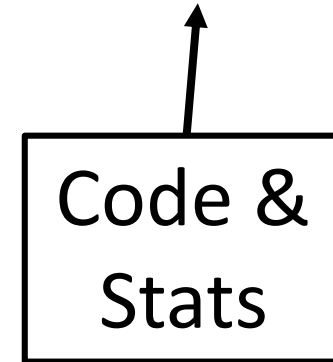
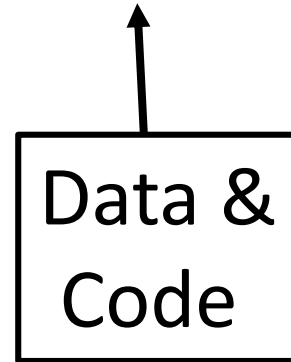
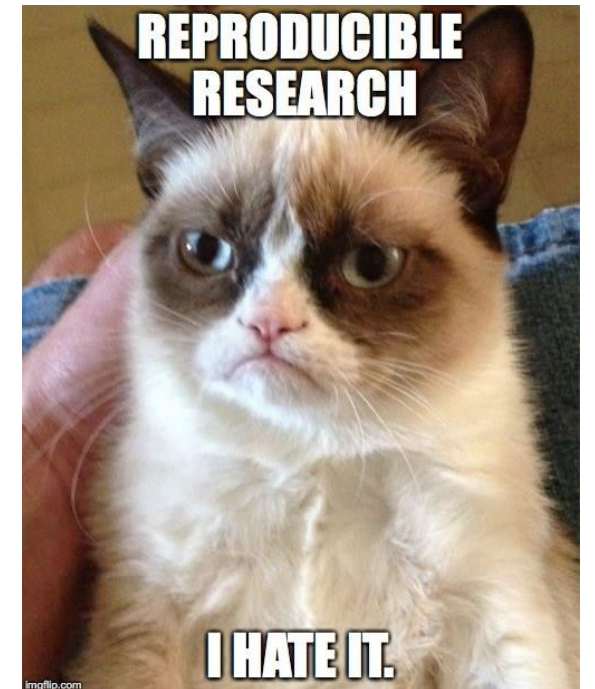


# Reproducible Research

Reproducible = Accessible + Readable

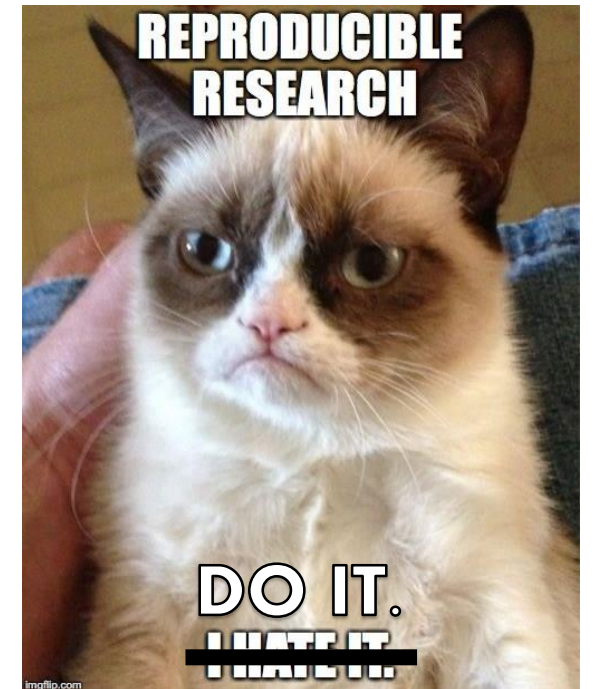


# Why make your research reproducible?



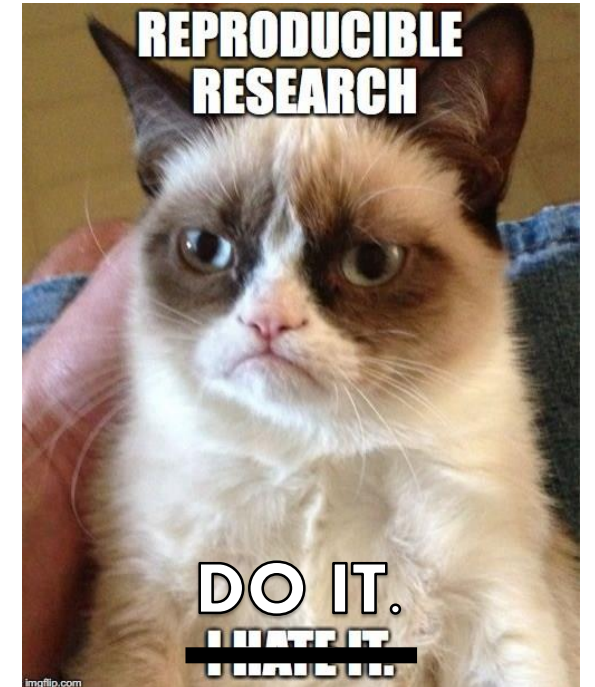
# Why make your research reproducible?

- Remember what you did last week, month, year...



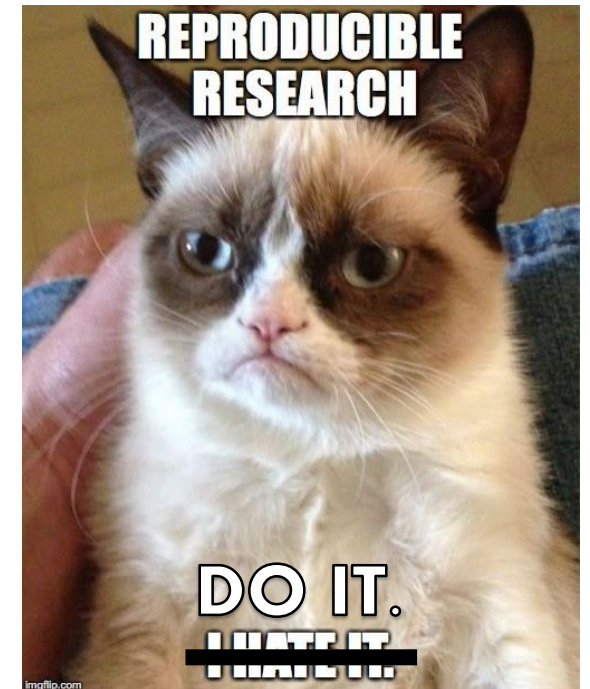
# Why make your research reproducible?

- Remember what you did last week, month, year...
- Share progress with advisor



# Why make your research reproducible?

- Remember what you did last week, month, year...
- Share progress with advisor
- Scientific progress – no need to reinvent the wheel
  - Record statistical decisions, analysis pipelines
  - Share progress and products with the lab



# Why make your research reproducible?

- Build collaborations and increase the impact of your science
  - Shared code – examples: Ross Cunning, Hollie Putnam, Murat Eren



[jrcunning](#)

Ross

Cunning

Follow

Coral reef conservation research @SheddAquarium. Bioinformatics, stats, modeling, data viz, open science, Rstats. Formerly @CoralReefFuturesLab, @GatesCoralLab

📍 Chicago, IL



[hputnam](#)

Hollie

Putnam

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📍 Rhode Island    ✉ [hputnam@uri.edu](mailto:hputnam@uri.edu)



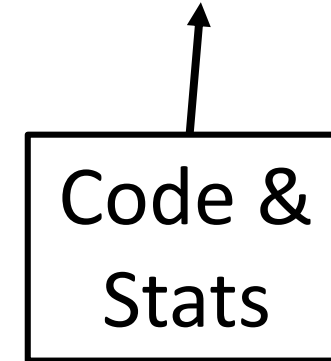
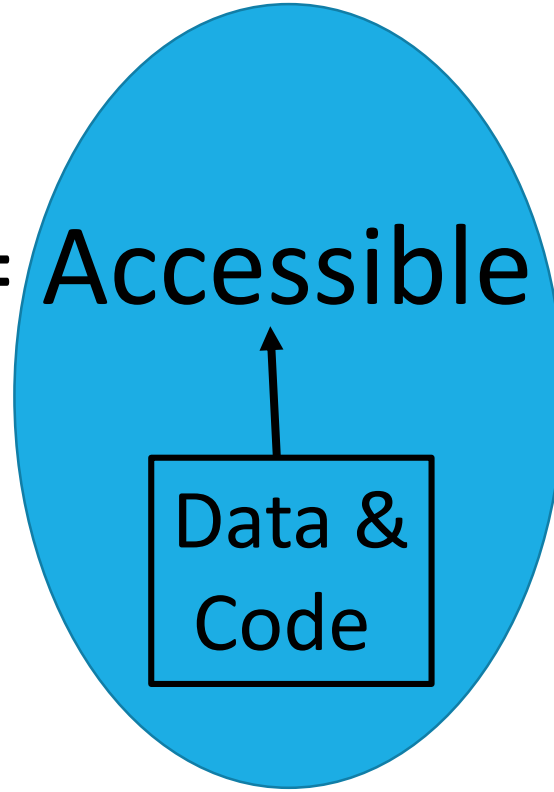
Meren Lab

📍 University of Chicago

🌐 <http://merenlab.org>

✉ [meren@uchicago.edu](mailto:meren@uchicago.edu)

Reproducible = Accessible + Readable





# Accessibility: Tools and Strategies

1. Consistent organization strategies













# Accessibility: Tools and Strategies

1. Consistent organization strategies
  - Can you find that one figure?

# Accessibility: Tools and Strategies

## 1. Consistent organization strategies

- Can you find that one figure?
- File structure and naming

This PC > Documents > Data_Analysis > KI_Platy		
<input type="checkbox"/> Name	Date modified	Type
 .Rhistory	9/26/2018 7:18 PM	RHISTORY File
 KI_Platy.Rproj	9/25/2018 4:09 PM	R Project
 .gitignore	2/15/2018 12:11 A	Text Document
 KI_Platy_Bioinf_Workflow.ipynb	8/15/2017 1:50 PM	IPYNB File
 README.md	7/31/2017 2:48 PM	MD File
 data	9/26/2018 8:36 PM	File folder
 .git	9/25/2018 4:09 PM	File folder
 figures	6/2/2018 4:01 PM	File folder
 ms	5/18/2018 1:50 PM	File folder
 etc	4/20/2018 10:30 A	File folder
 analyses	1/22/2018 1:25 PM	File folder
 .Rproj.user	11/17/2017 8:41 A	File folder

# Accessibility: Tools and Strategies

## 1. Consistent organization strategies

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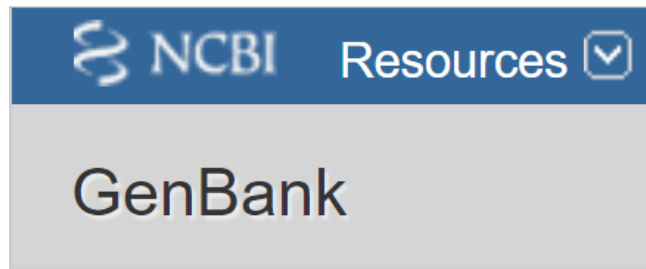
# Accessibility: Tools and Strategies

## 1. Consistent organization strategies

- Can you find that one figure?
- File structure and naming

## 2. Data accessibility

- Extremely specific README files
- Preserve raw data set, process data and make changes in R
- Make data available online: GitHub, Gen Bank, publish online, etc.



# Accessibility: Tools and Strategies

## 3. R Projects

- Pick up where you left off

### Using Projects



**RStudio Support**

November 06, 2018 15:36

Follow

### Using Projects

RStudio projects make it straightforward to divide your work into multiple contexts, each with their own working directory, workspace, history, and source documents.

#### Creating Projects

RStudio projects are associated with R working directories. You can create an RStudio project:

- In a brand new directory
- In an existing directory where you already have R code and data
- By cloning a version control (Git or Subversion) repository

<https://support.rstudio.com/hc/en-us/articles/200526207-Using-Projects>

# Accessibility: Tools and Strategies

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- Pick up where you left off
- Avoid `setwd()` in every script

## Using Projects



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# Accessibility: Tools and Strategies

## 3. R Projects

- Pick up where you left off
- Avoid `setwd()` in every script
- Easier for collaboration
- Start at beginning of project, but if you haven't, it's not too late!

## Using Projects



RStudio Support

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# Accessibility: Tools and Strategies

4. GitHub – log steps as you move forward



# Accessibility: Tools and Strategies

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  - Yes, it's worth it



# Accessibility: Tools and Strategies

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  - Yes, it's worth it
  - No, people won't judge your messy code



# Accessibility: Tools and Strategies

4. GitHub – log steps as you move forward
  - Yes, it's worth it
  - No, people won't judge your messy code
  - Good, because it forces you to track progress and steps



# GitHub - Overview

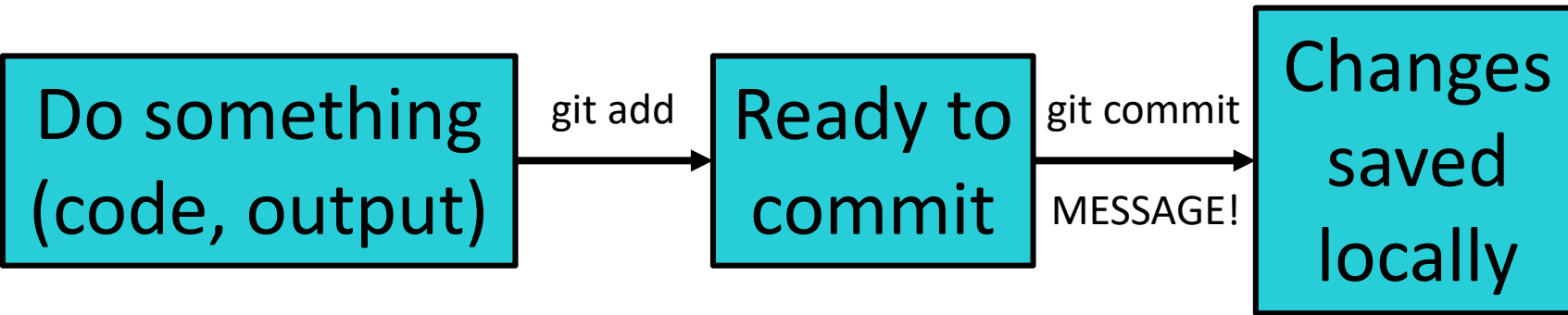
Do something  
(code, output)

git add

Ready to  
commit

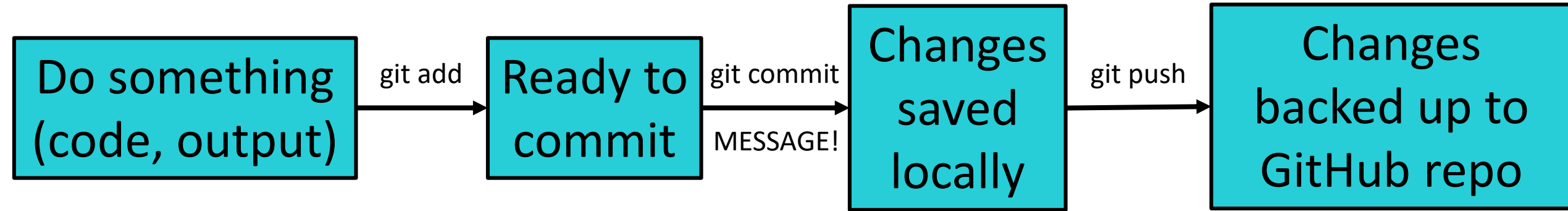


# GitHub - Overview

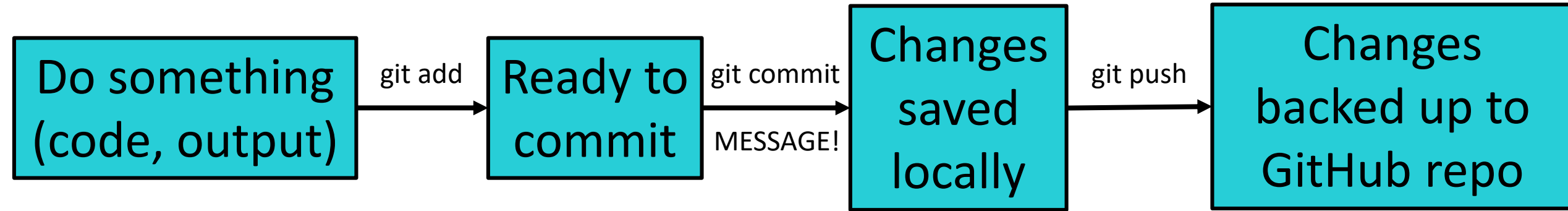




# GitHub - Overview



# GitHub - Overview



## Benefits:

- Track what you've done
- Online backup in case of computer failure
- Preps code to share with colleagues

# GitHub

- My strategy – separate script for each task
  - If complicated, build a map!



# GitHub

- My strategy – separate script for each task
  - If complicated, build a map!
- Commit all the time



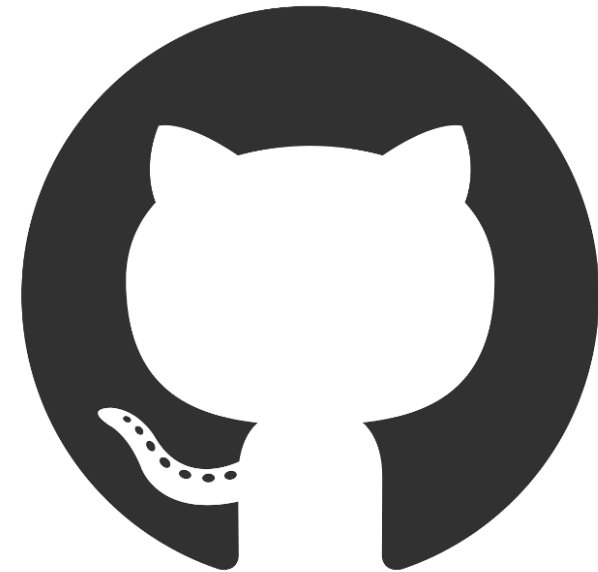
# GitHub

- My strategy – separate script for each task
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- Commit all the time
- Make commit messages specific



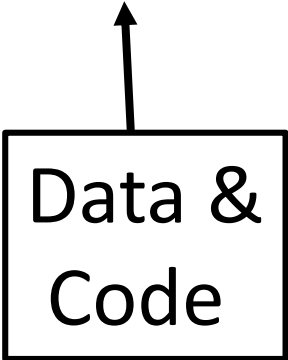
# GitHub

- My strategy – separate script for each task
  - If complicated, build a map!
- Commit all the time
- Make commit messages specific
- What about when code gets messy?



Reproducible = Accessible + Readable

Data &  
Code



Code &  
Stats



# Readability: Tools and Strategies

- Commenting throughout code



# Readability: Tools and Strategies

- Commenting throughout code
- Divide code into chunks or sections → R Markdown!

# R Markdown

- Great for preliminary analyses & figures, as well as statistical analyses

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Now for a few examples...

# A few resources...

- R Markdown Basics [https://rmarkdown.rstudio.com/authoring\\_basics.html](https://rmarkdown.rstudio.com/authoring_basics.html)
- Baum Lab – Getting Started – R Markdown Tips <https://github.com/baumlabs/Getting-started/blob/master/ms-rmarkdown-tips.md>
- Reproducible Research using R Markdown <https://www.r-bloggers.com/reproducible-research-write-your-clinical-chemistry-paper-using-r-markdown/>
- Using R Projects <https://support.rstudio.com/hc/en-us/articles/200526207-Using-Projects>
- Pimp my RMD: a few tips for R Markdown <https://holtzy.github.io/Pimp-my-rmd/>
- Example Repo with RMarkdown data analysis file [https://github.com/hputnam/Moorea\\_Sym](https://github.com/hputnam/Moorea_Sym)
- New Data Visualization Book <http://serialmentor.com/dataviz/>
- Organizing Multiple Plots on a Page [https://cran.r-project.org/web/packages/egg/vignettes/Ecosystem.html?utm\\_content=buffercef33&utm\\_medium=social&utm\\_source=twitter.com&utm\\_campaign=buffer](https://cran.r-project.org/web/packages/egg/vignettes/Ecosystem.html?utm_content=buffercef33&utm_medium=social&utm_source=twitter.com&utm_campaign=buffer)