

1 - REPLICABILIDADE

Consultor: Ricardo Manhães Savii



Ricardo Manhães Savii

Machine learning Engineer @Throughtworks Sistemas Inteligentes desde 2018.

Projetos de Processamento de Linguagem Natural, Classificação de Imagens e Aplicações em E-commerce.

MLOps (suporte para a criação e operacionalização de Modelos de Machine Learning).

PyData São Paulo.

O que veremos neste módulo:

O1

Roadmap de um projeto em ciência de dados 02

Experiment Tracking

03

Experiment Tracking e automação 04

Ferramentas Open Source

05

Noções de CI/CD

06

Montando seu primeiro ML CI

07

CI avançado com Git Ops

Alinhamento de

Expectativas

Após o curso você será capaz de:



- 1) Entender onde um cientista de dados se encaixa na entrega de uma projeto
- 2) Ferramentas que podem automatizar coisas maçantes no dia-a-dia.



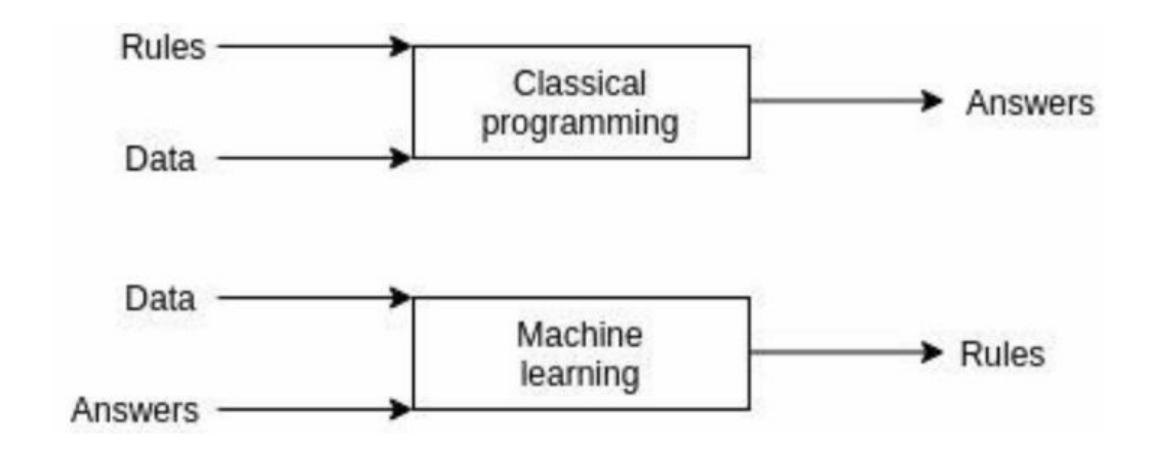
- 3) Percepções práticas em relação ao: Projeto e à entrega de valor
- 4) Habilidades práticas: Te aproximam da possibilidade de produtizar aplicações de ciência de dados.



2 - Visão de Experimentação em um Projeto de Software

Consultor: Ricardo Manhães Savii

Projeto de Software

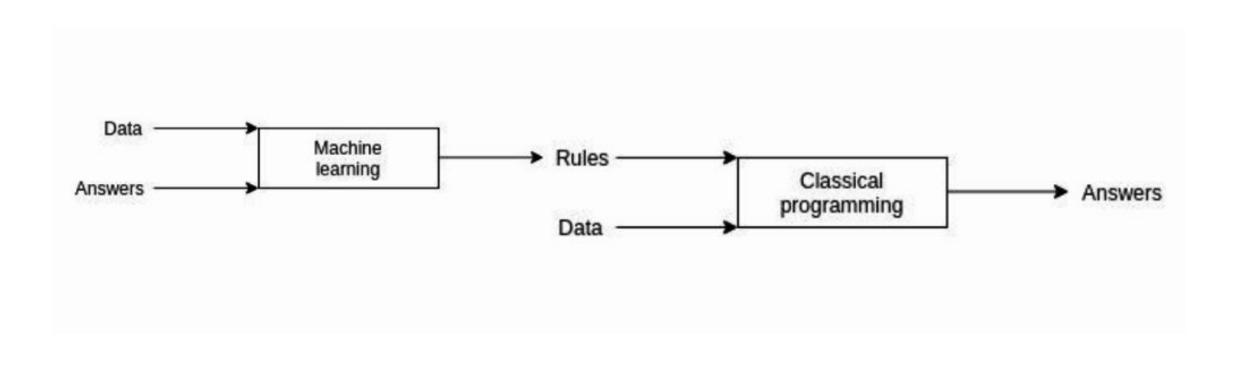


source: Deep Learning with Python by François Chollet

Leitura:

https://medium.com/@ricardosavii/trying-to-turn-machine-learning-into-value -de9f28cde056

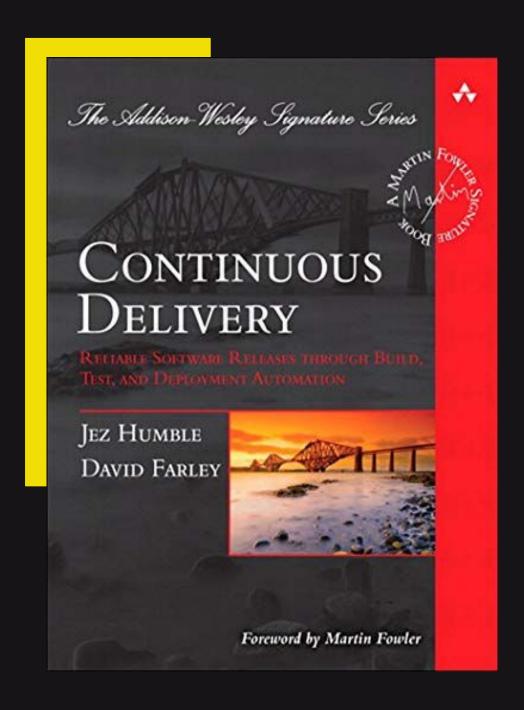
Projeto de Software



Leitura:

https://medium.com/@ricardosavii/trying-to-turn-machine-learning-into-value -de9f28cde056

Como entrega?

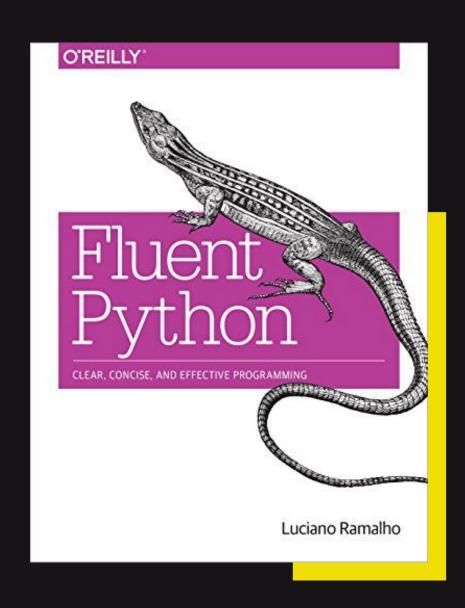


Leitura:

https://www.amazon.com.br/Continuous-Delivery-Deployment-Automation-Addison -Wesley-ebook/dp/B003YMNVC0

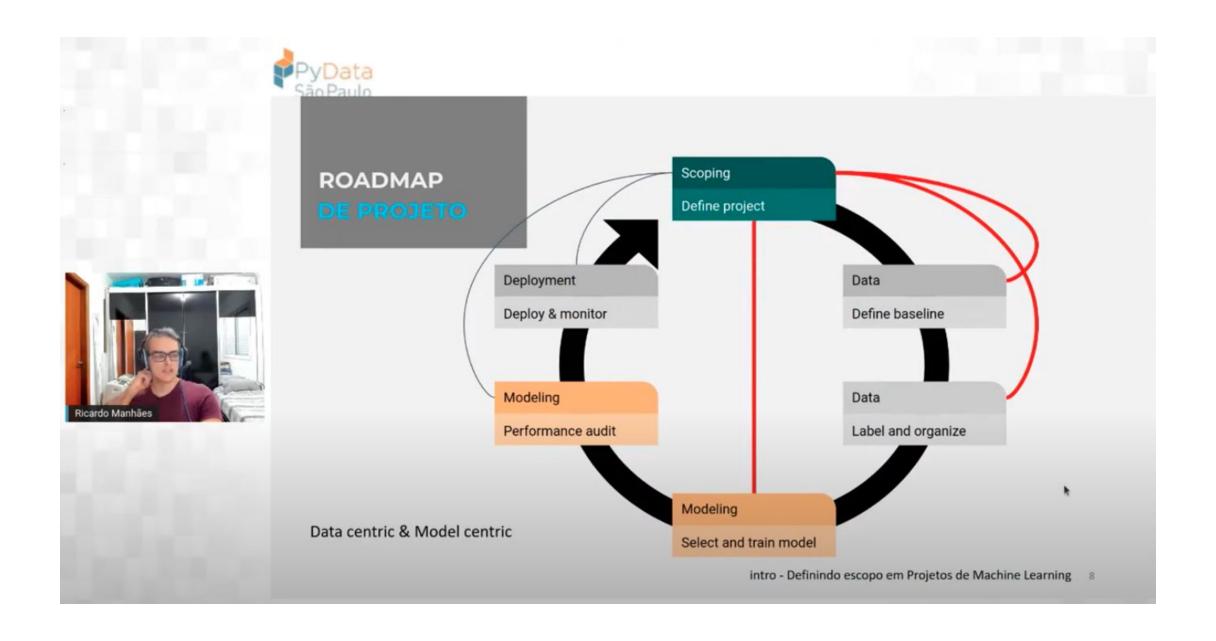
Software precisa

de um bom código



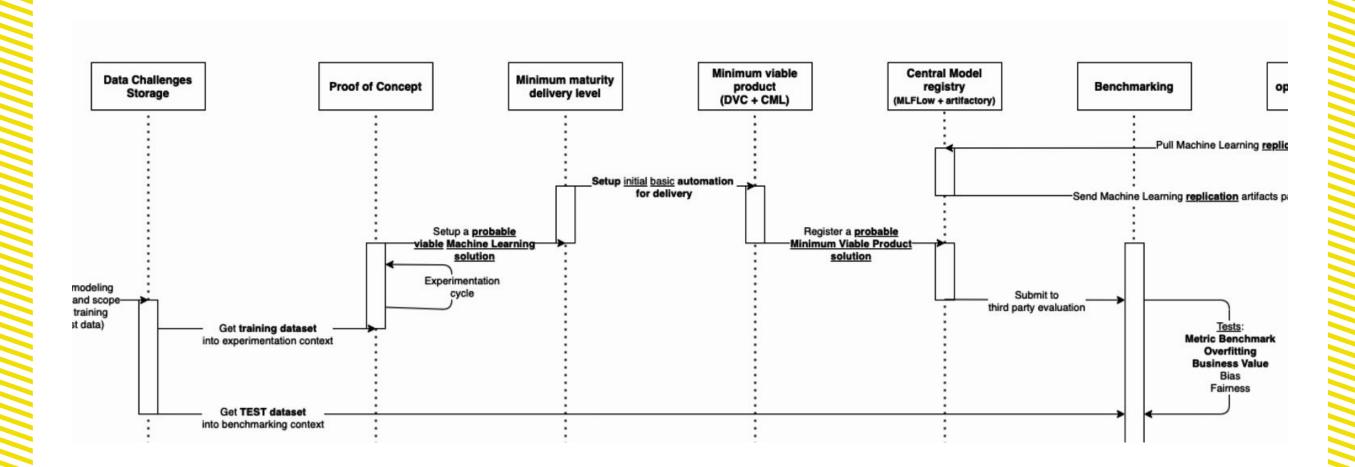
Leitura:

E organização



https://youtu.be/YLAKGcQ0ttw

Porque?



Leitura:

https://medium.com/@ricardosavii/trying-to-turn-machine-learning-into-value -de9f28cde056

Projeto de Equipe

"AI models, however, are ultimately a software artifact like any other that needs to be integrated within an application. The trouble with MLOps as it is most often pursued today is data scientists are constructing AI models in almost complete isolation from the rest of the organization."

—— "The Road to AI Hell Starts with Good MLOps Intentions" by Dmitry Petrov

Leitura: https://thenewstack.io/the-road-to-ai-hell-starts-with-good-mlops-intentions/

Resumo

Machine Learning é software, com diferenças, mas é um **software**.

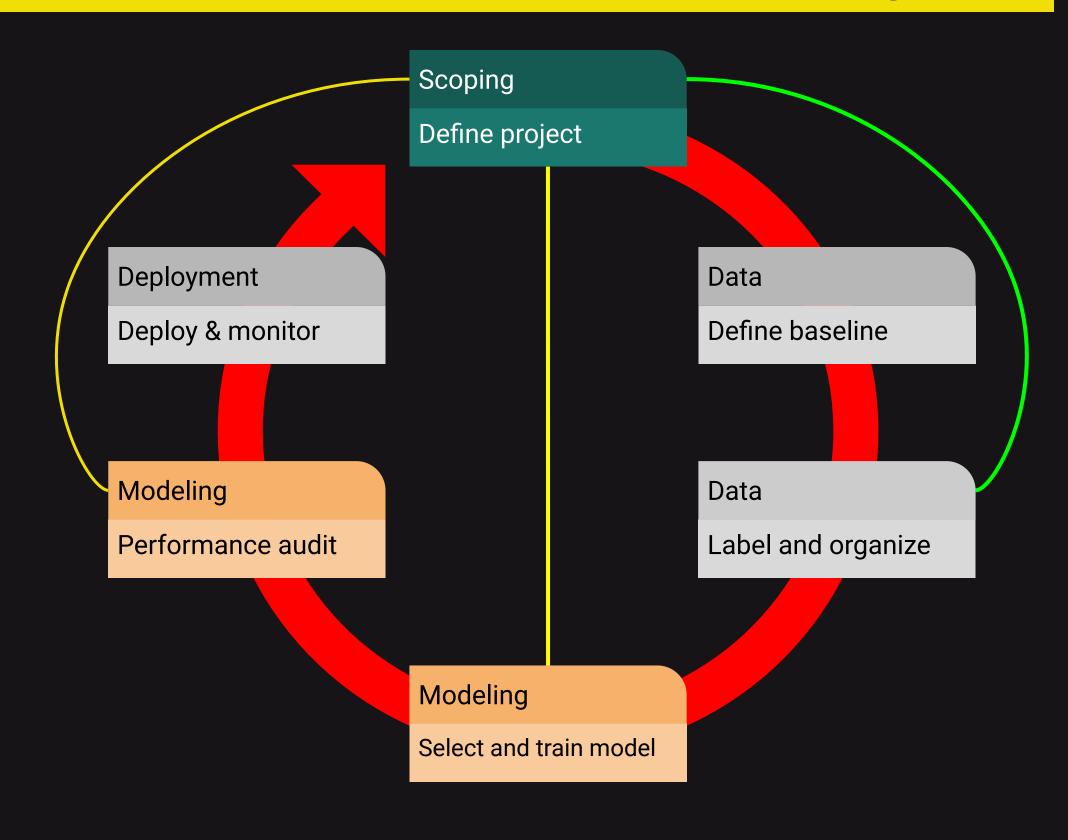
O trabalho de um cientista de dados é muitas vezes pensado como livre e criativo. Mas exige organização, protocolo e uso correto de ferramentas se quiser garantir resultados.



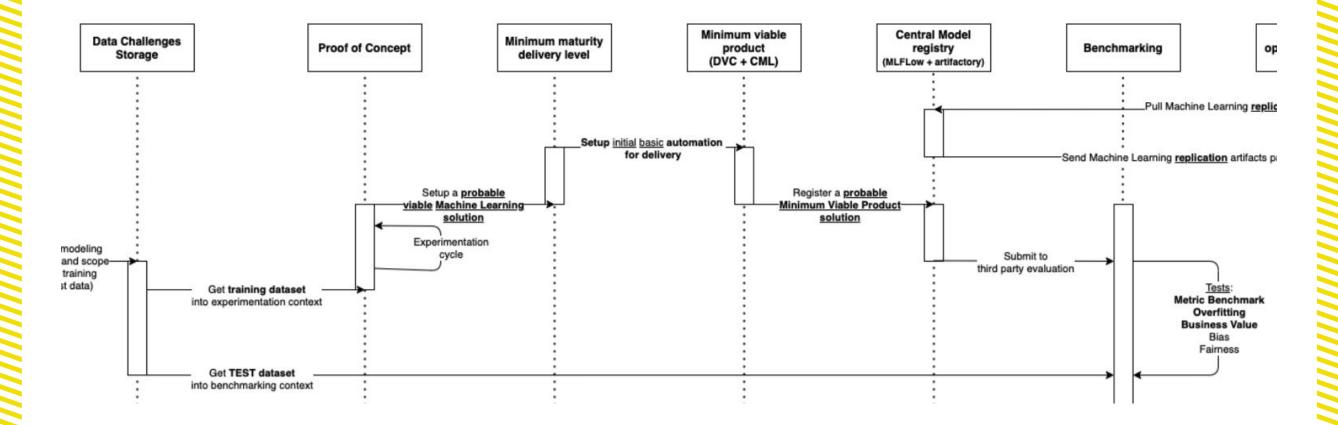
3- Experiment Cycle Tracking

Consultor: Ricardo Manhães Savii

Ciclo de Experimentação



Esse ciclo é só uma parte



Projeto de EQUIPE

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Automatize coisas!

"A well-engineered pipeline gets data scientists iterating much faster, which can be a big competitive edge" From Engineering Practices in Data Science By Chris Clark.

Leitura: http://blog.untrod.com/2012/10/engineering-practices-in-data-science.html

Terminologia

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Leitura: https://www.acm.org/publications/policies/artifact-review-badging

Replicabilidade automação

What data scientists need to know about DevOps

A philosophical and practical guide to using continuous integration (via GitHub Actions) to build an automatic model training system.



Elle O'Brien 💓 • July 16, 2020 • 12 min read • No comments



Leitura: https://dvc.org/blog/devops-for-data-scientists

Resumo

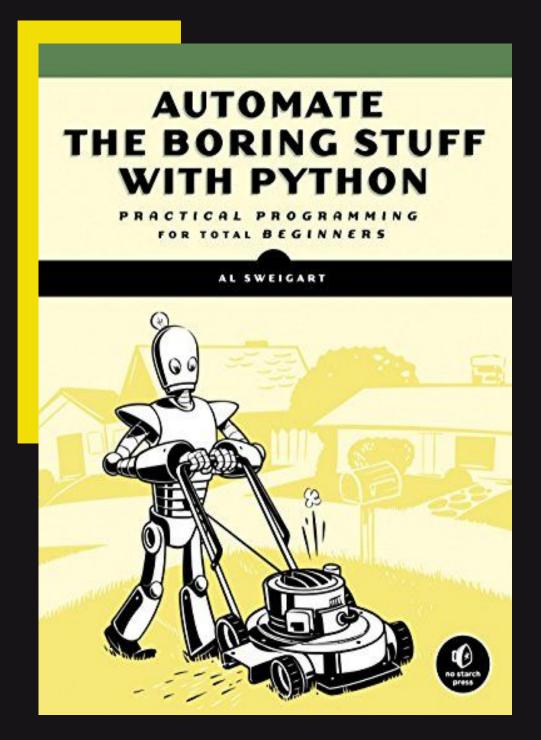
Replicabilidade e Reprodutibilidade são melhores quando há o mínimo de passos manuais. Pessoas erram, computadores são feitos para repetir operações incessantemente!



4 - Automatize coisas maçantes

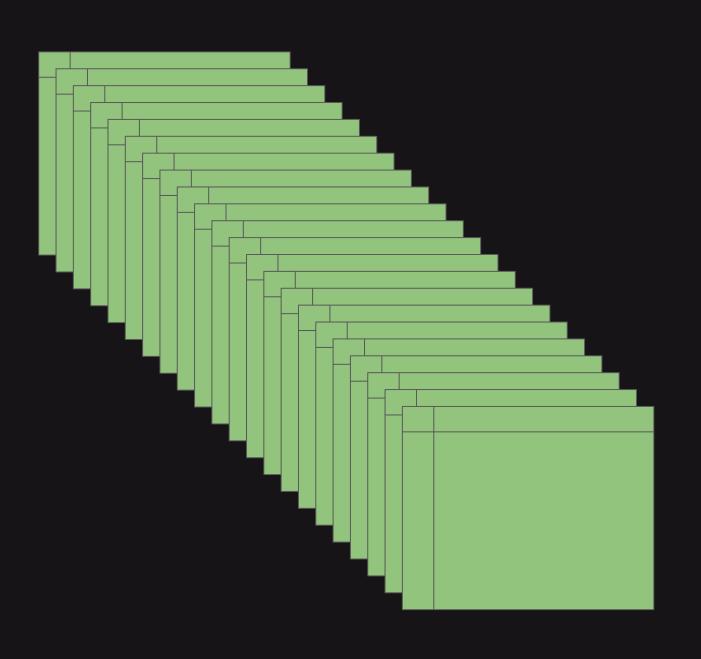
Consultor: Ricardo Manhães Savii

Boring stuff



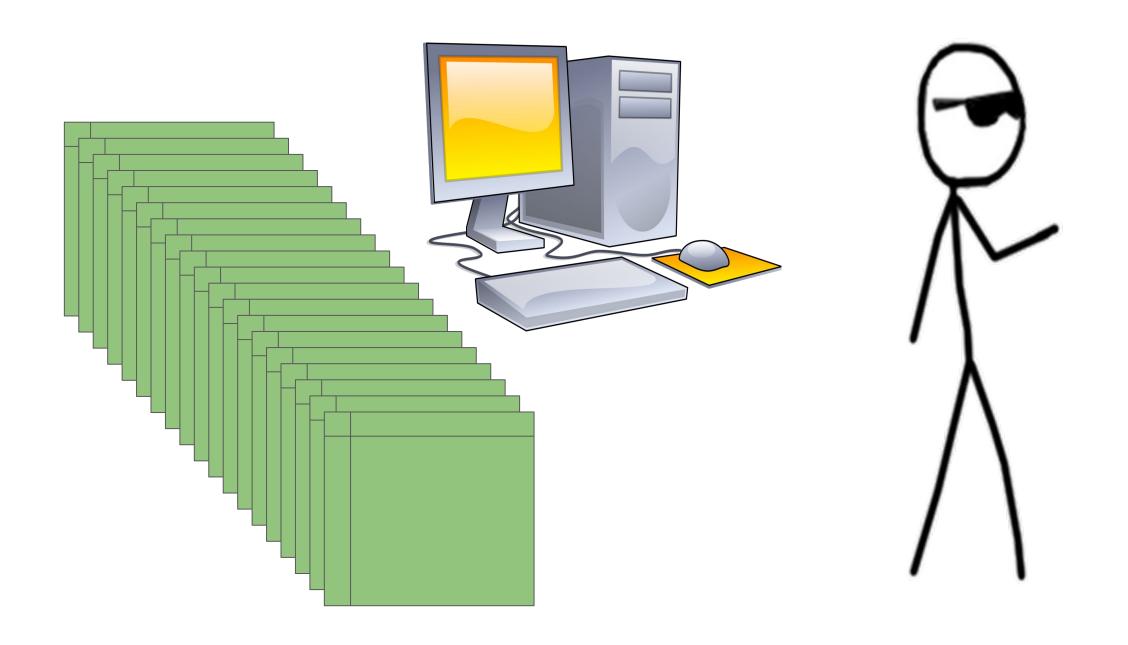
https://www.amazon.com.br/Automate-Boring-Stuff-Python-Programming-ebook/dp/B 00WJ049VU

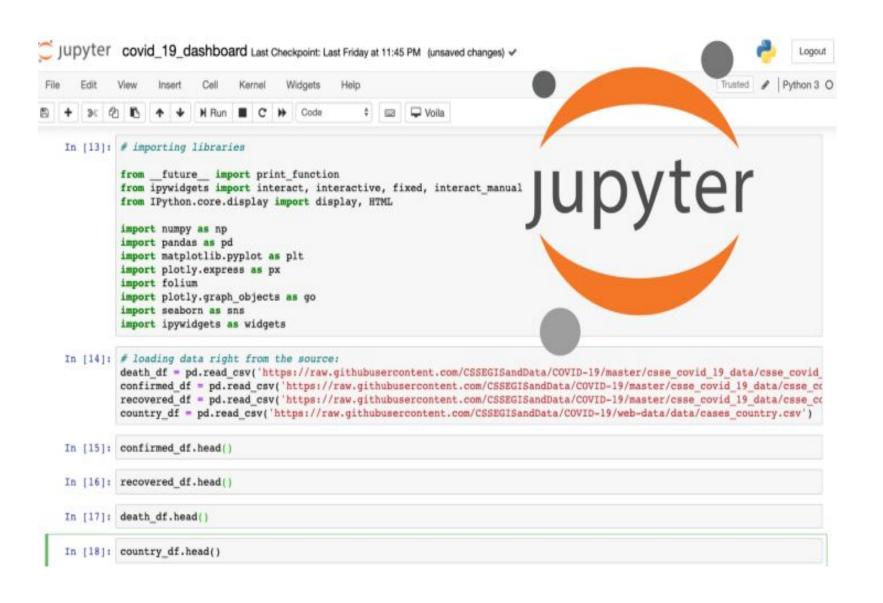
O que é maçante?





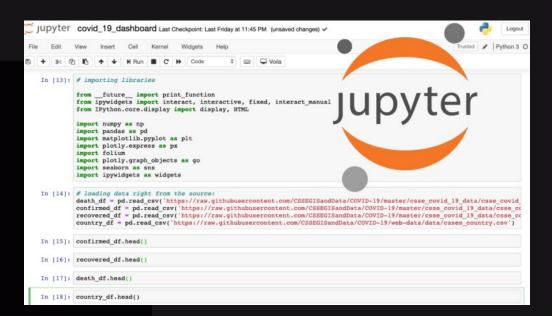
O que é maçante?

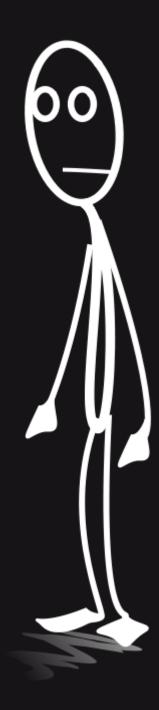










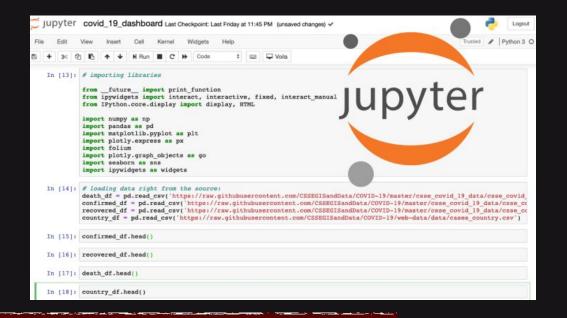


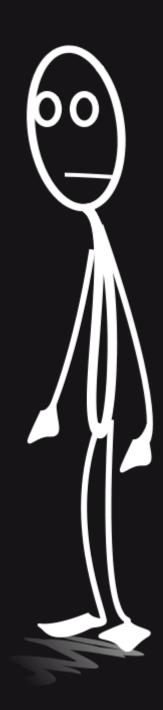
JUDYTET covid_19_dashboard Last Checkpoint: Last Friday at 11:45 PM (unsaved changes) >

Edit View Insert Cell Kernel Widgets Help









Automatize coisas!

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Leitura:

http://blog.untrod.com/2012/10/engineering-practices-in-data-science.
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Resumo

As vezes **nos acostumamos** tanto com coisas maçantes e **perdemos muito tempo** com coisas que **não trazem valor**.

Avalie bem o tempo que você gasta com o que realmente traz valor e o que não.

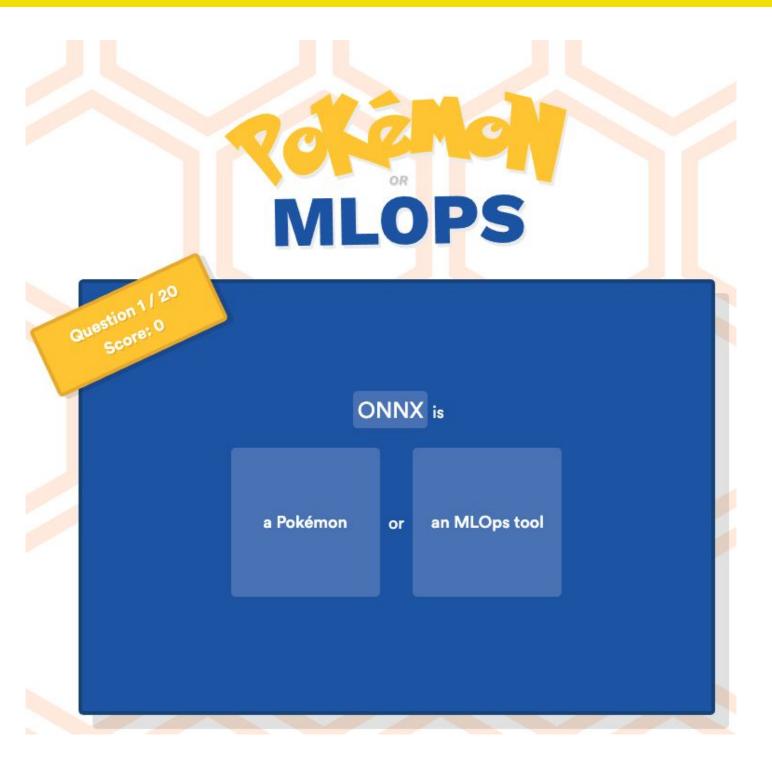
Espero que este módulo te traga alguns insights!



5 - Conhecendo os Pokémons da área

Consultor: Ricardo Manhães Savii

Pokémon or MLOps



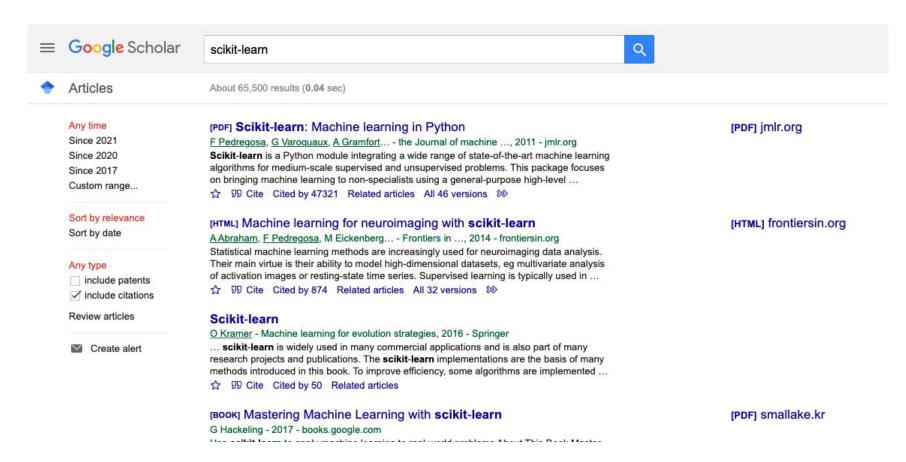
https://valohai.com/mlops-or-pokemon/

Reinventar a roda?

56 Groundbreaking Python Open-source Projects – Get started with Python

Python is booming and so is its Github page. This year was great for Python and we saw some very powerful python open-source projects to contribute to. Today, we're listing down some of the top python open-source projects; try contributing to at least one of these, it will help improve your Python skills.

56 Python Open-source Projects

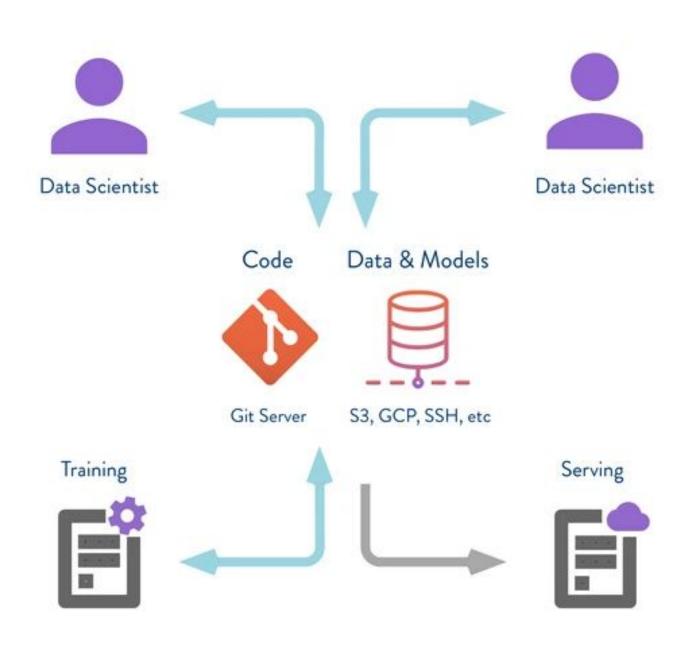


https://data-flair.training/blogs/python-open-source-projects/ https://scholar.google.com/scholar?hl=en&as_sdt=0%2C5&q=scikit-learn&btnG=

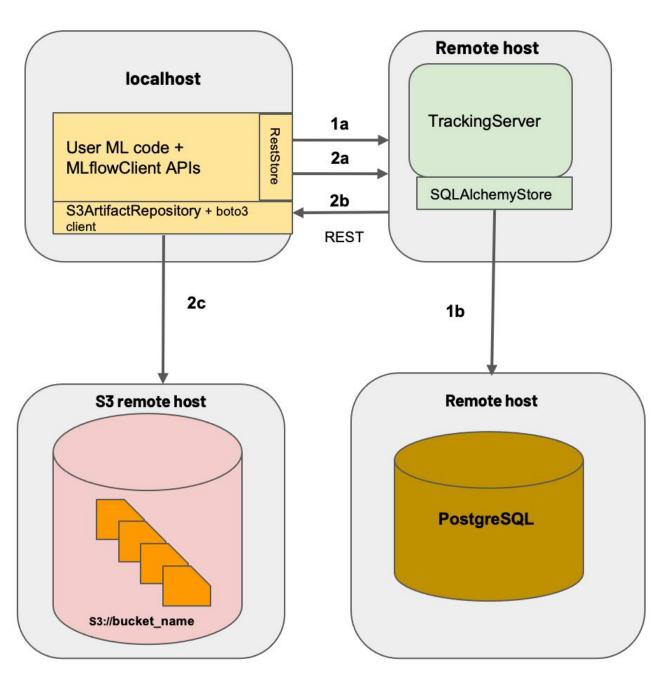
Experiment tracking tools



DVC (data version control)



MLflow



Scenario 4: mlflow server --backend-store-uri postgresql://URI --default-artifact-root S3:/bucket_name --host remote_host

Diferenças (DVC)





Diferenças (MLflow)

MLflow is an open source platform to manage the ML lifecycle, including experimentation, reproducibility, deployment, and a central model registry. MLflow currently offers four components:

MLflow Tracking

Record and query experiments: code, data, config, and results

Read more

MLflow Projects

Package data science code in a format to reproduce runs on any platform

Read more

MLflow Models

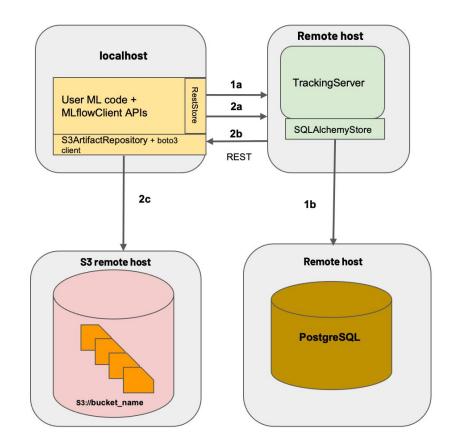
Deploy machine learning models in diverse serving environments

Read more

Model Registry

Store, annotate, discover, and manage models in a central repository

Read more



Resumo

Machine Learning é uma área em extrema expansão de conhecimento e aplicações, não é fácil acompanhar.

Se manter atualizado fará toda a diferença, pois muitos projetos interessantes surgem a todo momento.

DVC* e **MLflow** são dois projetos que te ajudarão muito na questão de **controle** e **replicabilidade** de seus projetos.



6 - Replicação na Prática

Consultor: Ricardo Manhães Savii

Replicabilidade

Terminology

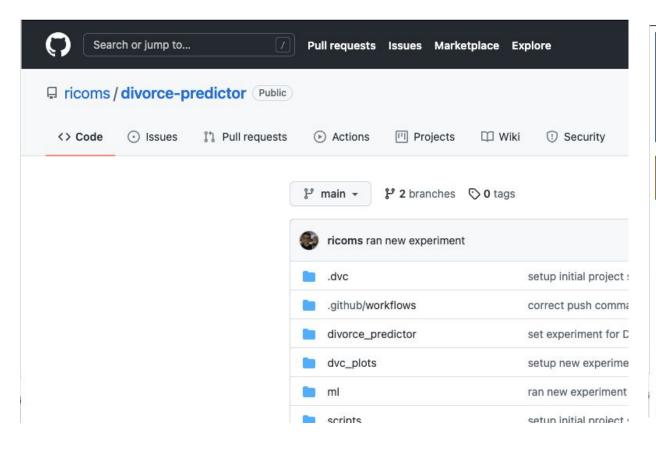
A variety of research communities have embraced the goal of reproducibility in experimental science. Unfortunately, the terminology in use has not been uniform. Because of this we find it necessary to define our terms. The following are inspired by the International Vocabulary for Metrology(VIM); see the Appendix for details.

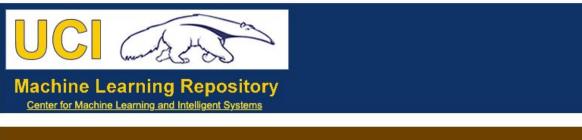
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Fonte:

https://www.acm.org/publications/policies/artifact-review-badging

Projeto divórcios





Check out the beta version of the new UCI Machine Learning Repository we are currently testing! Contact us if you have

Divorce Predictors data set Data Set

Download: Data Folder, Data Set Description

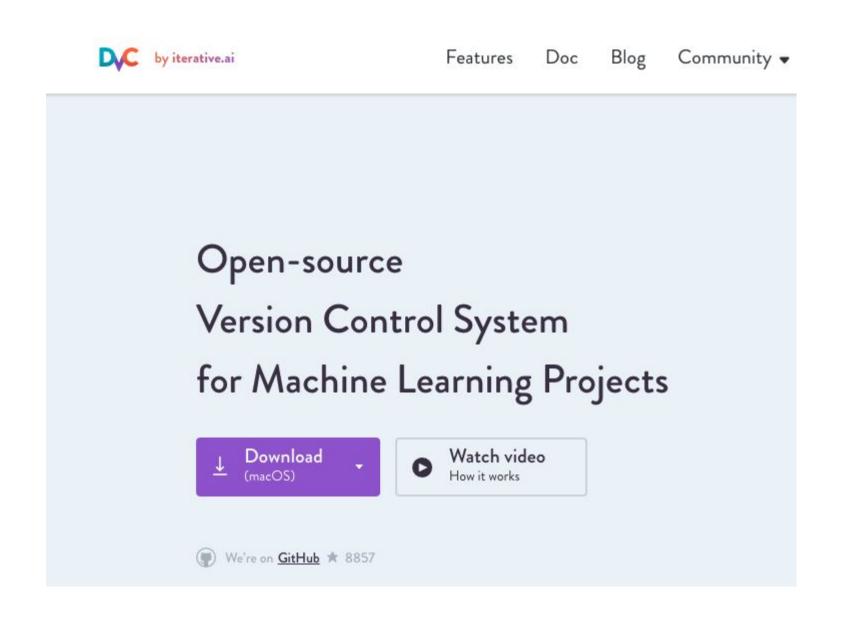
Abstract: Participants completed the Personal Information Form and Divorce Predictors Scale.

Data Set Characteristics:	Multivariate, Univariate	Number of Instances:	170	Area:	Life
Attribute Characteristics:	Integer	Number of Attributes:	54	Date Donated	2019-07-24
Associated Tasks:	Classification	Missing Values?	N/A	Number of Web Hits:	120430

Source:

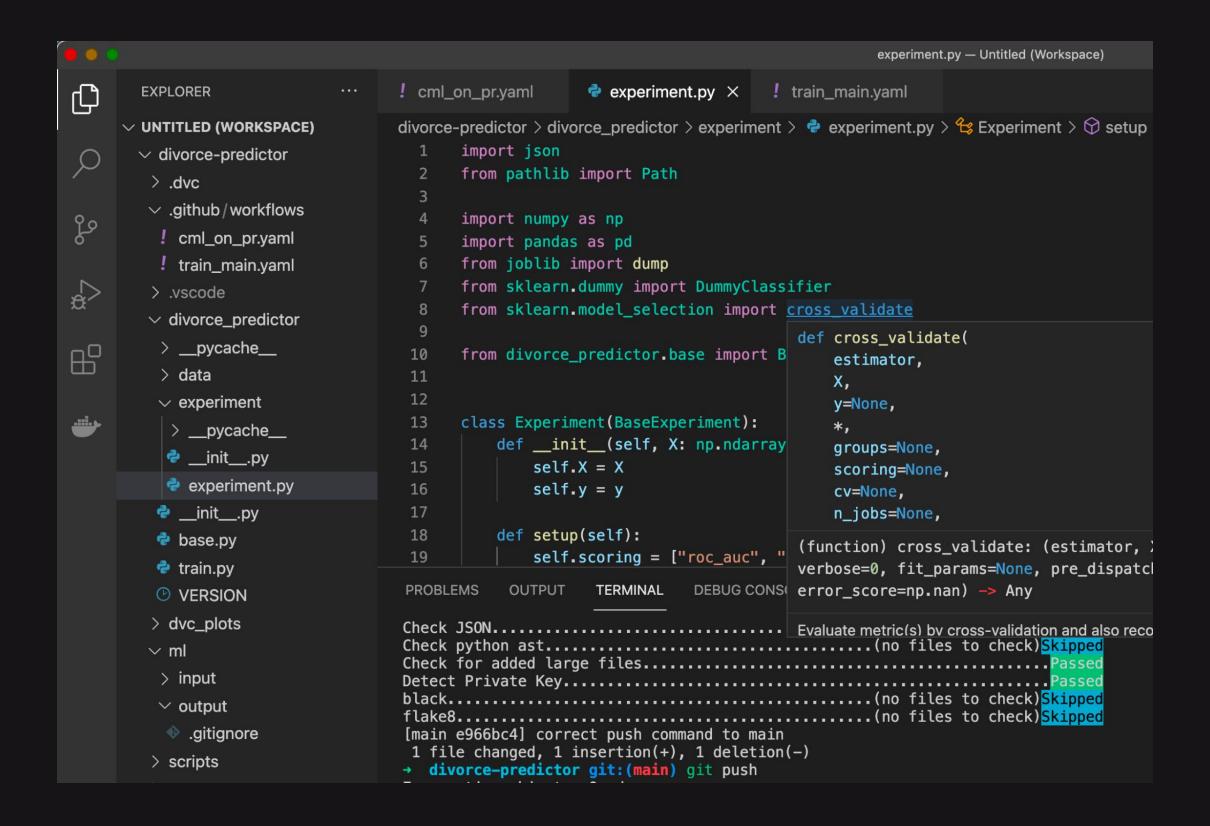
Dr. Mustafa Kemal Yöntem, Nevşehir Hacı Bektaş Veli University, Faculty of Education, Department of Educational Sciences, must





https://dvc.org/

Vamos ao código



Resumo

Nesta aula eu demonstrei **repetibilidade**.

Para demonstrar **replicabilidade** precisarei de você.

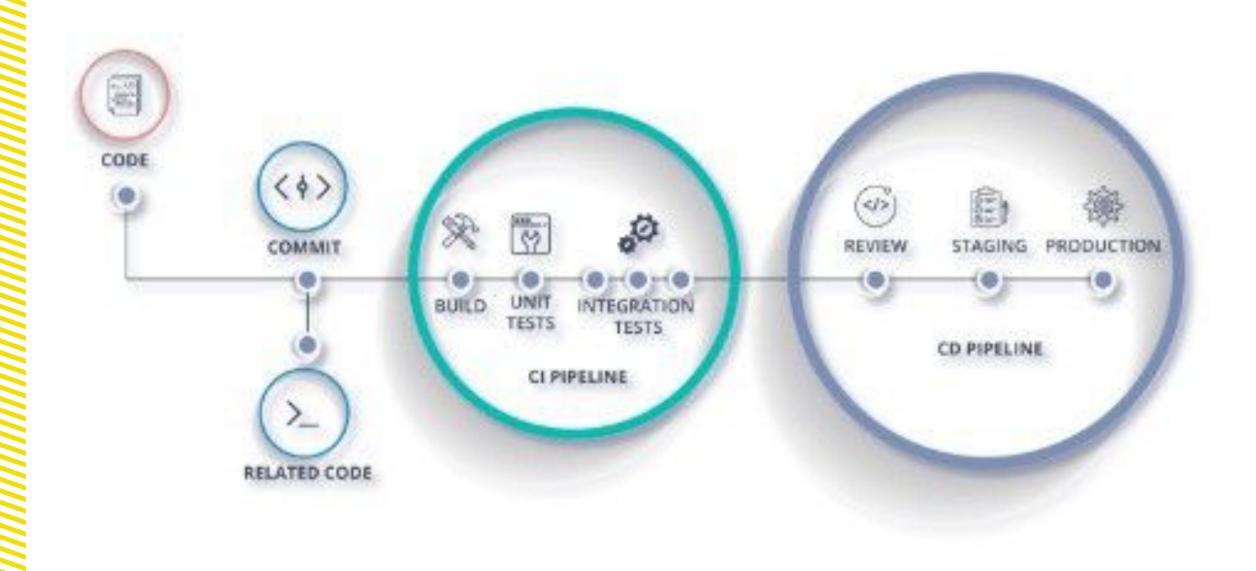
No exercício prático espero que consiga instalar o projeto e reproduzi-lo. Boa sorte!



10 - Noções de CI/CD

Consultor: Ricardo Manhães Savii

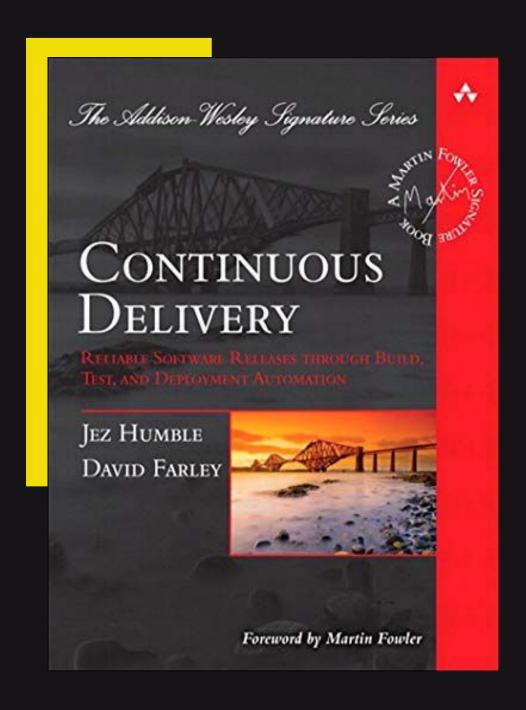




Fonte:

https://medium.com/mlearning-ai/trying-to-turn-machine-learning-into-valuede9f28cde056

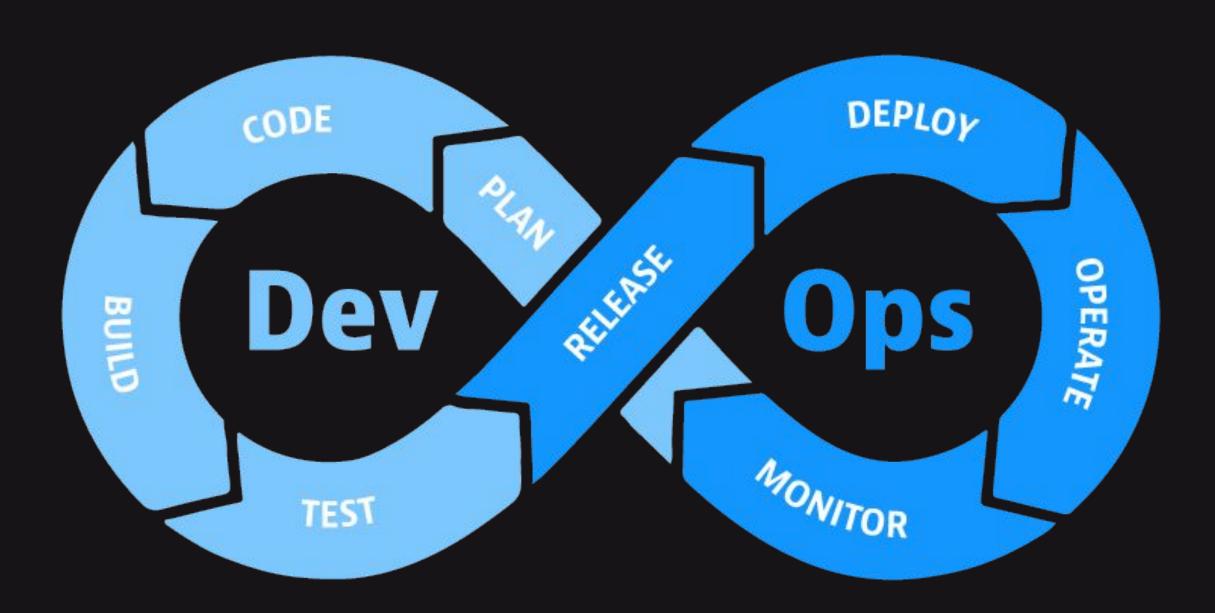
Continuous Delivery



Leitura:

https://www.amazon.com.br/Continuous-Delivery-Deployment-Automation-Addison -Wesley-ebook/dp/B003YMNVC0

DevOps



https://www.dynatrace.com/news/blog/what-is-devops/

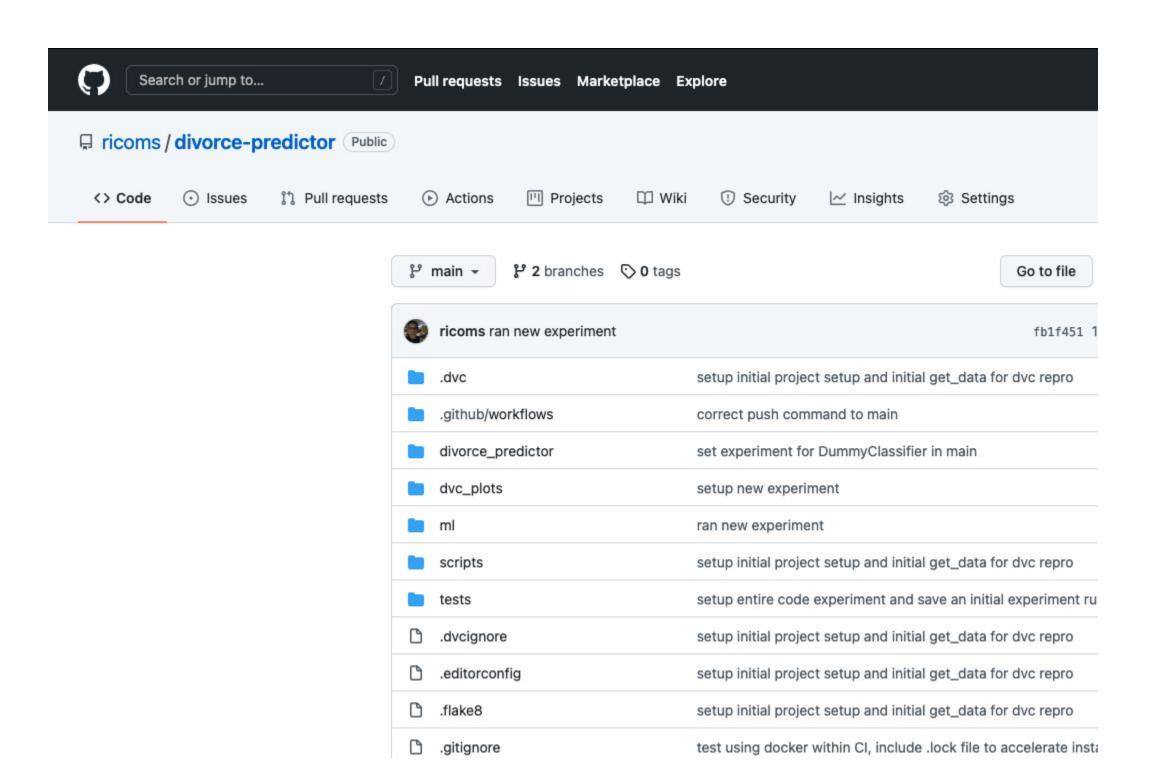
Plataformas de CI/CD



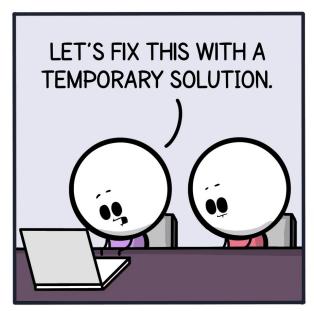


https://github.com/features/actions https://www.jenkins.io/

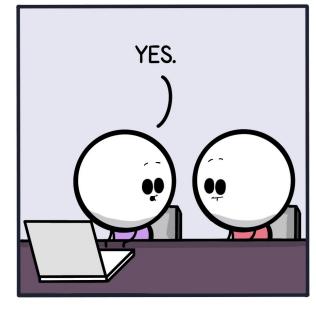
Vamos ao github

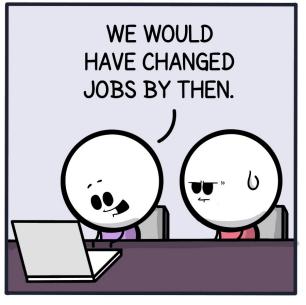


Design de Sistemas









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Work Chronicles workchronicles.com

https://martinfowler.com/bliki/DesignStaminaHypothesis.html

Resumo

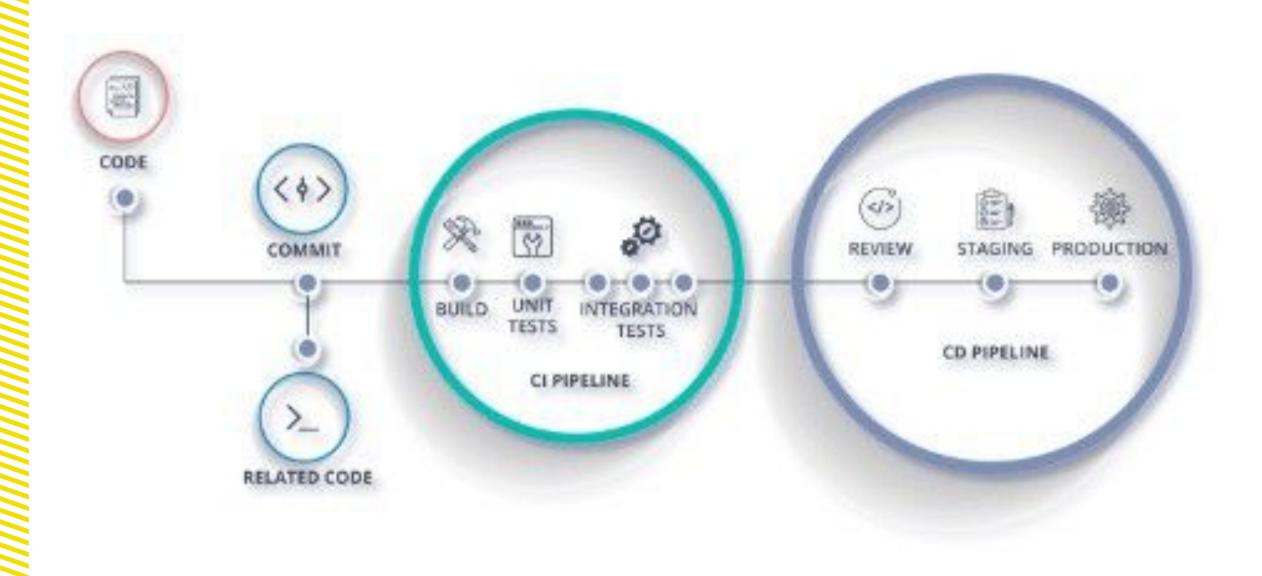
CI/CD, Continuous Delivery, DevOps, MLOps são uma sequência de metodologias e funções que procuram melhores formas de **entregar e garantir funcionalidade** de sistemas computacionais.



11 - Montando meu primeiro CI

Consultor: Ricardo Manhães Savii





Fonte:

https://medium.com/mlearning-ai/trying-to-turn-machine-learning-into-valuede9f28cde056

Github Actions

GitHub Actions Free, Pro, & Team ▼ English ▼

Q Search topics,

GitHub Actions

Automate, customize, and execute your software development workflows right in your repository with GitHub Actions. You can discover, create, and share actions to perform any job you'd like, including CI/CD, and combine actions in a completely customized workflow.





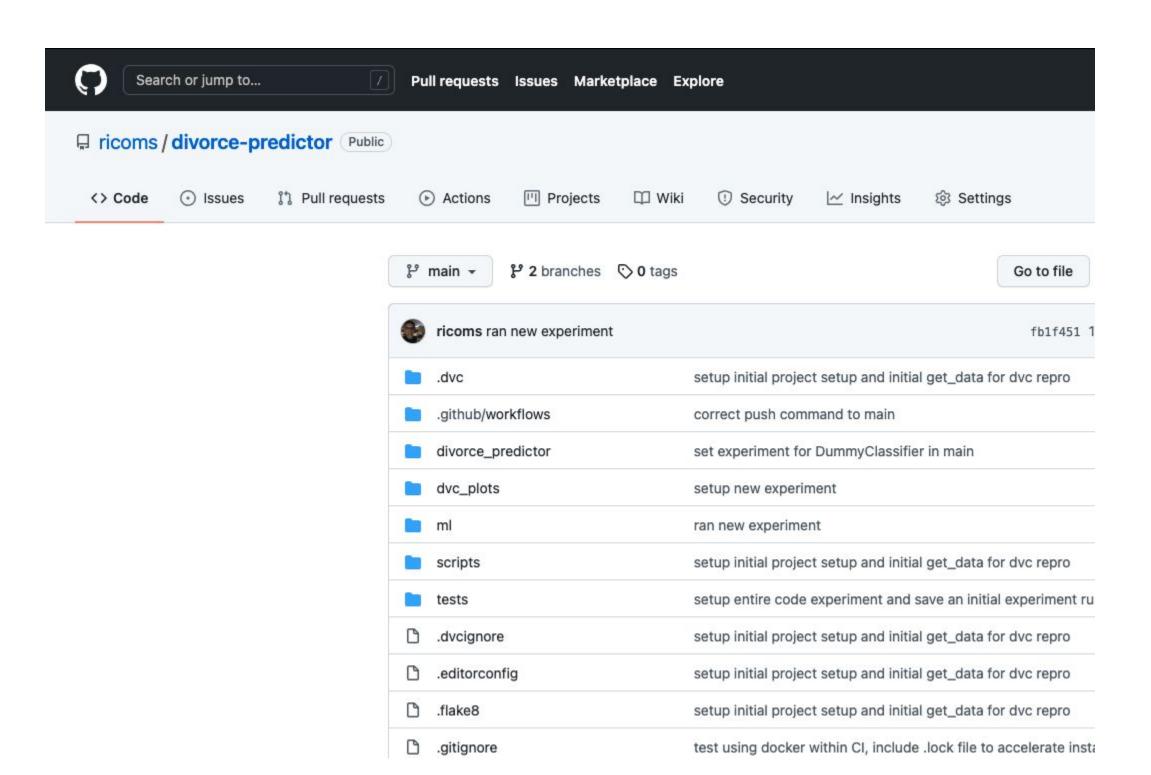
Guides View all → Popular What's new View all →

Learn GitHub Actions
Whether you are new to GitHub Actions or interested in learning all they have to offer, this guide will help you us...

Learn GitHub Actions
Learn GitHub Actions
Conditional execution of steps in actions

https://docs.github.com/en/actions

Vamos ao código



Resumo

Montar um CI (Continuous Integration) não é uma habilidade necessária para um Cientista de Dados.

Mas ter noções deste processo te ajudará a mostrar seu valor em empresas e equipes em que estiver.

https://www.facebook.com/1755502 734497840



13 - Resumo do Módulo

Consultor: Ricardo Manhães Savii

Replicabilidade

Terminology

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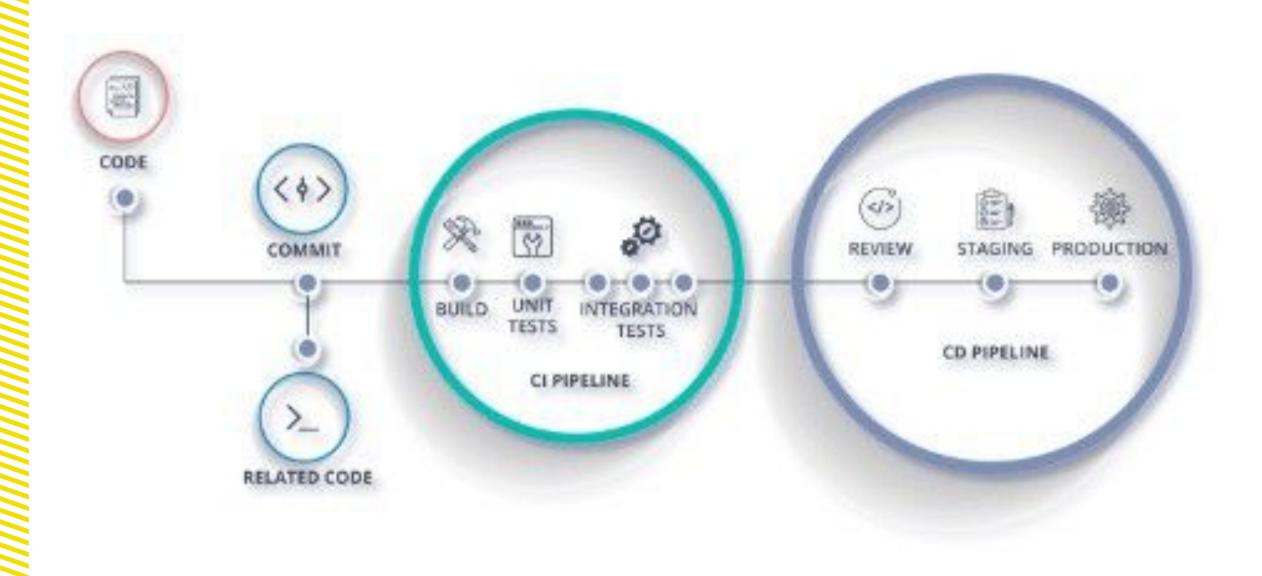
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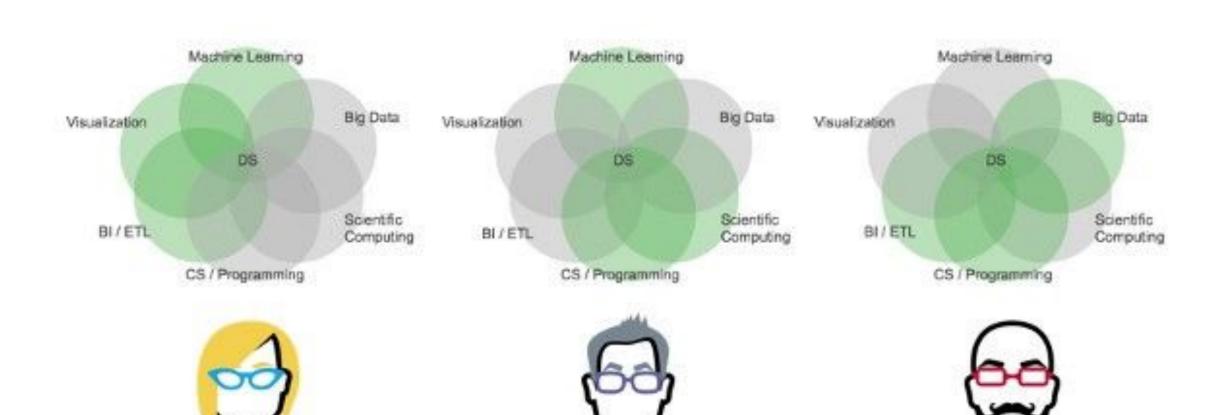




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Equipes e papéis



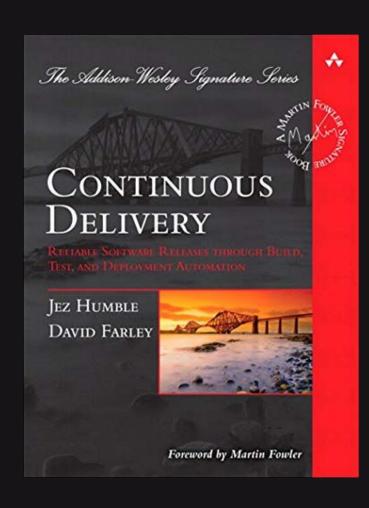
Research / Computational

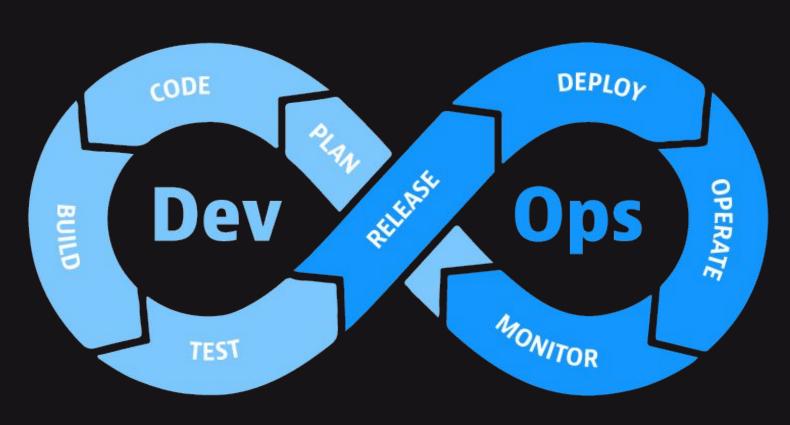
Scientist

Developer / Engineer

Statistician / Analyst

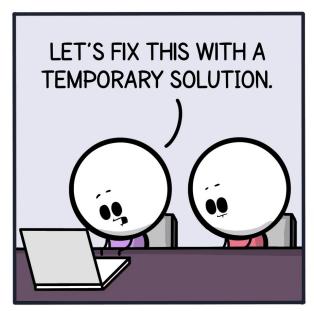
Continuous Delivery



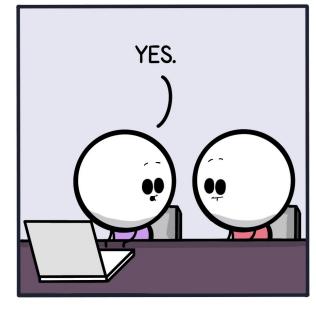


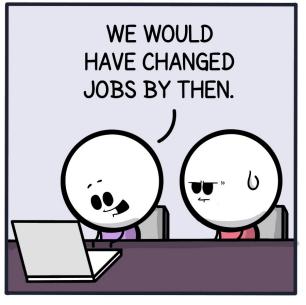
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Resumo

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FIM