



Data Project

Build Your Own Hate speech detection Engine

January 2021



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- **Encyclopedia of the American Constitution:** “Hate speech is speech that attacks a person or group on the basis of attributes such as race, religion, ethnic origin, national origin, sex, disability, sexual orientation, or gender identity.”
- **Facebook:** “We define hate speech as a direct attack on people based on what we call protected characteristics—race, ethnicity, national origin, religious affiliation, sexual orientation, caste, sex, gender, gender identity, and serious disease or disability.
- **Twitter:** “Hateful conduct: You may not promote violence against or directly attack or threaten other people on the basis of race, ethnicity, national origin, sexual orientation, gender, gender identity, religious affiliation, age, disability, or serious disease.”

- Hate speech is to incite violence or hate
- Hate speech is to attack or diminish
- Hate speech has specific targets
- Whether humor can be considered hate speech

- Hate crimes are nothing new in society;
- Social media have begun playing a major role in hate crimes;
- Suspects in several recent hate-related terror attacks had an extensive social media history of hate-related posts;
- Social media could contribute to their radicalization;
- Many online forums such as Facebook, YouTube, and Twitter consider hate speech harmful,

- You are part of the TWITTER team of data scientists.
- This company offers microblogging and social networking service on which users post and interact with messages known as "tweets".
- She would like to develop a new application able to detect hate speech and offensive messages.

- For a given tweet/retweet, your application should be able to classify the comment as a hate message, an offensive message or neither hate speech nor offensive;
- “Rshiny” should be used to convert your R codes to an Application;
- Git and Github should be used as collaborative working tools,

- The dataset1 is stored as a CSV. Each data file contains 5 columns:
 - **count** = number of experts who coded each tweet (min is 3, sometimes more experts coded a tweet when judgments were determined to be unreliable).
 - **hate_speech** = number of experts who judged the tweet to be hate speech.
 - **offensive_language** = number of experts who judged the tweet to be offensive.
 - **neither** = number of experts who judged the tweet to be neither offensive nor non-offensive.
 - **class** = class label for majority of experts: 0 - hate speech 1 - offensive language 2 - neither

- The dataset2 contain a non-exhaustive list of Abuse words
 - **404 abuse terms** used in:
 - "Twits, Twats and Twaddle: Trends in Online Abuse towards UK Politicians", ICWSM 2018,
 - "Online abuse of uk mps in 2015 and 2017: Perpetrators, targets, and topics", extended version on arXiv, 2018.
 - **388 abuse terms** used in:
 - "Online Abuse of UK MPs from 2015 to 2019: Working Paper", arXiv working paper.

- The dataset3 contain a list of 1528 annotated comments from Fox News website.
 - 435 of them are labeled as hateful;
 - 1093 of them are labeled as non-hateful.

- The dataset4 contain a list of abusive microposts that were considered to be explicitly abusive
 - The first line of each micropost represents the class label which is either "abusive" or "notAbusive"

- **No restriction on using other datasets !!!!!**

- Text mining ?
- Logistic regression ?
- Naïve Bayes ?
- Decision trees ?
- Other Machine Learning Technics ?

- **Some Related papers:**
 - **Automated Hate Speech Detection and the Problem of Offensive Language,**
Thomas Davidson et al. (2017);
 - **Hate Speech Detection: A Solved Problem? The Challenging Case of Long**
Tail on Twitter, Ziqi Zhang et al. (2018);
 - **Hate speech detection: Challenges and solutions, Sean MacAvaney et al.**
(2019)

- **Evaluation criteria**

- Understanding of business context (identification of key points, understanding of sector) Mastery & Pertinence of statistical analysis (descriptive, modeling);
- Link between data / analysis / business recommendations (logical flow, pertinence, completeness);
- Business concepts (thoroughness, pertinence);
- Thoroughness and quality of business recommendations (pertinence, relevance, professionalism, originality);
- Understanding of big data (mastery of big data terms, confidence when using big data concepts);
- Visuals (professionalism, slides support well the main arguments of the presentation, appropriate content);
- Delivery (clear and logical organization, effective introduction and conclusion, creativity, transition between speakers, oral communication skills, eye contact);
- Q&A session (ability to answer questions);
- Report: Quality of data analysis,

Evaluation criteria: Groups of 04 students

- **Very important:**
 - Try to use materials you learned during all the Program
 - We want to be impressed !!!
 - Presentation during the last session:
 - 20 minutes per groups;
 - Presentation in front of jury members.

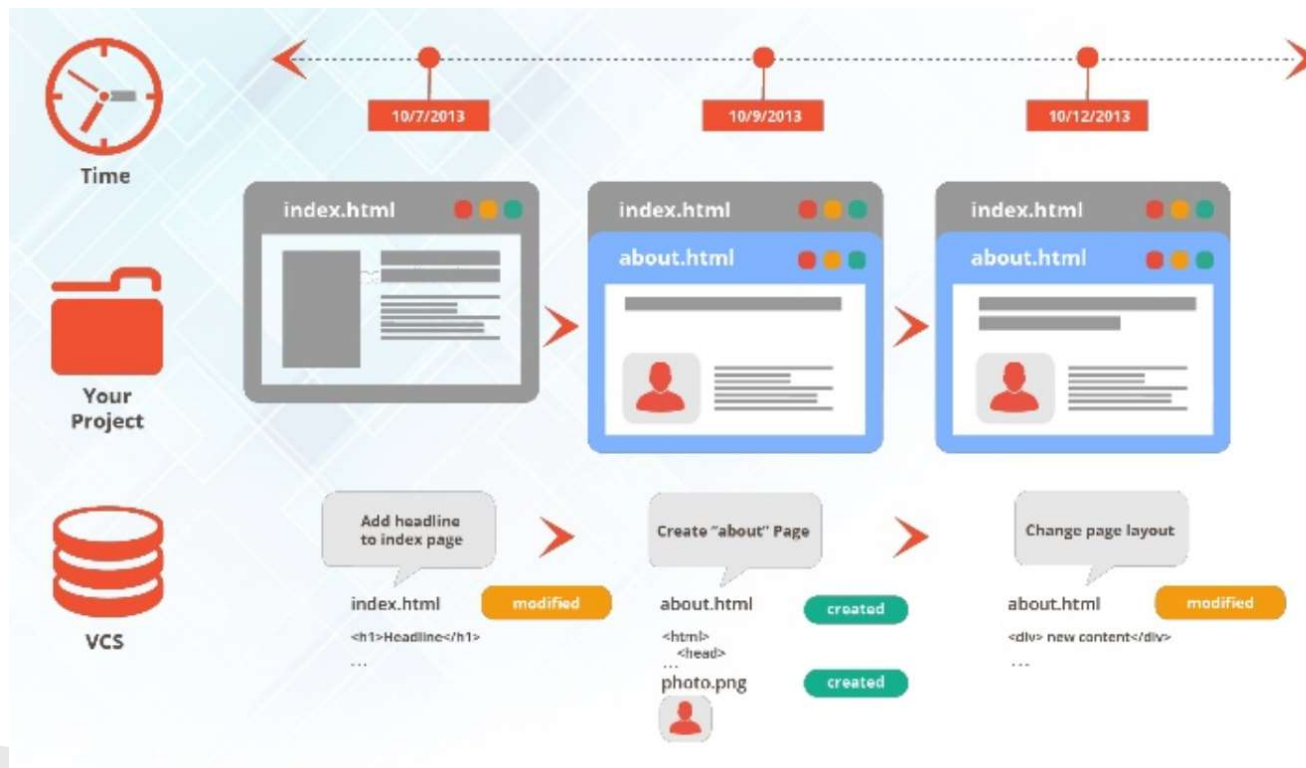
- A collaborative tool to work together on projects;
- A code hosting platform for version control and collaboration;
- Basic services are free of charge;
- More advanced professional and enterprise services are commercial;
- Free GitHub accounts are commonly used to host open-source projects;

- Free plan: unlimited collaborators, private repositories restricted to 2,000 minutes of GitHub Actions per month;
- 40 million users and more than 190 million repositories;
- The largest host of source code in the world;
- Since October 26, 2018: Acquired by Microsoft.

- **Version control**
 - **The management system that manages the changes that you made in the project: addind new files, modifying older files, etc.**
 - **Every time you make a change on your project a different version is created and saved (called a snapshot);**
 - **All the versions are kept,**

Get started with Github

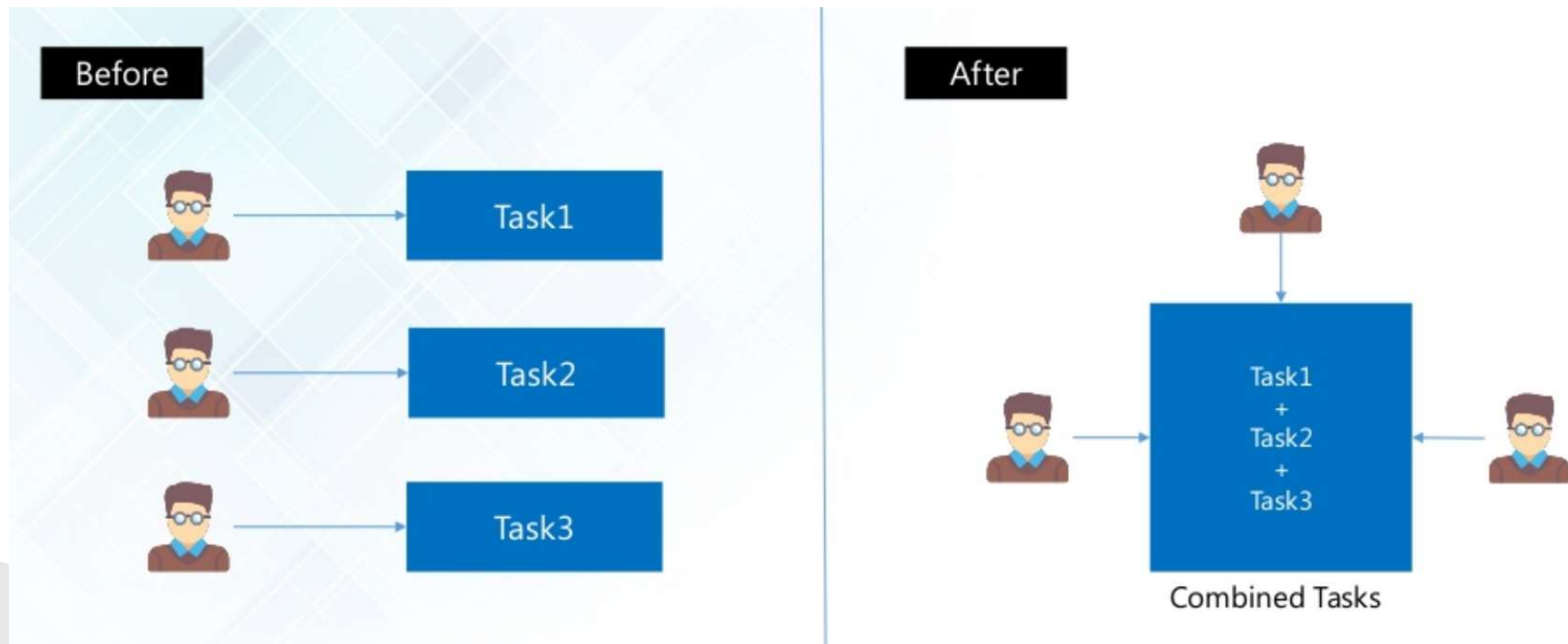
- Version control



- Version control is the management of changes to documents, computer programs, large web sites, and other collections of information.
- These changes are usually termed as "versions".

Get started with Github

- **Why a Version control ?**
 - You are always notified to changes on files;
 - Avoid change conflicts;
 - Facilitates collaboration



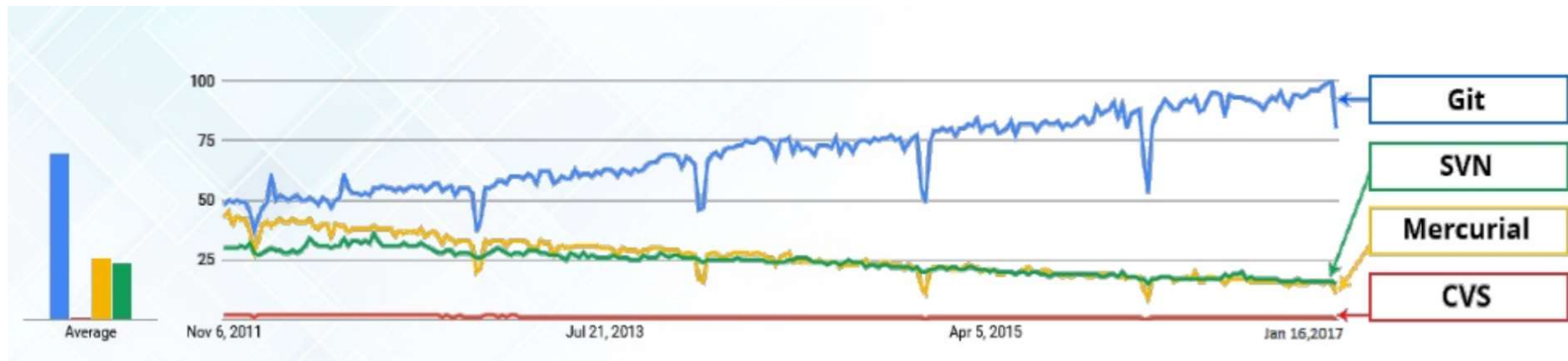
Get started with Github

- Version control System Tools



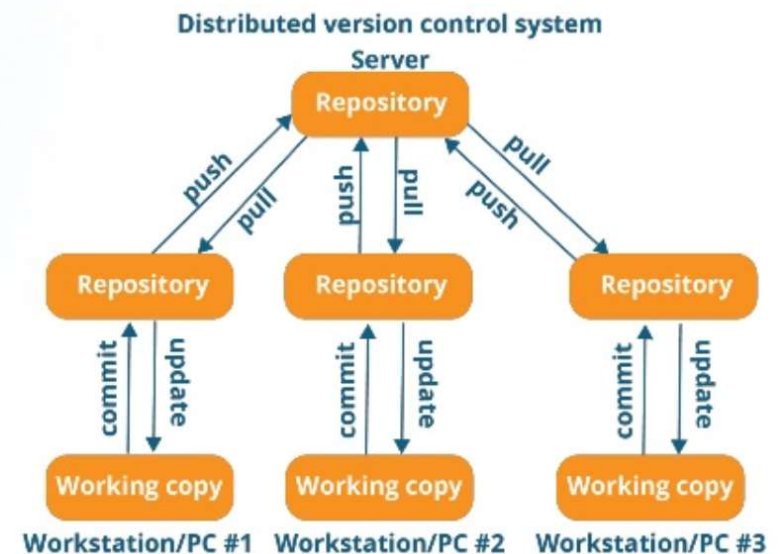
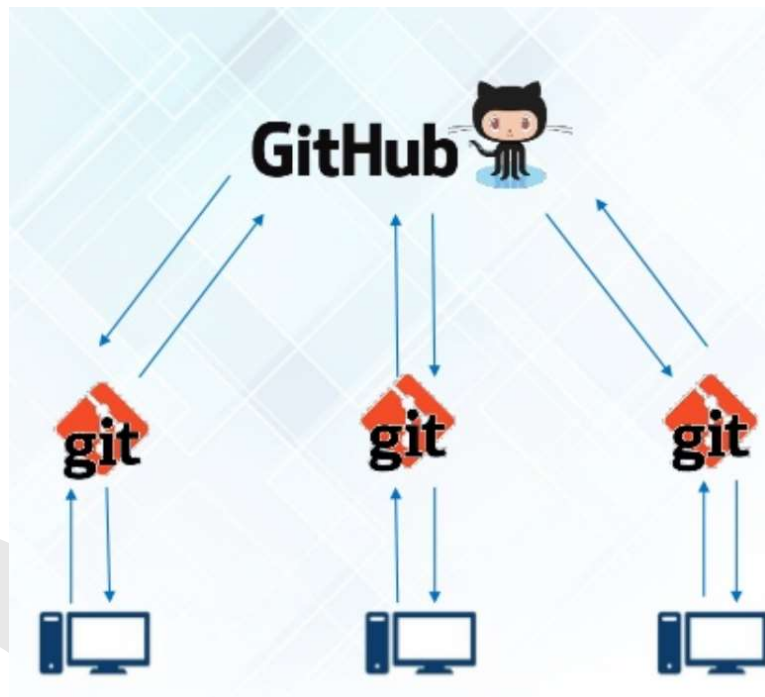
Get started with Github

- Version control System Tools



Get started with Github

- **Git and Github**
 - **Git**: management version control tool; help to create local repository, pull data from the central server and push local data to the server;
 - **Github**: central repository; code hosting platform for version control collaboration.



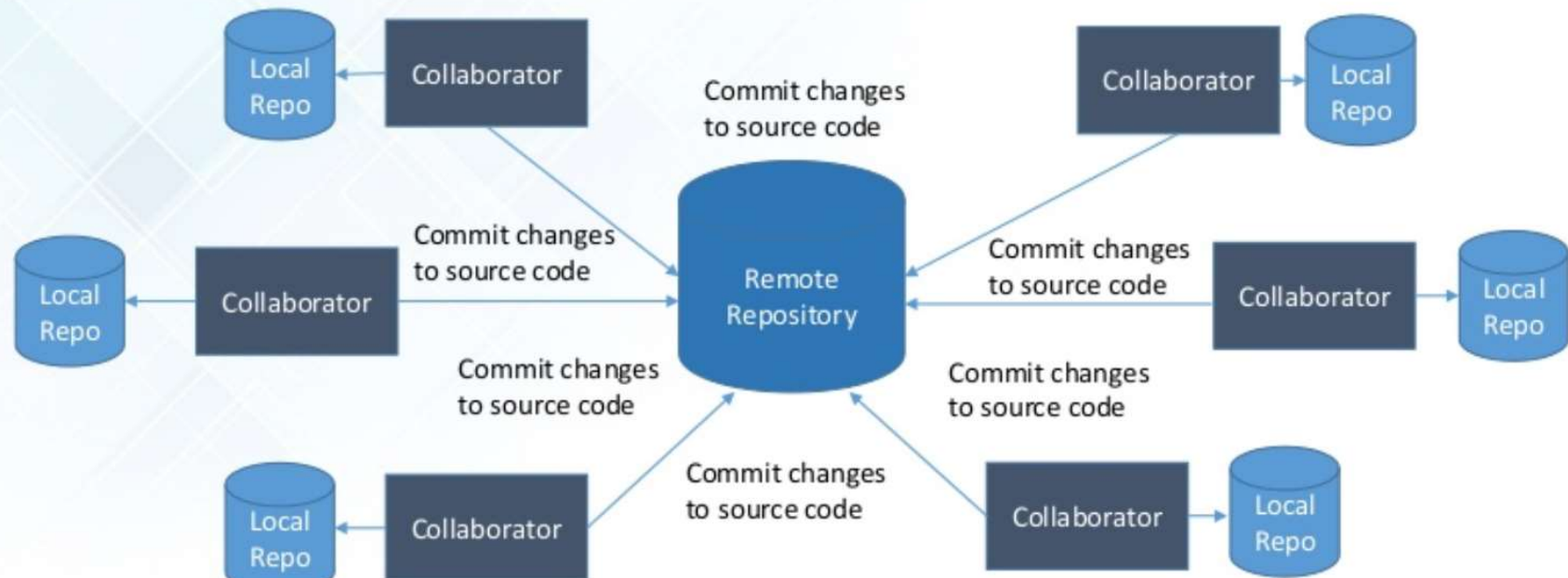
Get started with Github

- Overview of Git

- A **repository** is a directory or a storage space where your project can live; can be local on your computer or a storage space on Github; It keep every thing related to your project;

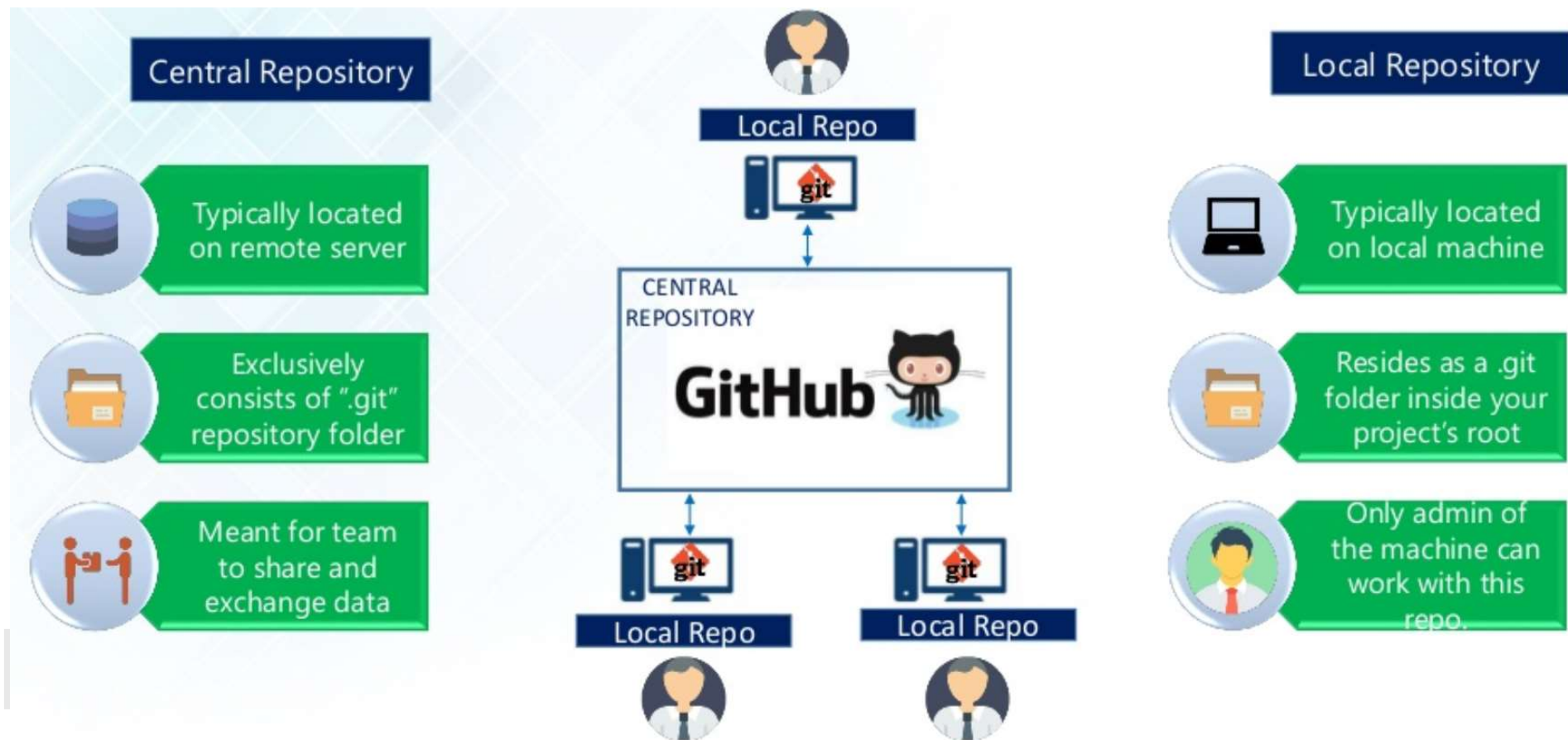


Git is a Distributed Version Control tool that supports distributed non-linear workflows by providing data assurance for developing quality software.



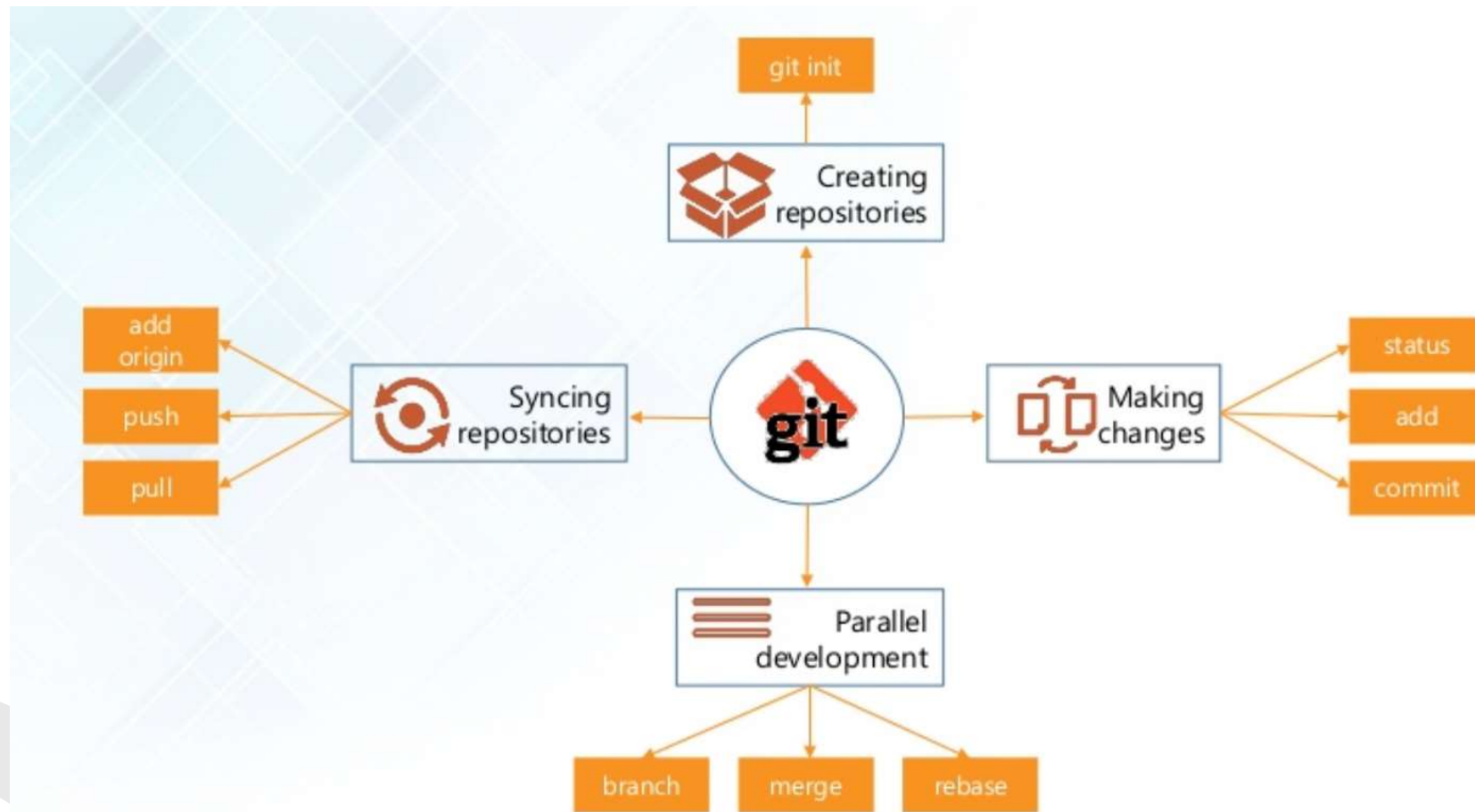
Get started with Github

- Central and local repository



Get started with Github

- Git Operations and Commands



Get started with Github

- Creating Repositories



The screenshot shows the GitHub homepage with the GitHub logo and Octocat mascot. The main heading is "Create your Central Repository on GitHub". Below this, the Git logo is displayed. Two options are presented: "git init" and "git clone". The "git init" option is accompanied by the text "Install Git on your local machine and use 'git init' to create your local repository." The "git clone" option is accompanied by the text "Download or clone your repository from GitHub." The word "OR" is placed between the two options.

GitHub 

Create your Central Repository on GitHub

 **git**

`git init`

Install Git on your local machine and use "git init" to create your local repository.

OR

`git clone`

Download or clone your repository from GitHub.

- **Creating a central Repository on Github**
 - Create an account on <https://github.com/>
 - Create a new repository
 - In the upper right corner, next to your avatar or identicon, click and then select New repository.
 - Name your repository.
 - Write a short description.
 - Select Initialize this repository with a README.

Get started with Github

- Creating a central Repository on Github

The screenshot shows the GitHub 'Create repository' interface. At the top, there's a 'PUBLIC' label and a 'Repository name' field containing 'hello-world' with a green checkmark. Below this is a hint: 'Great repository names are short and memorable. Need inspiration? How about **petulant-shame**.' The 'Description (optional)' field contains 'Just another repository'. Under the 'Visibility' section, the 'Public' radio button is selected, with the text 'Anyone can see this repository. You choose who can commit.' The 'Private' option is unselected, with the text 'You choose who can see and commit to this repository.' The 'Initialize this repository with a README' checkbox is checked, with the text 'This will allow you to `git clone` the repository immediately. Skip this step if you have already run `git init` locally.' Below this are two dropdown menus: 'Add .gitignore: None' and 'Add a license: None'. At the bottom is a green 'Create repository' button.

Owner: hubot / Repository name: hello-world ✓

Great repository names are short and memorable. Need inspiration? How about **petulant-shame**.

Description (optional): Just another repository

☒ **Public**
Anyone can see this repository. You choose who can commit.

☐ **Private**
You choose who can see and commit to this repository.

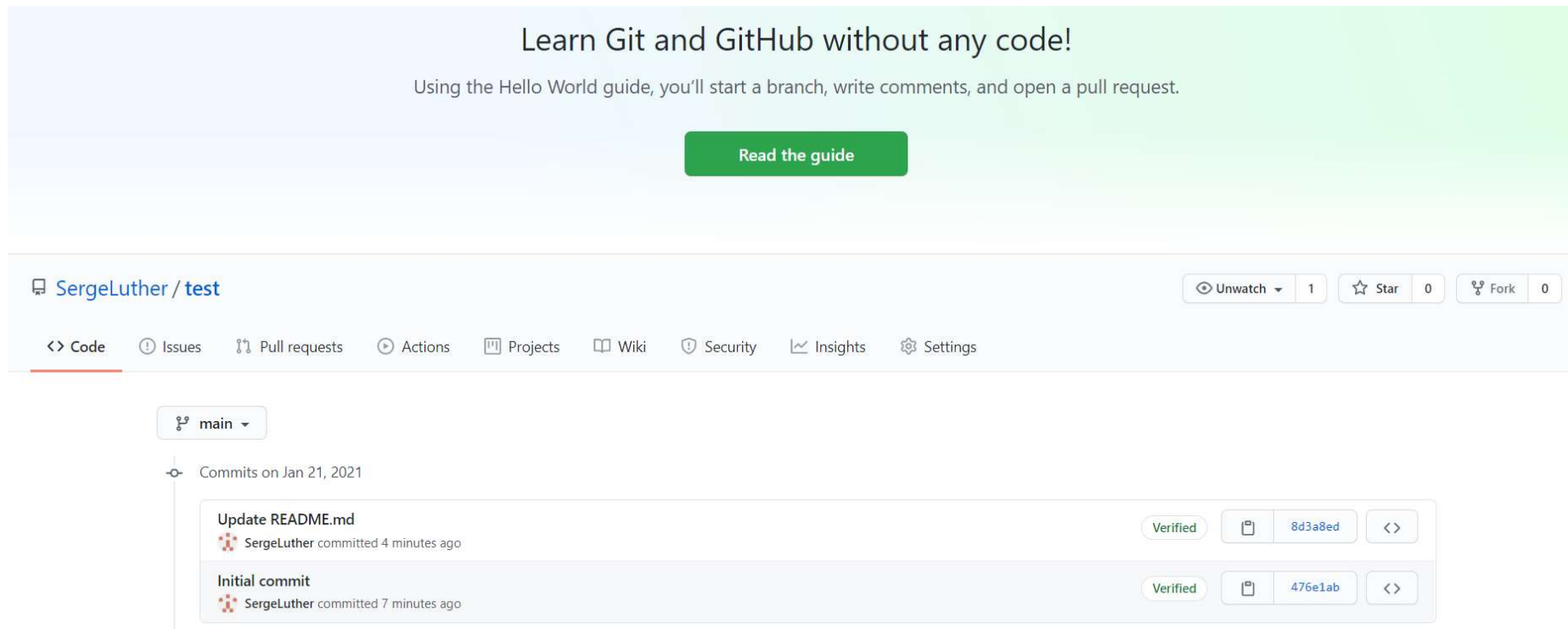
☒ **Initialize this repository with a README**
This will allow you to `git clone` the repository immediately. Skip this step if you have already run `git init` locally.

Add .gitignore: None | Add a license: None ⓘ

Create repository

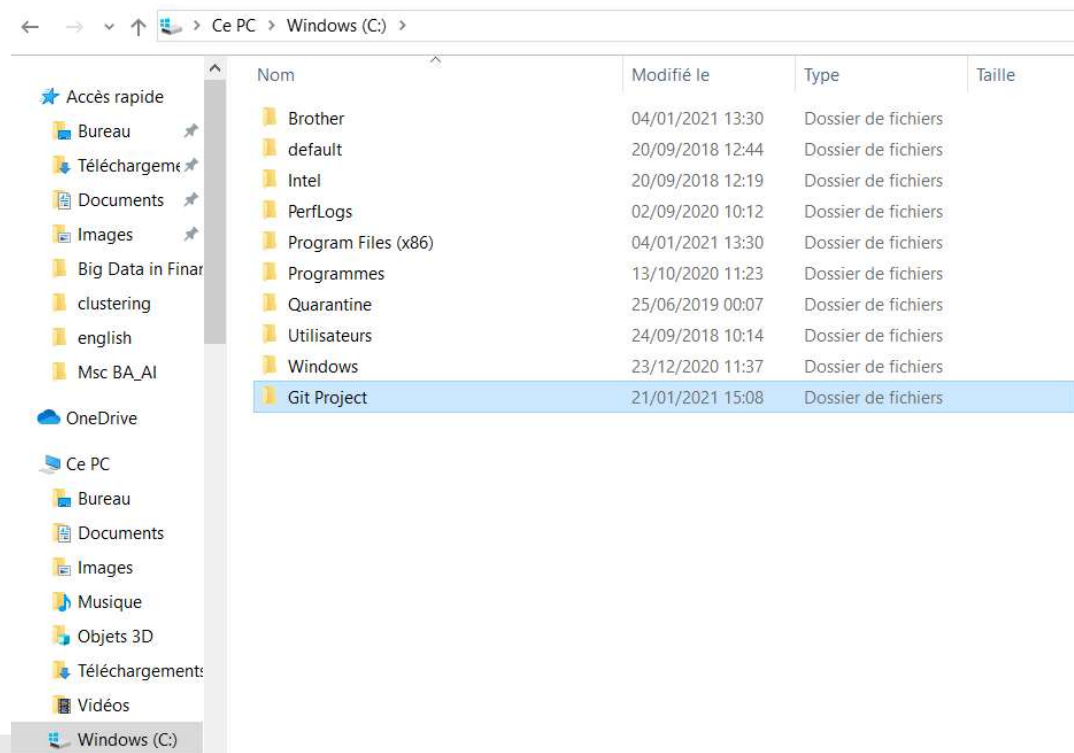
Get started with Github

- Creating a central Repository on Github



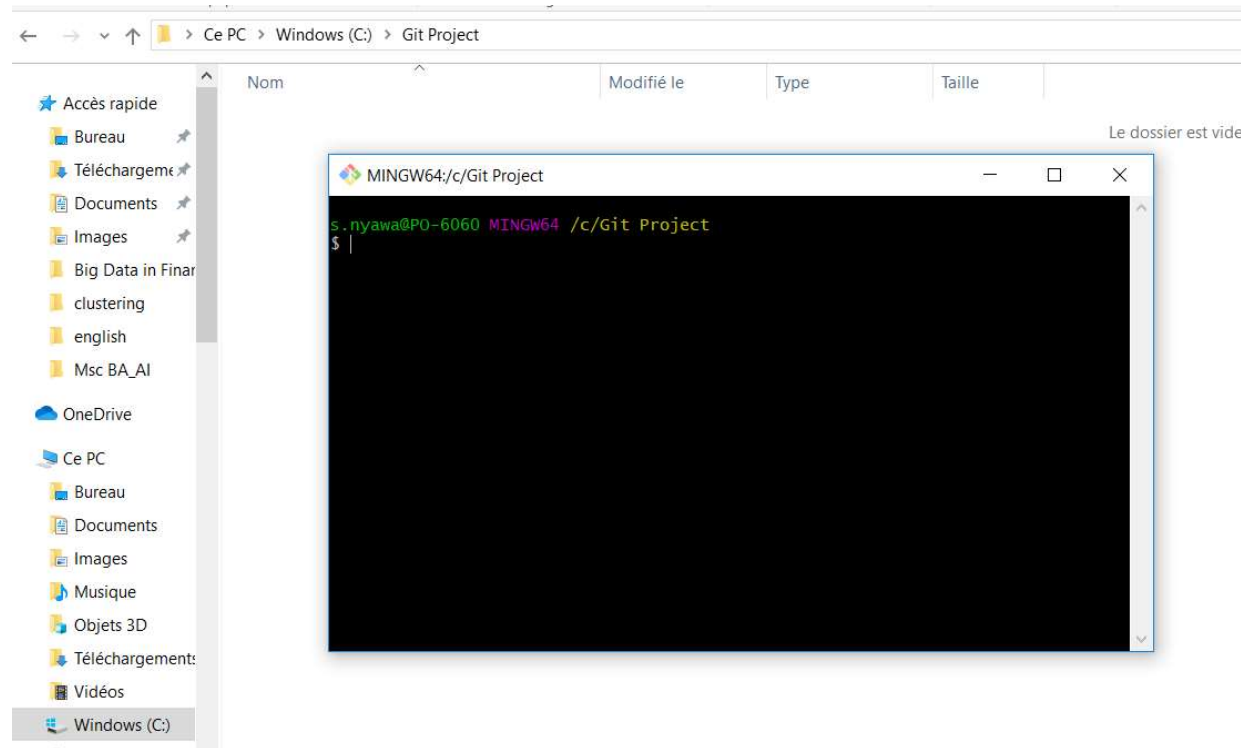
Get started with Github

- **Creating a local Repository on my local machine**
 - **Install Git on your computer**
 - For window: <https://git-scm.com/download/win>
 - For Mac: <https://git-scm.com/download/mac>
 - **Create a project file in your “Local Disk (C)”**



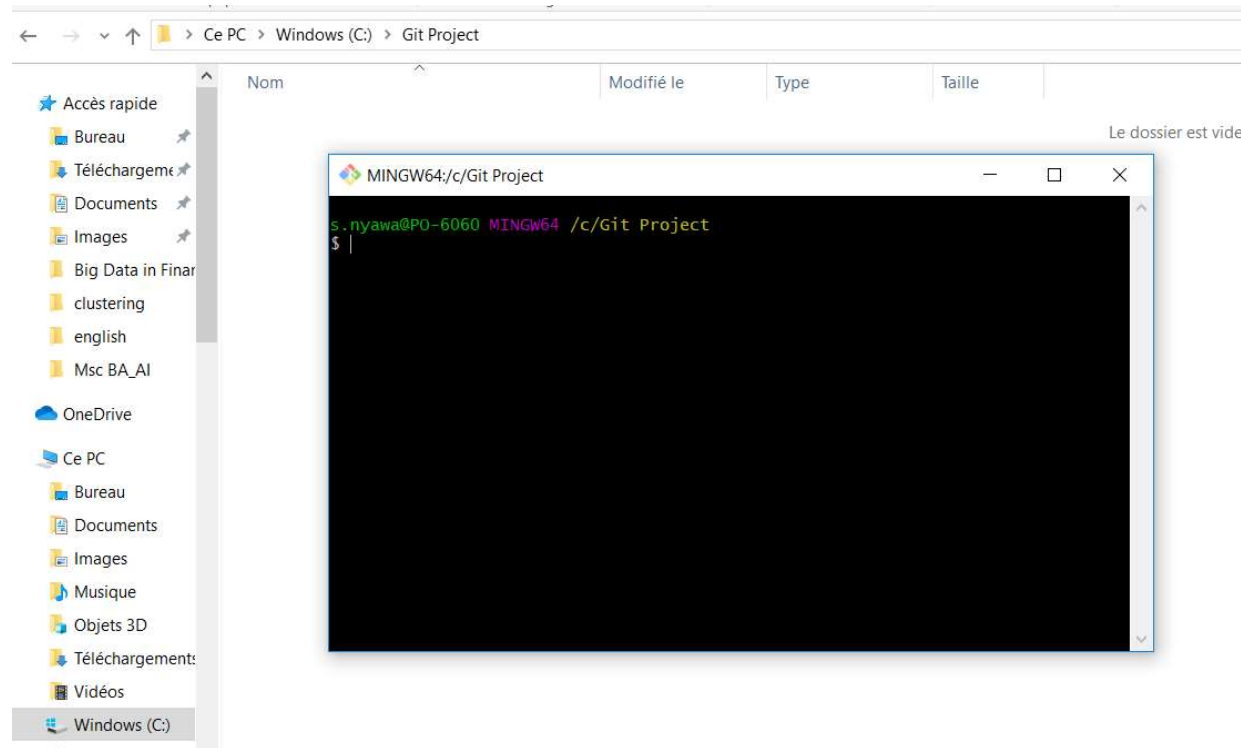
Get started with Github

- Open the local created file and right click
- Click on “Git Bash Here”
- A Git Bash Emulator is opened



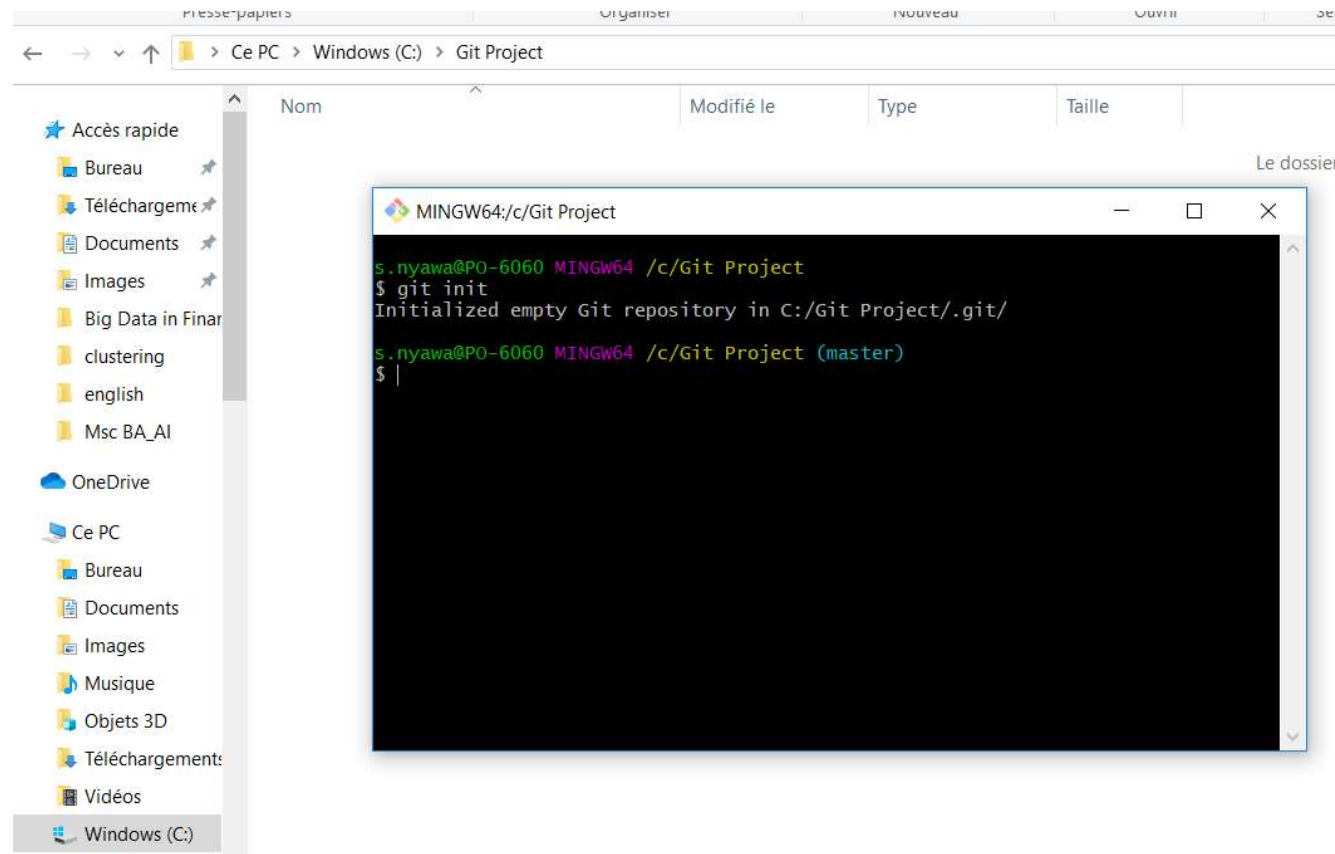
Get started with Github

- Open the local created file and right click
- Click on “Git Bash Here”
- A Git Bash Emulator is opened
- Your commands are done in this bash



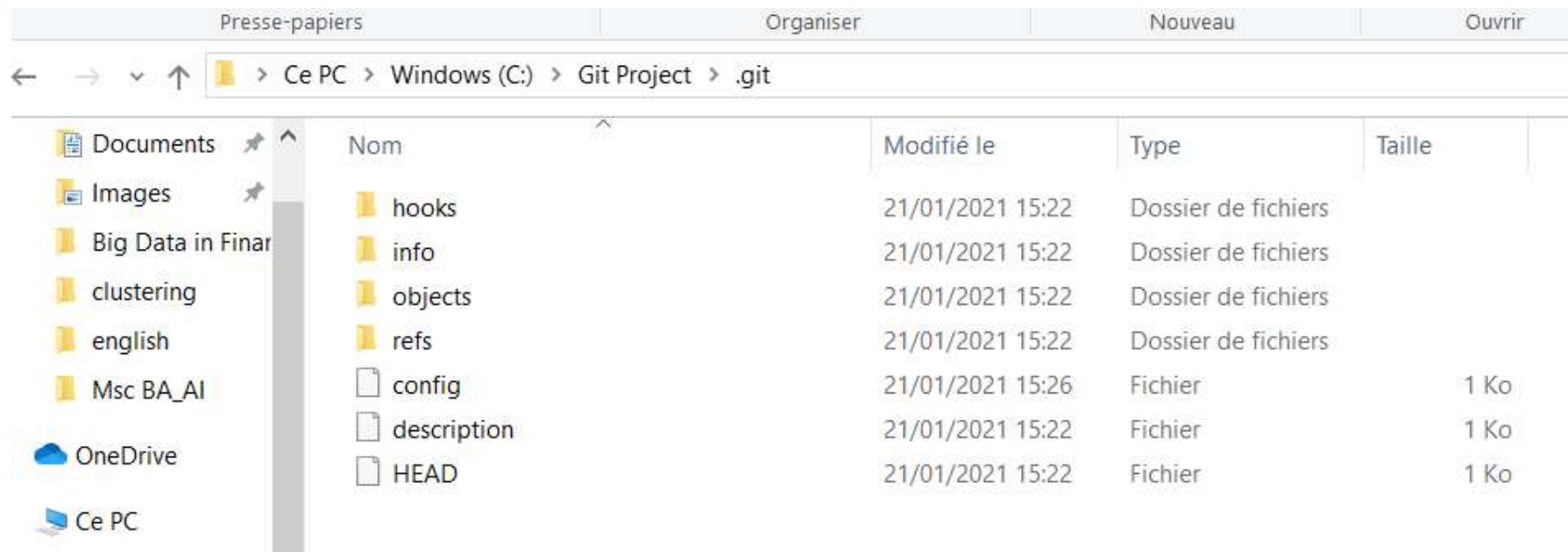
Get started with Github

- To create your local repository type in this bash: “git init” and press “enter”



Get started with Github

- A “.git” folder has been created with all information, objects, etc



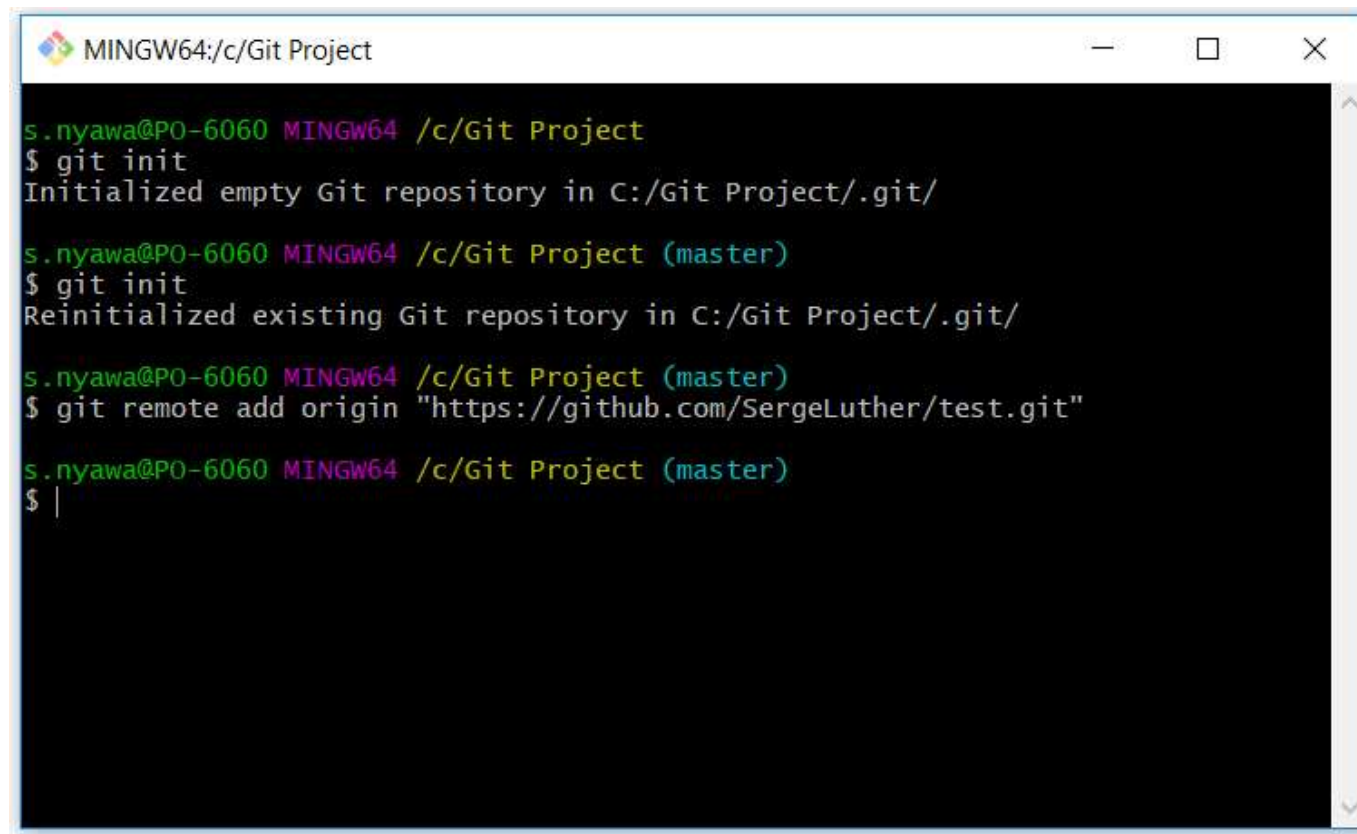
Get started with Github

- Link the local and the central repositories



Get started with Github

- Link the local and the central repositories
 - Add the remote repository as your origin by typing into the bash:
`git remote add origin "http url of your Github "`



```
MINGW64:/c/Git Project
s.nyawa@PO-6060 MINGW64 /c/Git Project
$ git init
Initialized empty Git repository in C:/Git Project/.git/

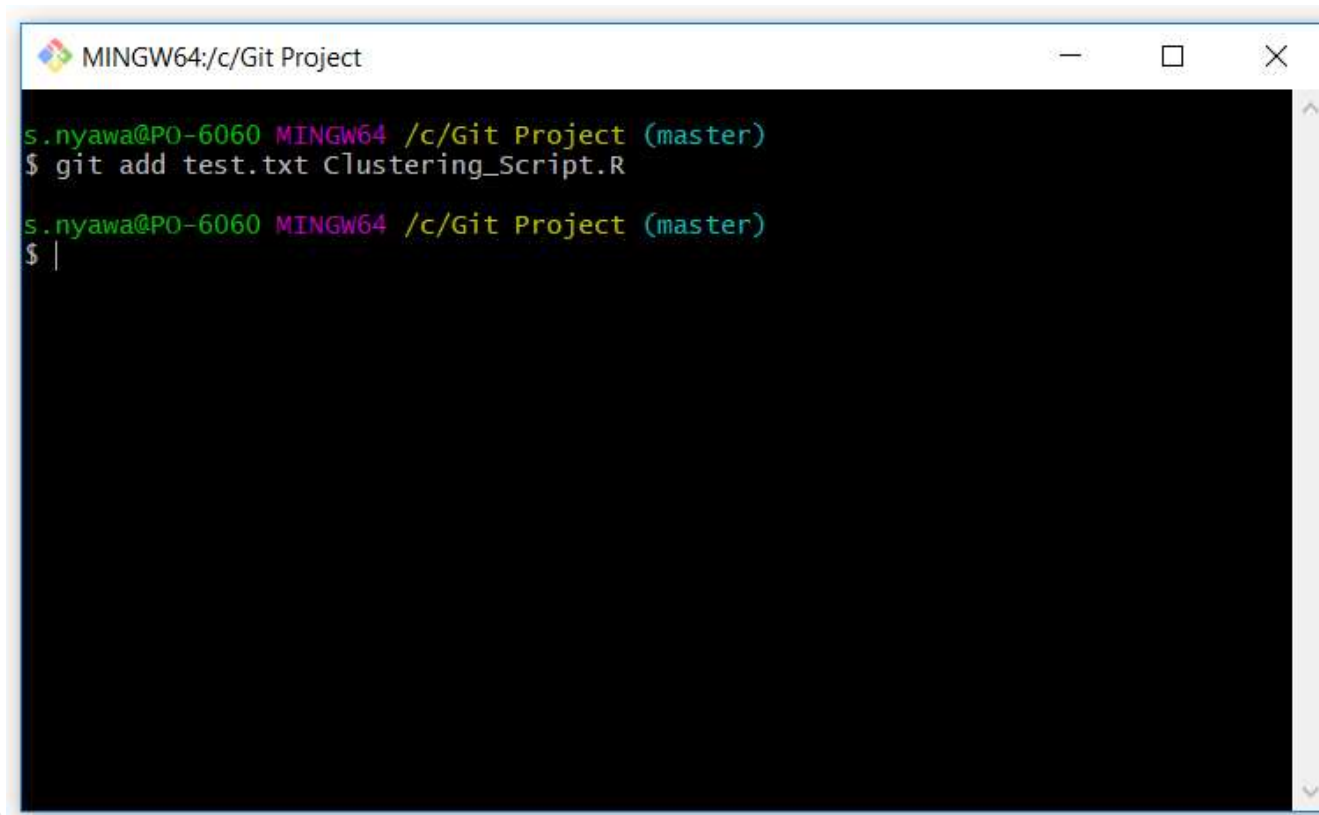
s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ git init
Reinitialized existing Git repository in C:/Git Project/.git/

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ git remote add origin "https://github.com/SergeLuther/test.git"

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ |
```

Get started with Github

- Pushing files from the local repository to the central repository
 - Add new files to your index by typing into the bash the command:
git add filename1 filename2

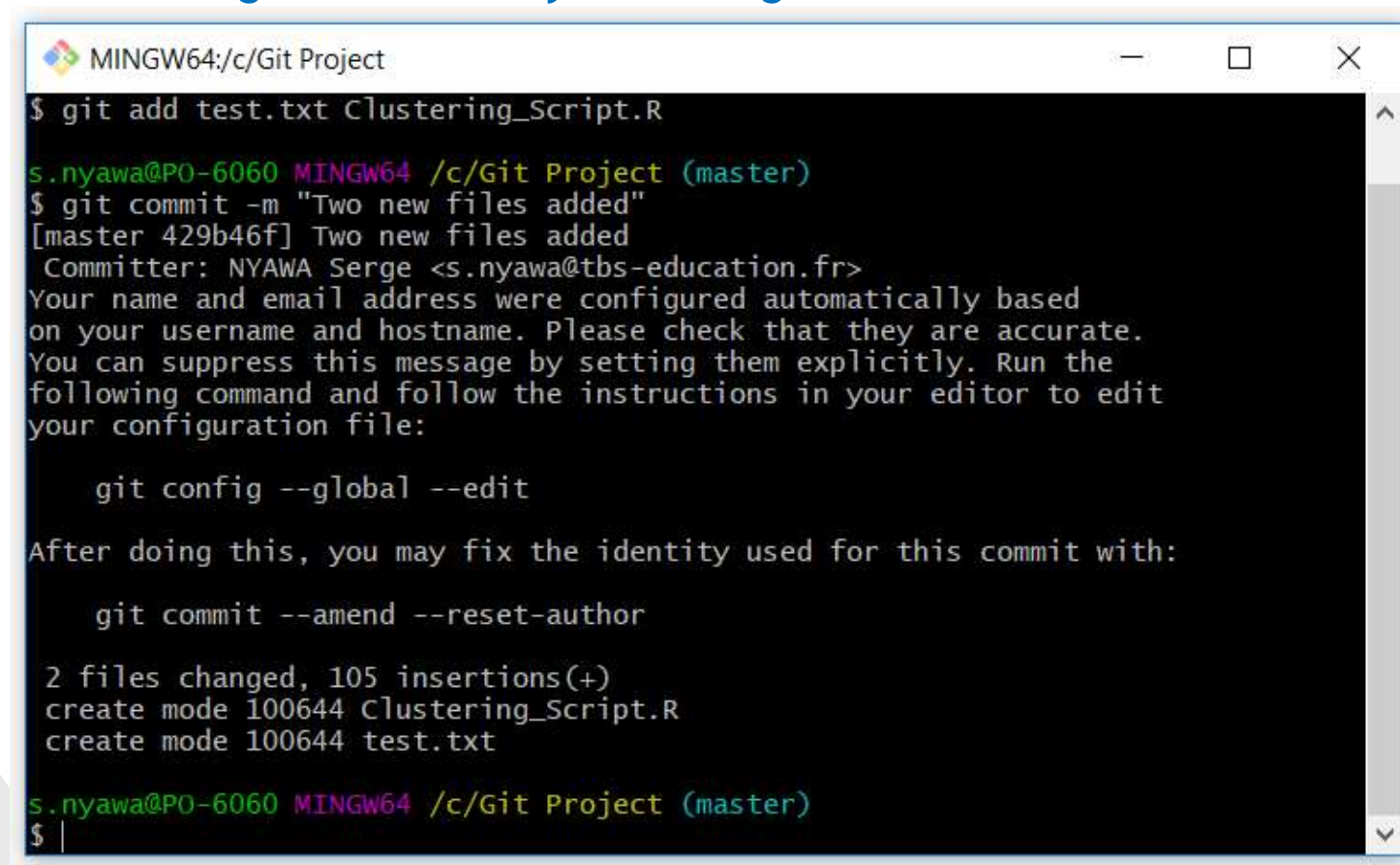
A screenshot of a terminal window titled 'MINGW64:/c/Git Project'. The window shows a user named 's.nyawa@P0-6060' in a 'MINGW64' environment at the '/c/Git Project' directory on the 'master' branch. The user has entered the command 'git add test.txt Clustering_Script.R' and is now at a new prompt '\$ |'.

Get started with Github

- Pushing files from the local repository to the central repository

- Commit the changes into the back the command:

`git commit -m "your message"`



```
MINGW64:/c/Git Project
$ git add test.txt Clustering_Script.R

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ git commit -m "Two new files added"
[master 429b46f] Two new files added
Committer: NYAWA Serge <s.nyawa@tbs-education.fr>
Your name and email address were configured automatically based
on your username and hostname. Please check that they are accurate.
You can suppress this message by setting them explicitly. Run the
following command and follow the instructions in your editor to edit
your configuration file:

    git config --global --edit

After doing this, you may fix the identity used for this commit with:

    git commit --amend --reset-author

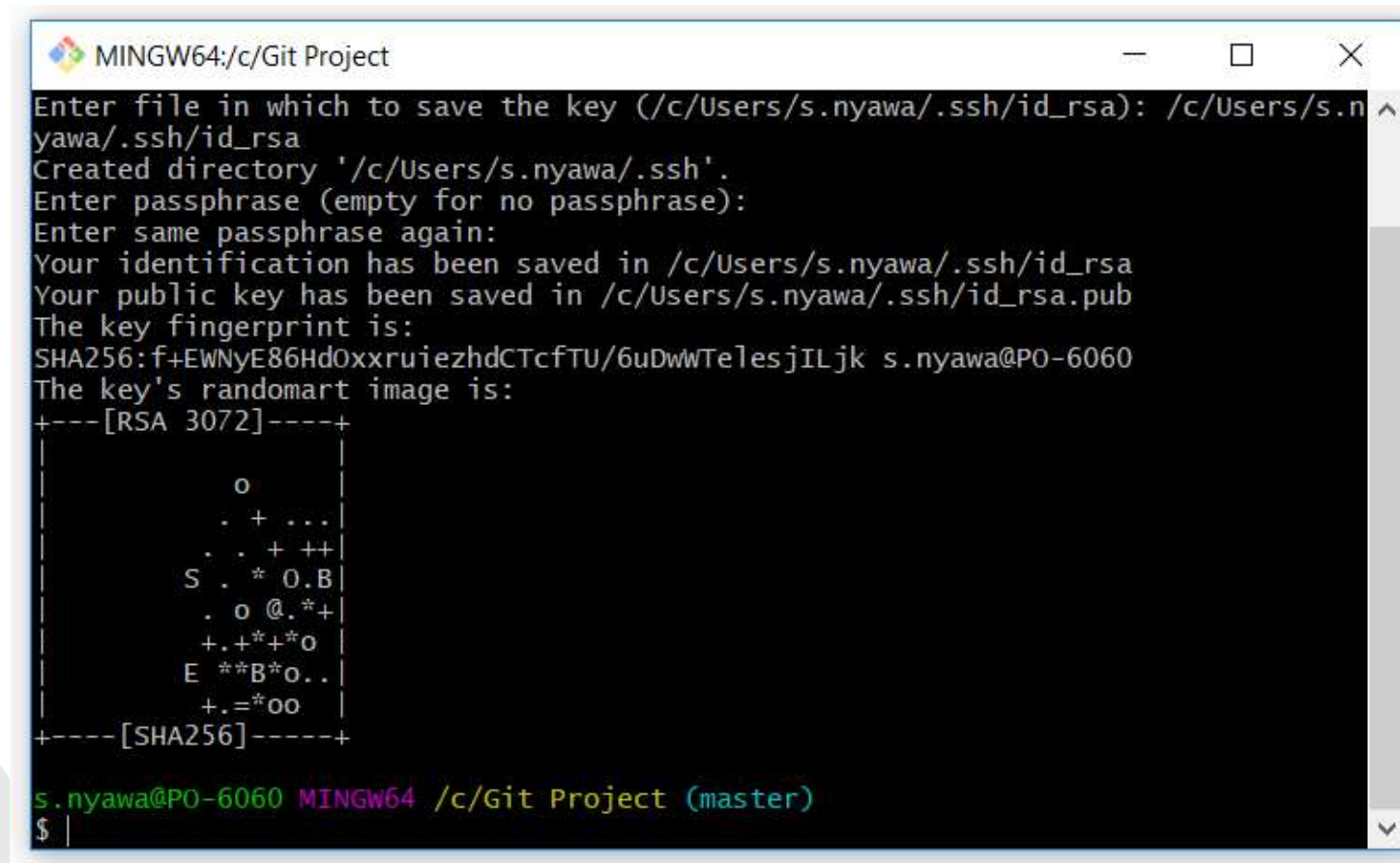
2 files changed, 105 insertions(+)
create mode 100644 Clustering_Script.R
create mode 100644 test.txt

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ |
```

Get started with Github

- Pushing files from the local repository to the central repository
 - Generate an SSH public key from your bach:

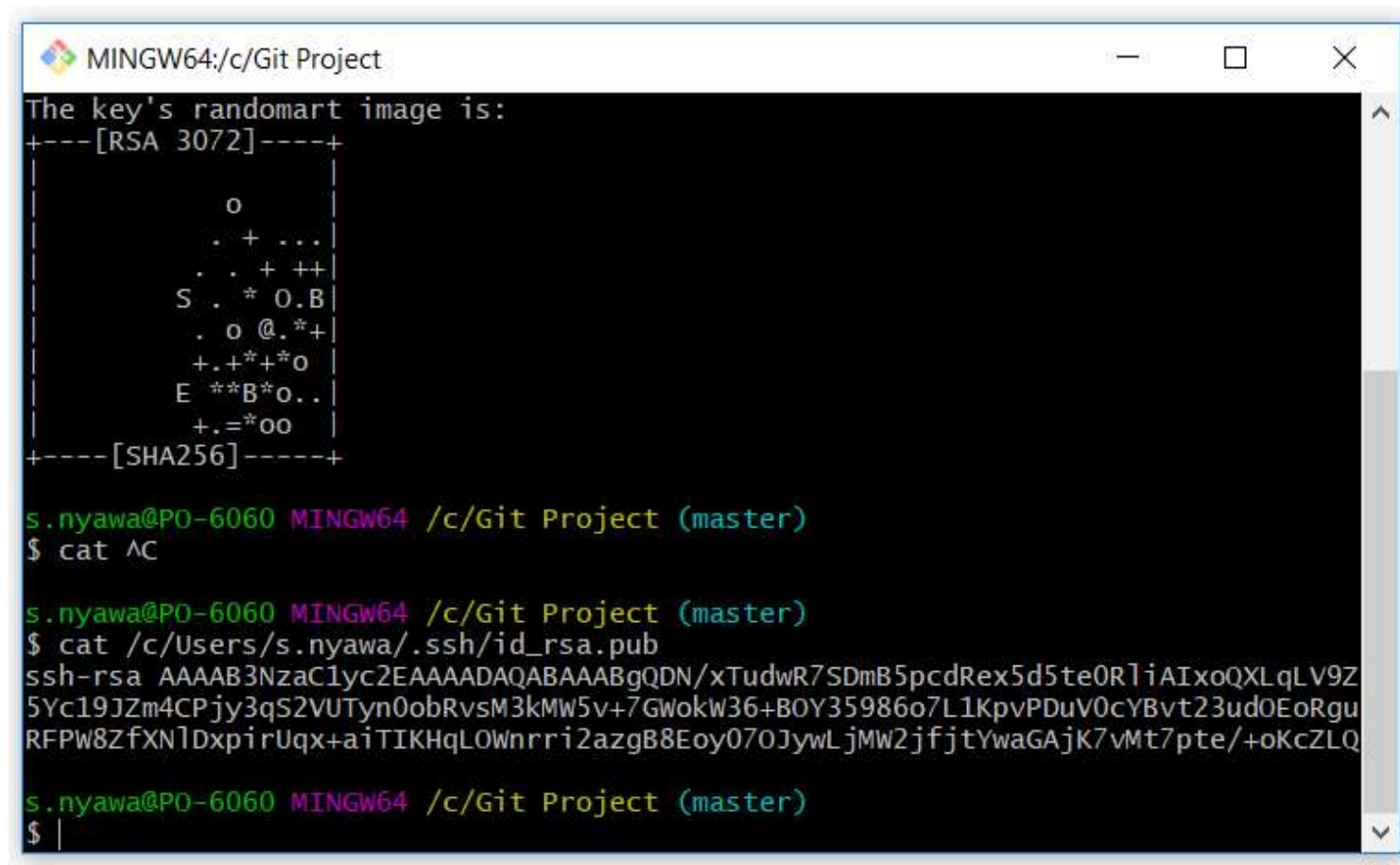
`ssh-keygen`



```
MINGW64:/c/Git Project
Enter file in which to save the key (/c/Users/s.nyawa/.ssh/id_rsa): /c/Users/s.nyawa/.ssh/id_rsa
Created directory '/c/Users/s.nyawa/.ssh'.
Enter passphrase (empty for no passphrase):
Enter same passphrase again:
Your identification has been saved in /c/Users/s.nyawa/.ssh/id_rsa
Your public key has been saved in /c/Users/s.nyawa/.ssh/id_rsa.pub
The key fingerprint is:
SHA256:f+EWNyE86Hd0xxruiezhdCTcfTU/6uDwwTelesjILjk s.nyawa@PO-6060
The key's randomart image is:
+---[RSA 3072]---+
  o
  . + ...
  . . + ++
  S . * O.B
  . o @.*+
  +. +*+*O
  E **B*O..
  +.=*OO
+-----[SHA256]-----+
s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$
```


Get started with Github

- Pushing files from the local repository to the central repository
 - Print your SSH public key from your bash:



```
MINGW64:/c/Git Project
The key's randomart image is:
+---[RSA 3072]-----+
|
|   o
|  . + .
| . . + ++
| S . * O.B
|  . o @.*+
|+.+*+*o
| E **B*o..
|+.=*oo
+-----[SHA256]-----+

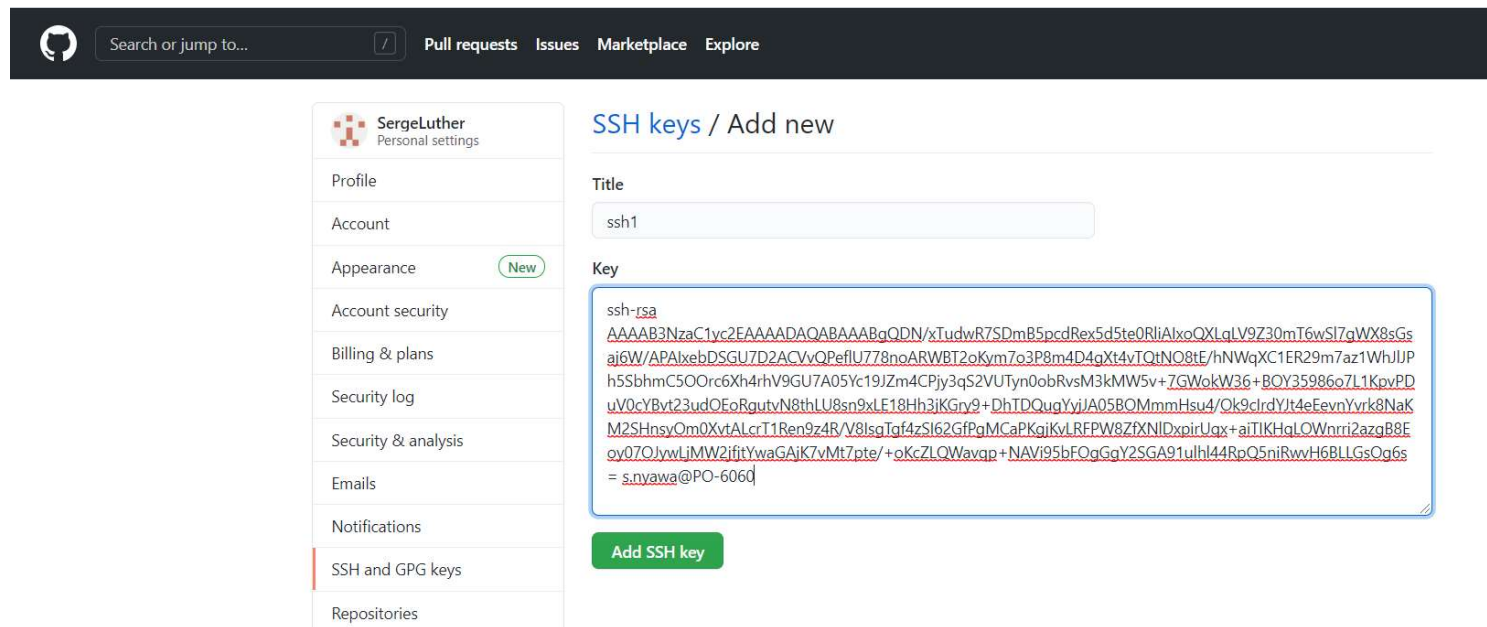
s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ cat ^C

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ cat /c/Users/s.nyawa/.ssh/id_rsa.pub
ssh-rsa AAAAB3NzaC1yc2EAAAADAQABAAQGDN/xTudwR7SDmB5pcdRex5d5te0R1iAIxoQXLqLV9Z
5Yc19JZm4CPjy3qS2VUTyn0obRvsM3kMW5v+7GwokW36+BOY35986o7L1KpvPDuV0cYBvt23ud0EoRgu
RFPW8ZfXN1DxpriUqx+aiTIKHqLOWnrri2azgB8Eoy070JywLjMW2jfjtYwaGAjK7vMt7pte/+oKcZLQ

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ |
```

Get started with Github

- Pushing files from the local repository to the central repository
 - Add your SSH public key in your Github account:
[Settings>SSH and GPG Keys>New SSH key](#)
 - Give a name to your key, paste the key code, and add a SSH Key



The screenshot shows the GitHub 'Add new SSH key' page. On the left is a sidebar with the user's profile 'SergeLuther' and a list of settings: Profile, Account, Appearance (marked 'New'), Account security, Billing & plans, Security log, Security & analysis, Emails, Notifications, SSH and GPG keys (highlighted), and Repositories. The main content area is titled 'SSH keys / Add new'. It has a 'Title' input field with 'ssh1' entered. Below is a 'Key' input field containing a long SSH public key starting with 'ssh-rsa'. At the bottom of the key field is an 'Add SSH key' button.

Search or jump to... Pull requests Issues Marketplace Explore

SergeLuther
Personal settings

Profile
Account
Appearance New
Account security
Billing & plans
Security log
Security & analysis
Emails
Notifications
SSH and GPG keys
Repositories

SSH keys / Add new

Title
ssh1

Key
ssh-rsa
AAAAB3NzaC1yc2EAAAADAQABAAQGDQI/xTudwR7SDmB5pcdRex5d5te0RliAlxoQXLqLV9Z30mT6wSI7gWX8sGs
aj6W/APAlxebDSGU7D2ACVvQPeFlU778noARWBT2oKym7o3P8m4D4qXt4vTQtNO8tE/hNWqXC1ER29m7az1WhJJP
h5SbhmC5OOrc6Xh4rhV9GU7A05Yc19JZm4CPjy3qS2VUTyn0obRvsM3kMW5v+7GWokW36+BOY35986o7L1KpvPD
uV0cYBvt23udQFoRgutvN8thLU8sn9xLE18Hh3jKGr9+DhTDQuqYyjjA05BOMmmHsu4/Ok9clrdYjt4eFevnYvrk8NaK
M2SHnsyOm0XvtALcrT1Ren9z4R/V8lsgTgf4zSl62GfPgMCaPKgiKvLRFPW8ZfXNIDxpriUqx+ajTIKHqLOWnrri2azgB8E
oy07OJywljMW2ifitYwaGAjK7vMt7pte/+oKcZLQWavqp+NAVi95bFOgGqY2SGA91ulhl44RpQ5niRwH6BLGsgQ6s
= s.nyawa@PO-606d

Add SSH key

Get started with Github

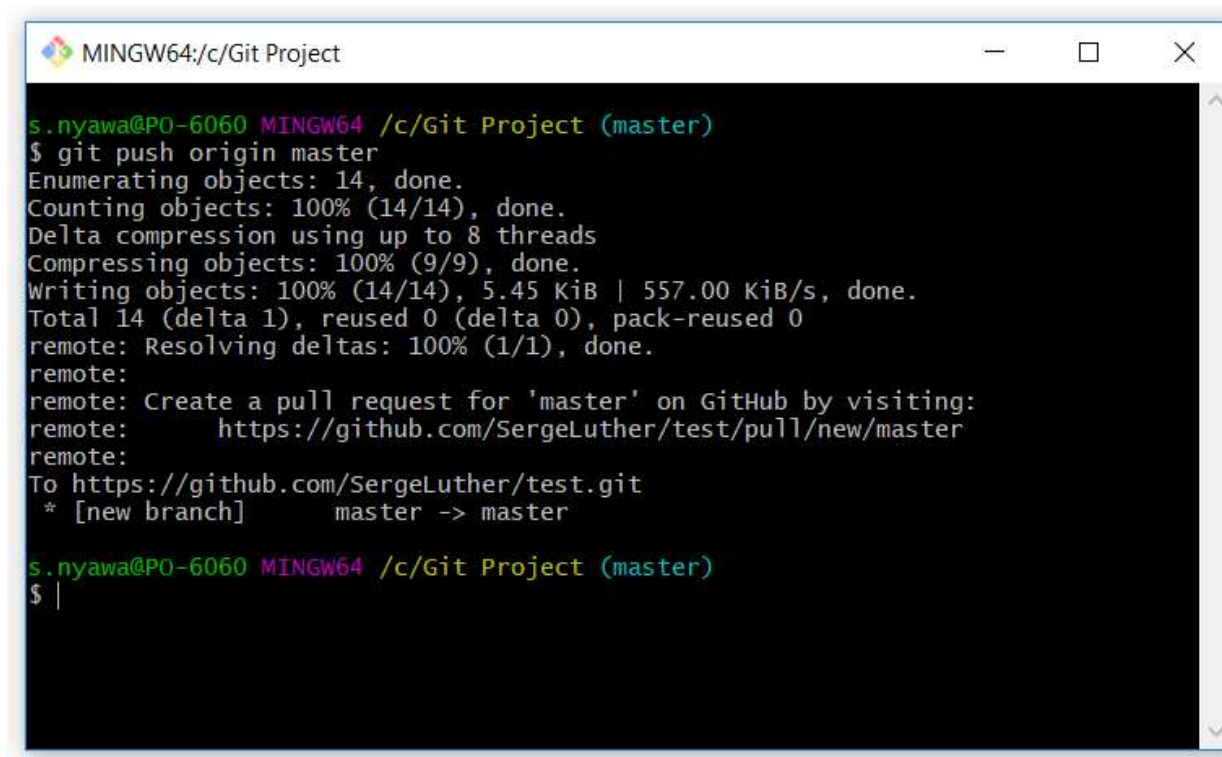
- Pushing files from the local repository to the central repository
 - Authenticate your key from your bash:

```
$ ssh -T git@github.com
The authenticity of host 'github.com (140.82.121.3)' can't be established.
RSA key fingerprint is SHA256:nThbg6kXUpJWG17E1IGOCspRomTxdCARLviKw6E5SY8.
Are you sure you want to continue connecting (yes/no/[fingerprint])? yes
Warning: Permanently added 'github.com,140.82.121.3' (RSA) to the list of known
hosts.
Hi SergeLuther! You've successfully authenticated, but GitHub does not provide s
hell access.

s.nyawa@PO-6060 MINGW64 /c/Git Project (master)
$ |
```

Get started with Github

- Pushing files from the local repository to the central repository
 - Push the files from your bach:



```
MINGW64:/c/Git Project

s.nyawa@P0-6060 MINGW64 /c/Git Project (master)
$ git push origin master
Enumerating objects: 14, done.
Counting objects: 100% (14/14), done.
Delta compression using up to 8 threads
Compressing objects: 100% (9/9), done.
Writing objects: 100% (14/14), 5.45 KiB | 557.00 KiB/s, done.
Total 14 (delta 1), reused 0 (delta 0), pack-reused 0
remote: Resolving deltas: 100% (1/1), done.
remote:
remote: Create a pull request for 'master' on GitHub by visiting:
remote:   https://github.com/SergeLuther/test/pull/new/master
remote:
To https://github.com/SergeLuther/test.git
 * [new branch]      master -> master

s.nyawa@P0-6060 MINGW64 /c/Git Project (master)
$ |
```



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