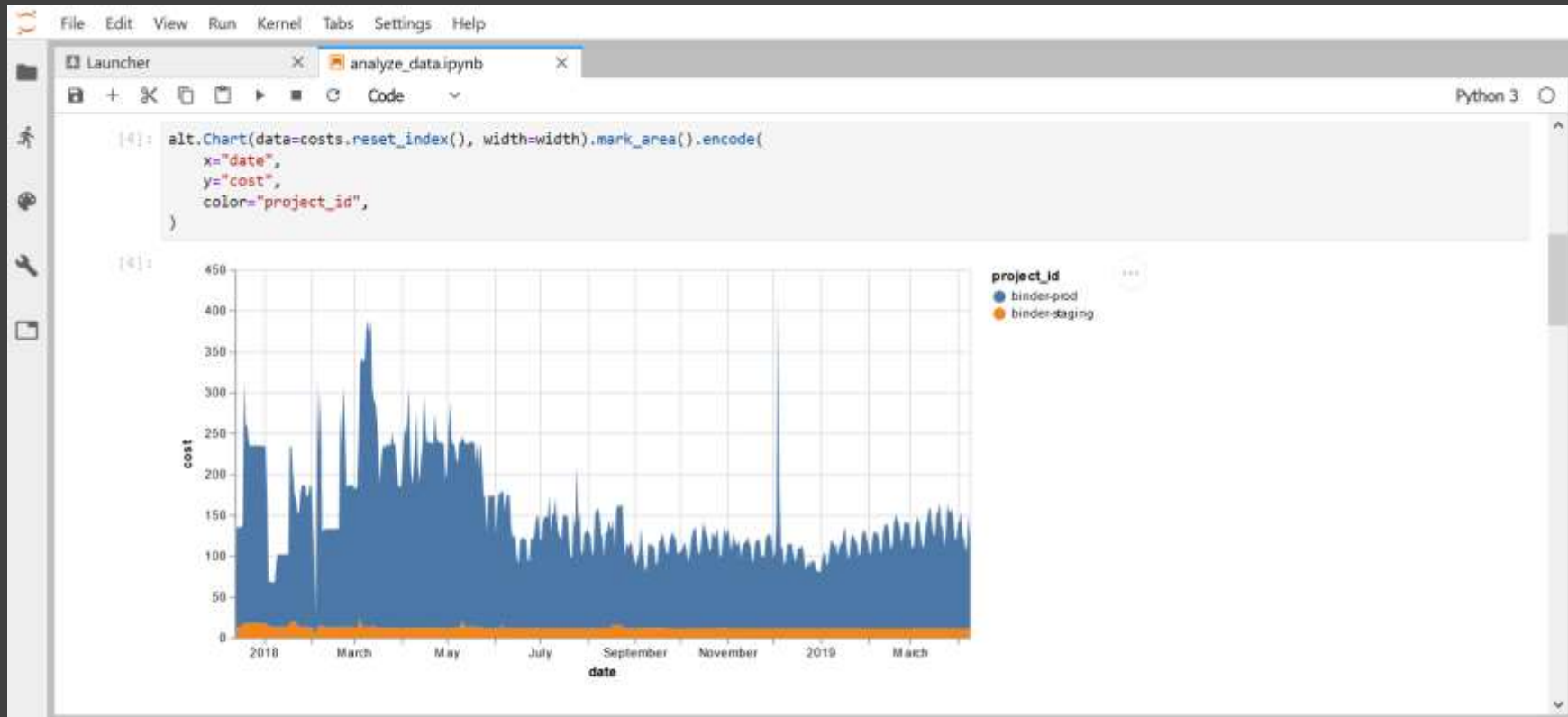
[4]: alt.Chart(data=costs.reset_index(), width=width).mark_area().encode(
```

<https://mybinder.readthedocs.io/en/latest/faq.html#how-much-does-running-mybinder-org-cost>

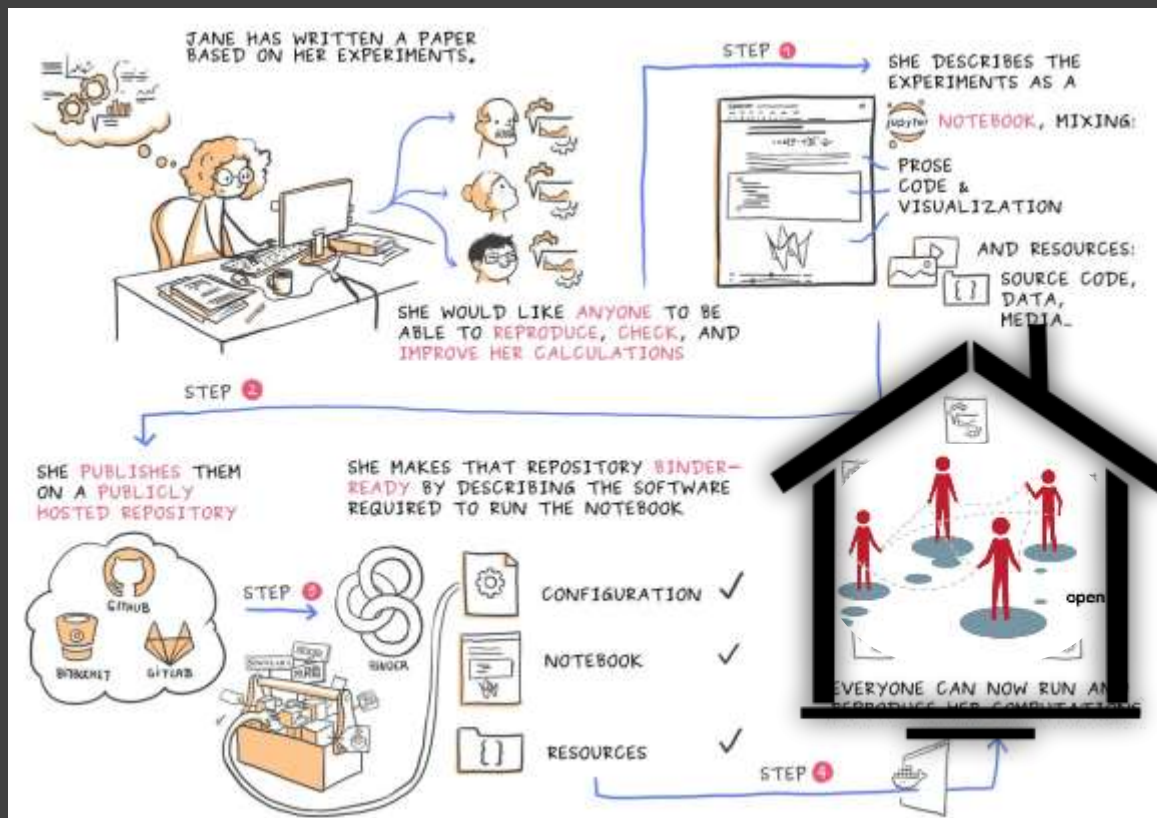
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#PyDataLDN #TuringWay @kirstie\_j

<https://doi.org/10.5281/zenodo.3632909>

# The Alan Turing Institute



Loading repository (can take 30s or more to load): sgibson91/branchLSTM/sgibson91python-runtime-patch

New to Binder? Check out the [Binder Documentation](#) for more information.

Build logs

[show](#)

Here's a non-interactive preview on nbviewer while we start a server for you. Your binder will open automatically when it is ready.



JUPYTER

FAQ



branchLSTM

sgibson91python-runtime-patch

<https://github.com/kochkinaelena/branchLSTM> (on Turing Way Hub)

#PyDataLDN #TuringWay @kirstie\_j

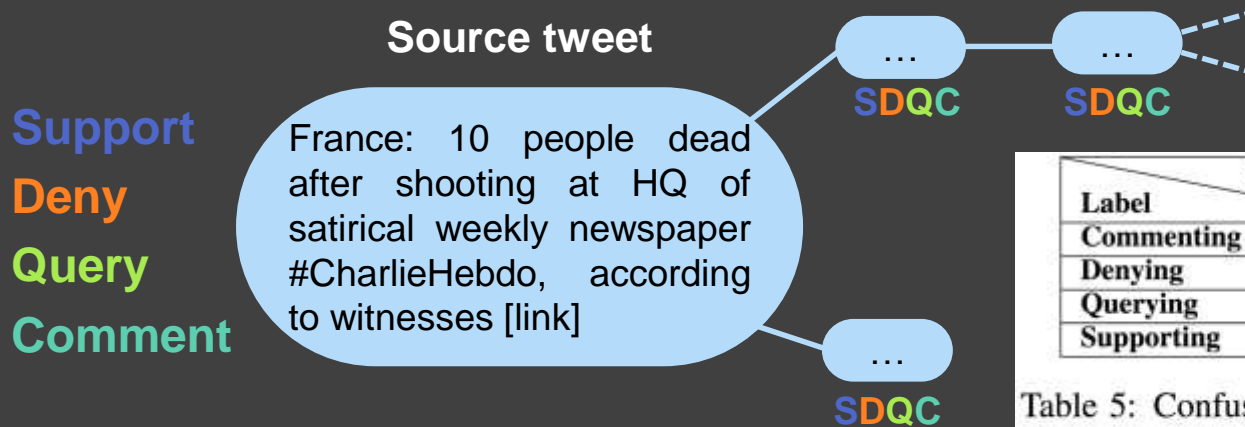
<https://doi.org/10.5281/zenodo.3632909>

# Champion: Elena Kochkina



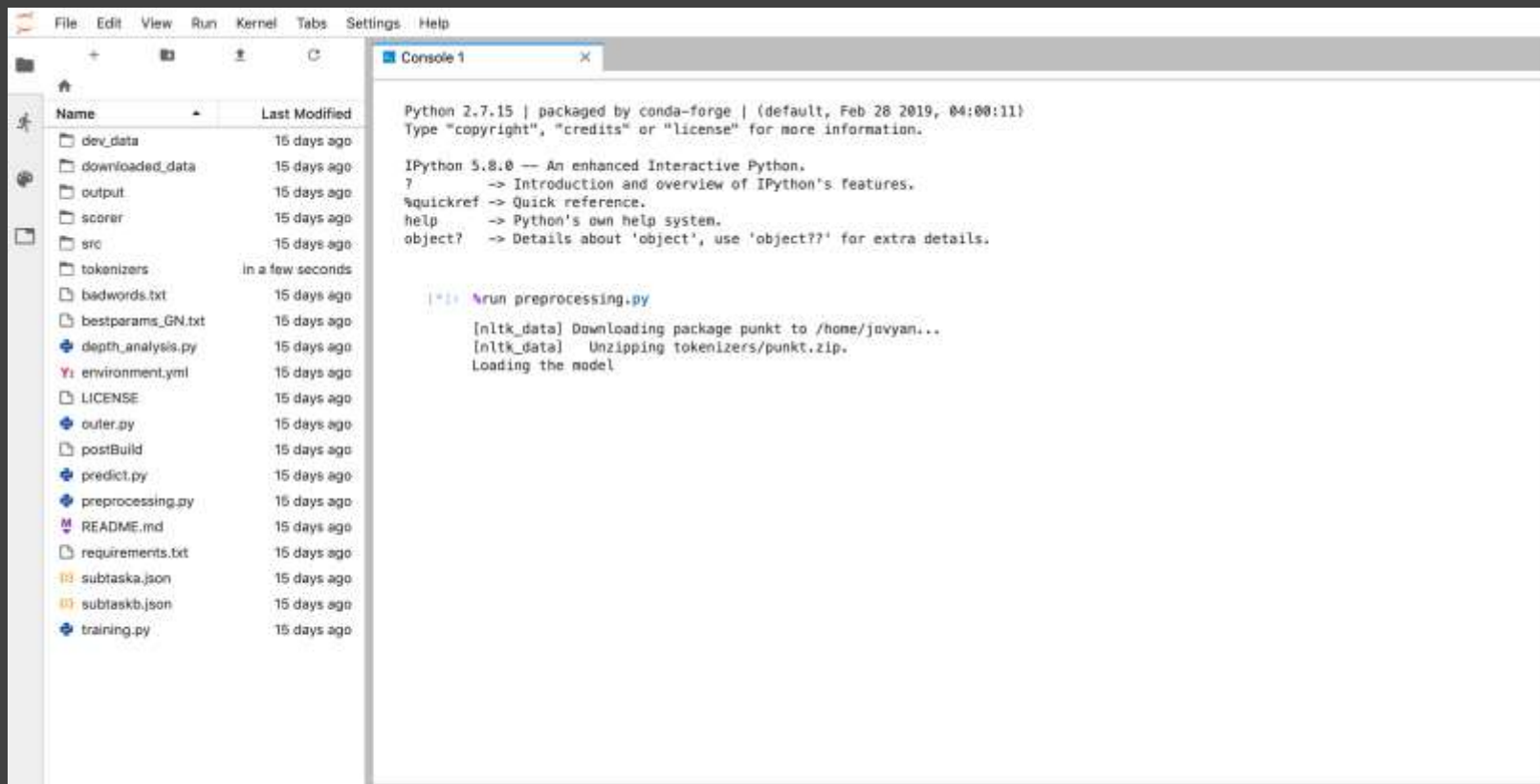
Turing at SemEval-2017 Task 8: Sequential Approach to Rumour Stance Classification with Branch-LSTM

Elena Kochkina, Maria Liakata, Isabelle Augenstein



Label \ Prediction	Prediction			
	C	D	Q	S
Commenting	760	0	12	6
Denying	68	0	1	2
Querying	69	0	36	1
Supporting	67	0	1	26

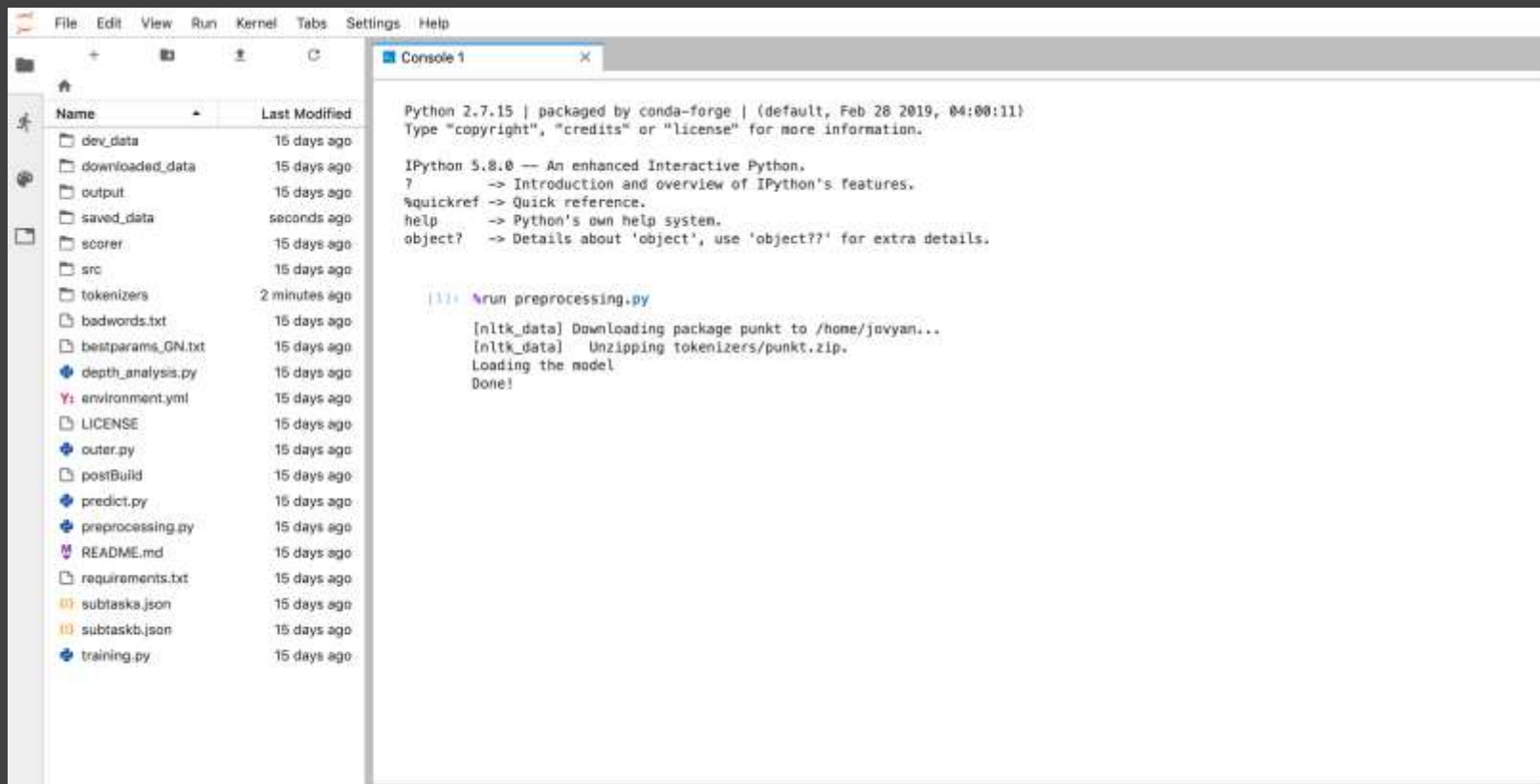
Table 5: Confusion matrix for testing set predictions



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<https://doi.org/10.5281/zenodo.3632909>

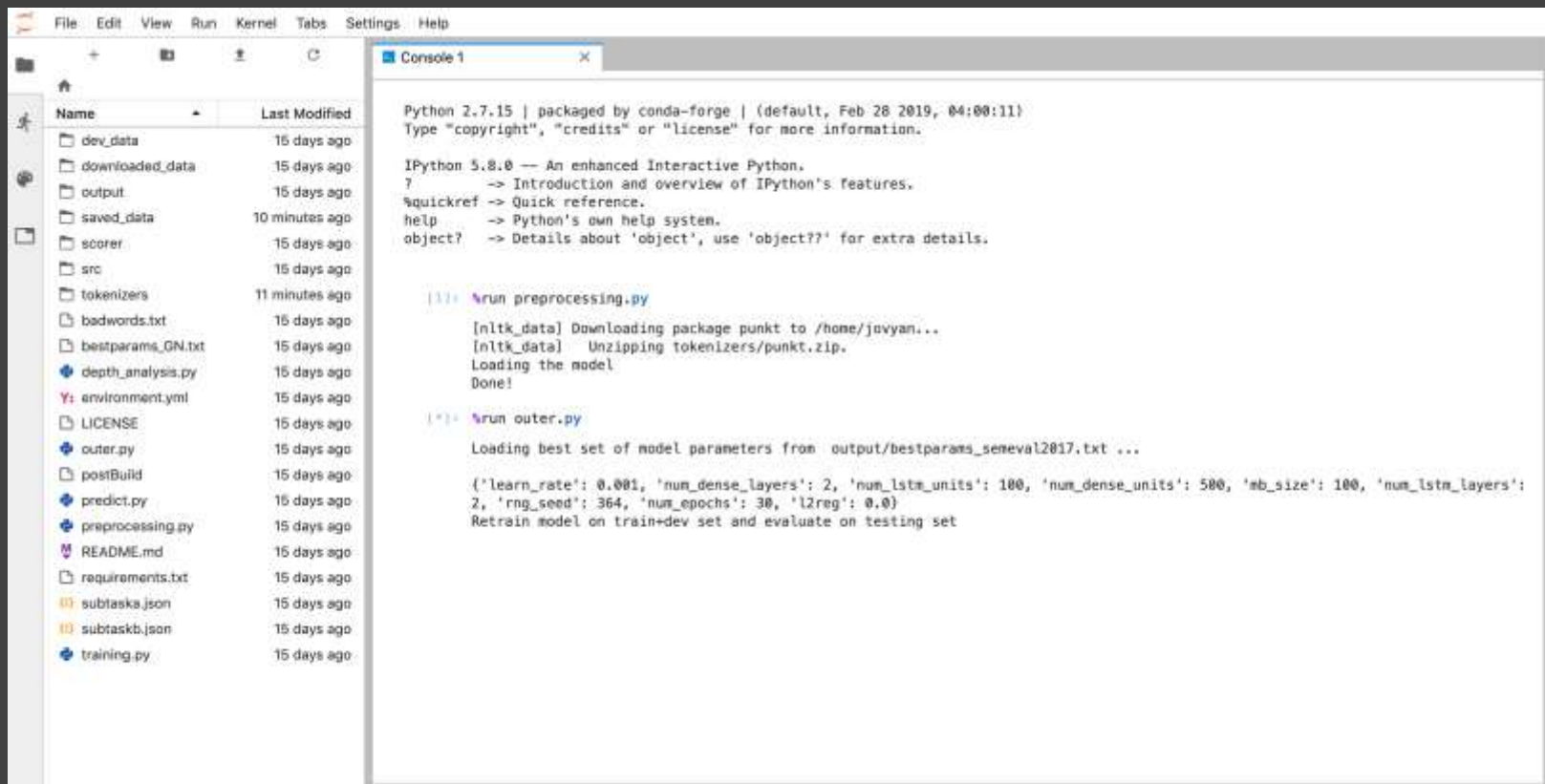


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#PyDataLDN #TuringWay @kirstie\_j

<https://doi.org/10.5281/zenodo.3632909>





# Elena Kochkina

---

“How would I have known that it would be different on a different machine?! I only have access to the university HPC to run deep learning analyses.”



<https://warwick.ac.uk/fac/sci/dcs/people/research/mapmbc>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

---

# Gertjan van den Burg

“The fun part of data science is the modelling. Being able to read in information from a csv file should not be the hardest part.”



<https://gertjanvandenburgh.com>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

alan-turing-institute / CleverCSVDemo

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No description, website, or topics provided.

23 commits 1 branch 0 releases 1 contributor MIT

branches: master • New pull request

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GjrdBurg add more examples and clarify · Latest commit 1304aaf 4 days ago

data	add more examples and clarify	4 days ago
images	add qr code with link to repo	12 days ago
CSV_dialect_detection_with_CleverCSV.py..	add more examples and clarify	4 days ago
CSV_dialect_detection_with_CleverCSV.md	add more examples and clarify	4 days ago
LICENSE	Add makefile and create the notebook from Markdown	7 days ago
Makefile	Add makefile and create the notebook from Markdown	7 days ago
README.md	Add binder thingy to Readme	13 days ago
requirements.txt	add termcolor dependency	6 days ago

README.md

## CleverCSV Demonstration

[launch](#) [binder](#)

This repository contains a demonstration of CleverCSV, a Python package for robust handling of non-standard (messy) CSV files. It is based on the work [Wrangling Messy CSV Files by Detecting Row and Type Patterns](#) by Gertjan van den Burg, Alfredo Nazabal, and Charles Sutton.

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#PyDataLDN #TuringWay @kirstie\_j  
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alan-turing-institute / CleverCSVDemo

Unwatch 6 Star 0 Fork 1

Code Issues 0 Pull requests 0 Actions Projects 0 Wiki Insights

No description, website, or topics provided.

23 commits 1 branch 0 releases 1 contributor MIT

branches: master • New pull request

Create new file Upload files Find file Clone or download +

GjrdBurg add more examples and clarify · Latest commit 8304aaf 4 days ago

data	add more examples and clarify	a day ago
images	add qr code with link to repo	12 days ago
CSV_dialect_detection_with_CleverCSV.ipynb	add more examples and clarify	a day ago
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arXiv:1811.11242

## CSV dialect detection with CleverCSV

Author: [Gertjan van den Burg](#)

In this note we'll show some examples of using CleverCSV, a package for handling messy CSV files. We'll start with a motivating example and then show some other files where CleverCSV shines. CleverCSV was developed as part of a research project on automating data wrangling. It achieves an accuracy of 97% on over 9300 real-world CSV files and improves the accuracy on messy files by 21% over standard tools.

Handy links:

- [Paper on arXiv](#)
- [CleverCSV on GitHub](#)
- [CleverCSV on PyPI](#)
- [Reproducible Research Repo](#)

## IMDB Movie data

Alice is a data scientist who would like to analyse the movie ratings on IMDB for movies of different genres. She found [a dataset shared by a user on Kaggle](#) that contains information of over 14,000 movies. Great!

The data is stored in a CSV file, which is a very common data format for sharing tabular data. The first few lines of the file look like this:

## IMDB Movie data

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The data is stored in a CSV file, which is a very common data format for sharing tabular data. The first few lines of the file look like this:

```
fn,tid,title,wordsInTitle,url,imdbRating,ratingCount,duration,year,type,nrOfWins,nrOfNominations,nrOfPhotos,nrOf
NewsArticles,nrOfUserReviews,nrOfGenre>Action,Adult,Adventure,Animation,Biography,Comedy,Crime,Documentary,Drama
,Family,Fantasy,FilmNoir,GameShow,History,Horror,Music,Musical,Mystery,News,RealityTV,Romance,SciFi,Short,Sport,
TalkShow,Thriller,War,Western
titles01/tt0012349,tt0012349,Der Vagabund und das Kind (1921),der vagabund und das kind,http://www.imdb.com/titl
e/tt0012349/,8.4,40550,3240,1921,video.movie,1,0,19,96,85,3,0,0,0,0,0,1,0,0,1,1,0,0,0,0,0,0,0,0,0,0,0,0,0,
0,0
titles01/tt0015864,tt0015864,Goldrausch (1925),goldrausch,http://www.imdb.com/title/tt0015864/,8.3,45319,5700,19
25,video.movie,2,1,35,110,122,3,0,0,1,0,0,1,0,0,0,1,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0
titles01/tt0017136,tt0017136,Metropolis (1927),metropolis,http://www.imdb.com/title/tt0017136/,8.4,81007,9180,19
27,video.movie,3,4,67,428,376,2,0,0,0,0,0,0,0,0,0,1,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,1,0,0,0,0,0,0,0,0,0
titles01/tt0017925,tt0017925,Der General (1926),der general,http://www.imdb.com/title/tt0017925/,8.3,37521,6420,
1926,video.movie,1,1,53,123,219,3,1,0,1,0,0,1,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0
titles01/tt0021749,tt0021749,Lichter der Großstadt (1931),lichter der gro stadt,http://www.imdb.com/title/tt0021
749/,8.7,70057,5220,1931,video.movie,2,0,38,187,186,3,0,0,0,0,0,0,1,0,0,1,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,1,0,0,0,0,0,0,0
```

Seems pretty standard, let's load it with Pandas!

In [1]: %xmode Minimal



```
In [1]: %xmode Minimal
import pandas as pd
df = pd.read_csv('./data/imdb.csv')
```

Exception reporting mode: Minimal

**ParserError:** Error tokenizing data. C error: Expected 44 fields in line 66, saw 46

Oh, that doesn't work. Maybe there's something wrong with the file? Let's try opening it with the Python CSV reader:

```
In [2]: import csv
with open('./data/imdb.csv', 'r', newline='') as fid:
    dialect = csv.Sniffer().sniff(fid.read())
    print("Detected delimiter = %r, quotechar = %r" % (dialect.delimiter, dialect.quotechar))
    fid.seek(0)
    reader = csv.reader(fid, dialect=dialect)
    rows = list(reader)

print("Loaded %i rows." % len(rows))
```

Detected delimiter = ' ', quotechar = '"'  
Loaded 13928 rows.

Huh, that's strange, Python thinks the space is the delimiter and loads 13928 rows, but the file should contain 14,762 rows according to the documentation. What's going on here?

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It turns out that on the 65th line of the file, there's a movie with the title `Dr. Seltsam\, oder wie ich lernte\, die Bombe zu lieben (1964)` (the German version of Dr. Strangelove). The title has commas in it, that are escaped using the `\` character! Why are CSV files so hard? 😞

### CleverCSV to the rescue!

CleverCSV detects the dialect of CSV files much more accurately than existing approaches, and it is therefore robust against these kinds of format variations. It even has a wrapper that works with DataFrames!

```
In [3]: from csv.wrappers import csv2df
df = csv2df('./data/imdb.csv')
df
```

Out [3]:

	fn	tid	title	wordsInTitle	url	imdbRating	ratingCount	duration	year	type	...	News
0	titles01/tt0012349	tt0012349	Der Vagabund und das Kind (1921)	der vagabund und das kind	http://www.imdb.com/title/tt0012349/	8.4	40550.0	3240.0	1921.0	video.movie	...	0
1	titles01/tt0015864	tt0015864	Goldrausch (1925)	goldrausch	http://www.imdb.com/title/tt0015864/	8.3	45319.0	5700.0	1925.0	video.movie	...	0
2	titles01/tt0017136	tt0017136	Metropolis (1927)	metropolis	http://www.imdb.com/title/tt0017136/	8.4	81007.0	9180.0	1927.0	video.movie	...	0
3	titles01/tt0017925	tt0017925	Der General (1926)	der general	http://www.imdb.com/title/tt0017925/	8.3	37521.0	6420.0	1926.0	video.movie	...	0
			Lichter der	lichter der gro	http://www.imdb.com							

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			Lichter der	lichter der gro	http://www.imdb.com							





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			Episode 2005)	episode	/title/tt0675644/								
14757	titles04/index.html.9992	tt0675644	"Playhouse 90" The Miracle Worker (TV Episode ...	playhouse the miracle worker tv episode	http://www.imdb.com/title/tt0675644/	7.3	8.0	5400.0	1957.0	video.episode	...	0	
14758	titles04/index.html.9994	tt0679222	"Private Screenings" Robert Mitchum and Jane R...	private screenings robert mitchum and jane rus...	http://www.imdb.com/title/tt0679222/	7.0	20.0	3600.0	1996.0	video.episode	...	0	
14759	titles04/index.html.9995	tt0680064	"Providence" All the King's Men (TV Episode 2002)	providence all the king s men tv episode	http://www.imdb.com/title/tt0680064/	NaN	NaN	3600.0	2002.0	video.episode	...	0	
14760	titles04/index.html.9997	tt0681024	"QI" Adam (TV Episode 2003)	qi adam tv episode	http://www.imdb.com/title/tt0681024/	7.6	89.0	1800.0	2003.0	video.episode	...	0	
14761 rows x 44 columns													

Hooray! 🎉

How does it work? CleverCSV searches the space of all possible dialects of a file, and computes a *data consistency measure* that quantifies how much the resulting table "looks like real data". The consistency measure combines patterns of row lengths in the parsing result and the data type of the resulting cells. This mimicks how a human would identify the dialect. If you're wondering why this problem is hard, it's because every dialect will give you *some* table, but not necessarily the correct one. More details can be found [in the paper](#).

<https://github.com/alan-turing-institute/CleverCSVDemo>  
 #PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

---

# Gertjan van den Burg

“The fun part of data science is the modelling. Being able to read in information from a csv file should not be the hardest part.

There is no AI. I am the AI.”



<https://gertjanvandenburgh.com>  
#PyDataLDN #TuringWay @kirstie\_j  
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Handy links:

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- [CleverCSV on GitHub](#)
- [CleverCSV on PyPI](#)
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alan-turing-institute / CSV\_Wrangling

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Repository for reproducibility of the CSV file project

reproducible-research reproducible-paper reproducibility reproducible-science csv-files csv csv-parsing

27 commits 1 branch 0 releases 1 contributor MIT

Search master New pull request Create new file Upload files Find file Clone or download

Commit	Message	Time
Gjorburg: Simplify makefile	Latest commit 5a8811c on 29 Nov 2018	
data	add data dir placeholder	5 months ago
design	Fix indent	5 months ago
results/test	Replace absolute path by relative path	5 months ago
scripts	Make normal form output the same as the other detectors	5 months ago
.gitmodules	initial commit	5 months ago
LICENSE	Add the license	5 months ago
Makefile	Simplify makefile	5 months ago
README.md	Simplify makefile	5 months ago
requirements.txt	Add missing package	5 months ago
urls_github.json	Update GitHub data urls to direct links	5 months ago
urls_sandbox.json	initial commit	5 months ago

README.md

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This is the repository for reproducing the experiments in the paper:

[Wrangling Messy CSV files by Detecting Row and Type Patterns](#)

by G.J.J. van den Burg, A. Nazabal and C. Sutton.

– [https://github.com/alan-turing-institute/CSV\\_Wrangling](https://github.com/alan-turing-institute/CSV_Wrangling)

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#PyDataLDN #TuringWay @kirstie\_j  
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GitBorg Simply makefile Latest commit 5a8b11c on 29 Nov 2018

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#PyDataLDN #TuringWay @kirstie\_j  
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# The Turing Way

1. Introduction
2. Reproducibility
3. Open Research
4. Version Control
5. Reproducible Environments
6. Testing
7. Reviewing
8. Continuous Integration
9. Research Data Management
10. Reproducible Research with Make

## What is Make

Make is a build automation tool. It uses a configuration file called a Makefile that contains the *rules* for what to build. Make builds *targets* using *recipes*. Targets can optionally have *prerequisites*. Prerequisites can be files on your computer or other targets. Make determines what to build based on the dependency tree of the targets and prerequisites (technically, this is a [directed acyclic graph](#)). It uses the *modification time* of prerequisites to update targets only when needed.

## Why use Make for Reproducible Research?

There are several reasons why Make is a good tool to use for reproducible research:

1. Make is available on many platforms
2. Make is easy to learn
3. Makefiles are text files, which makes them easy share and keep in version control.
4. Many people are already familiar with Make
5. Using Make doesn't exclude using other tools such as Travis, Docker, etc.

## Learn Make by Example

One of the things that might scare people off from using Make is that existing Makefiles can seem daunting and it may seem difficult to tailor to your own needs. In this hands-on tutorial we will

<https://the-turing-way.netlify.com/make/make.html>

#PyDataLDN #TuringWay @kirstie\_j

<https://doi.org/10.5281/zenodo.3632909>



# Case studies

---

- Show that it can be done
- Provide templates and starting points
- Inspire



---

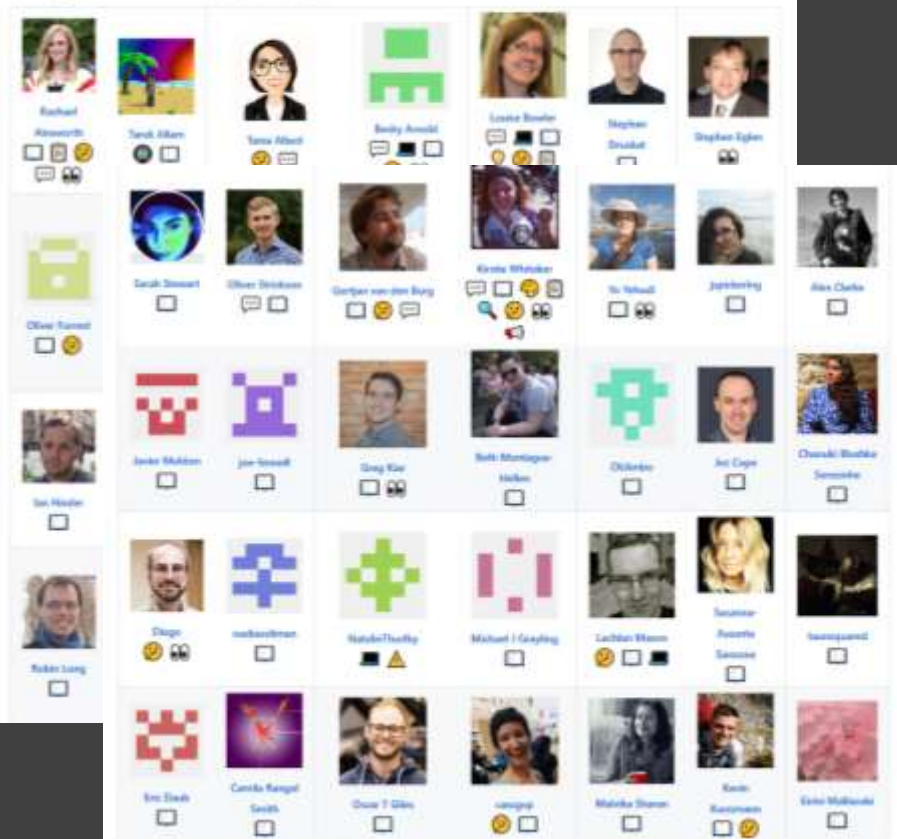
# A global collaboration



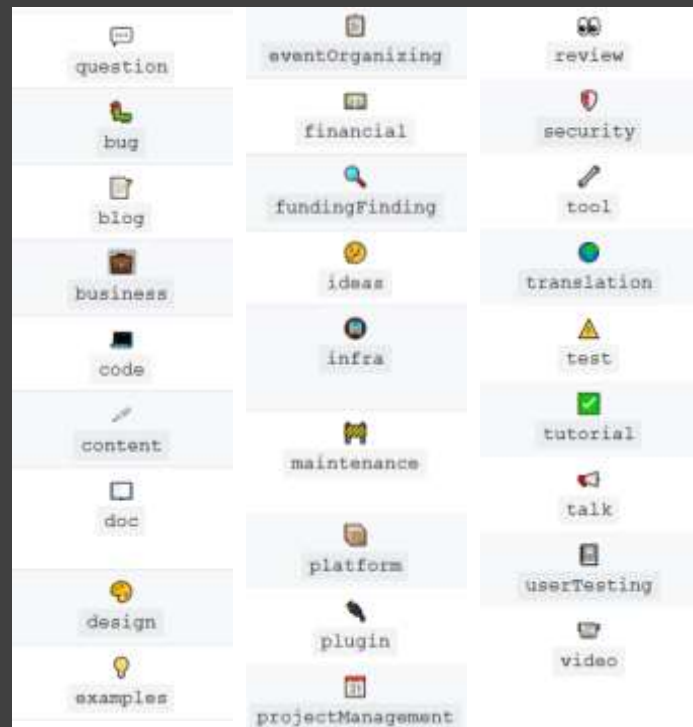
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<https://doi.org/10.5281/zenodo.3632909>

## Contributors

Thanks goes to these wonderful people (emoji key):



This project follows the [all-contributors](https://github.com/alan-turing-institute/the-turing-way#contributors) specification. Contributions of any kind welcome!



<https://github.com/alan-turing-institute/the-turing-way>

#PyDataLDN #TuringWay @kirstie\_j

<https://doi.org/10.5281/zenodo.3632909>

<https://github.com/alan-turing-institute/the-turing-way#contributors>

<https://allcontributors.org/docs/en/emoji-key>

---

# Rachael Ainsworth

“Personas and pathways exercises let me reflect on what people are finding difficult about contributing to The Turing Way. The project can only reach its potential if it is easy for a diverse constellation of contributions.”



<https://ainsworth.github.io>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

alan-turing-institute / the-turing-way

Code Issues 94 Pull requests 5 Actions Projects 2 Wiki Insights

## [WIP] Add personas & pathways #421

Open rainworth wants to merge 5 commits into alan-turing-institute:personas from rainworth:ka-personas

Conversation Commits Checks Files changed

rainworth commented 8 days ago • edited • Collaborator

### Summary

This document describes the personas and pathways for contributors and users to guide the development of the Turing Way following Mozilla Open Leadership training. Specifically, it will help us identify any barriers to contributing in the Contributing Guidelines and README. It is based on the personas.md document in the Open Leadership Framework repository.

Related to #403

### List of changes proposed in this PR (pull-request)

To do:

- ☒ Introduction to personas and pathways
- ☒ Contributor personas with limited/no Git/GitHub experience
- ☒ Contributor personas with Git/GitHub experience and book topic expertise
- ☐ User persona: early career researcher
- ☐ User persona: supervisor / PI
- ☐ User persona: funder / publisher / admin
- ☒ Use gender-neutral names/pronouns

### What should a reviewer concentrate their feedback on?

- ☐ Do these personas make sense for the project?
- ☐ Are there additional personas/pathways we should add?
- ☐ If you do not relate to any of the personas described and are struggling to figure out how to get involved or use this resource, please leave a comment on issue #403 letting us know what the barriers are!
- ☐ Check for grammar, links.

- **Sam**, who has no GitHub experience
- **Alex**, who has a lot of GitHub experience
- **Amal**, who knows they want to contribute, and does
- **Noor**, who doesn't know they want to contribute, but does

<https://github.com/alan-turing-institute/the-turing-way/pull/421>  
#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>







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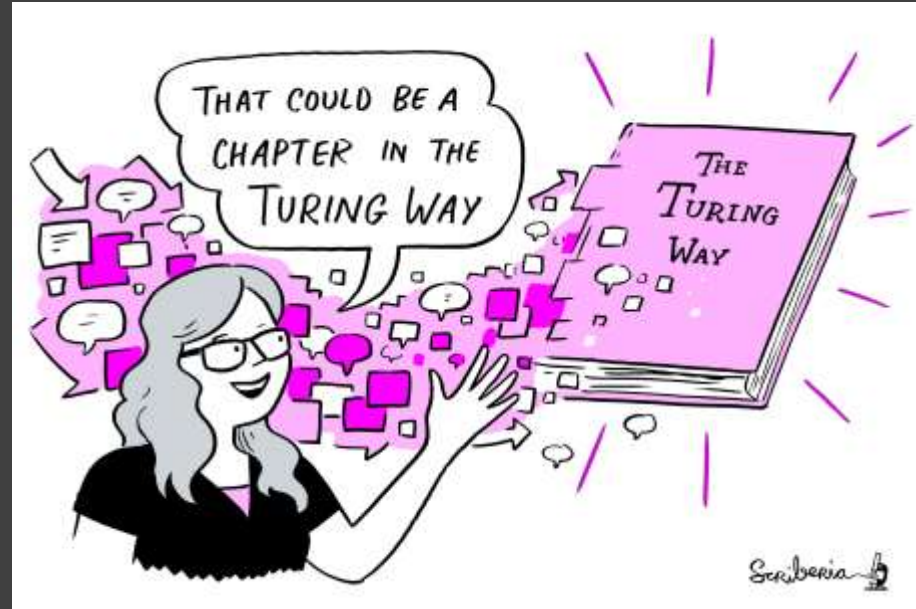
# The future



#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

# Funding extension

- Expand scope to all data science practices
  - Ethics, model selection, project management, collaborative working
- Full time community manager, contributions from Turing & beyond



[https://github.com/  
alan-turing-institute/the-turing-way/  
blob/master/project\\_management/  
tps-funding-application-20190429.md](https://github.com/alan-turing-institute/the-turing-way/blob/master/project_management/tps-funding-application-20190429.md)

#PyDataLDN #TuringWay @kirstie\_j  
<https://doi.org/10.5281/zenodo.3632909>

# Metrics for success

- 20 new chapters
- 100 authors
- 200 contributors
- 1000 mailing list subscribers
- 50 first pull requests
- 20 new contributors to other open source projects

