

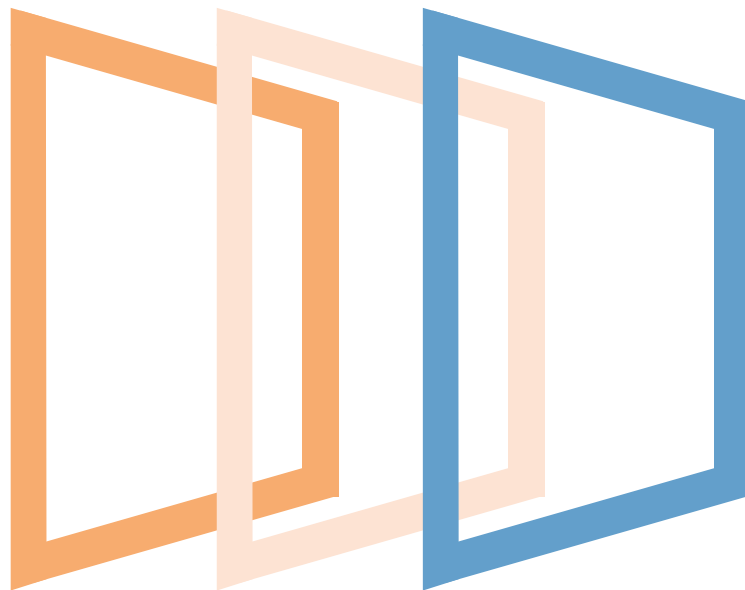
Desvendando IA e Machine Learning

Thaís Ratis

Diego Alexandre

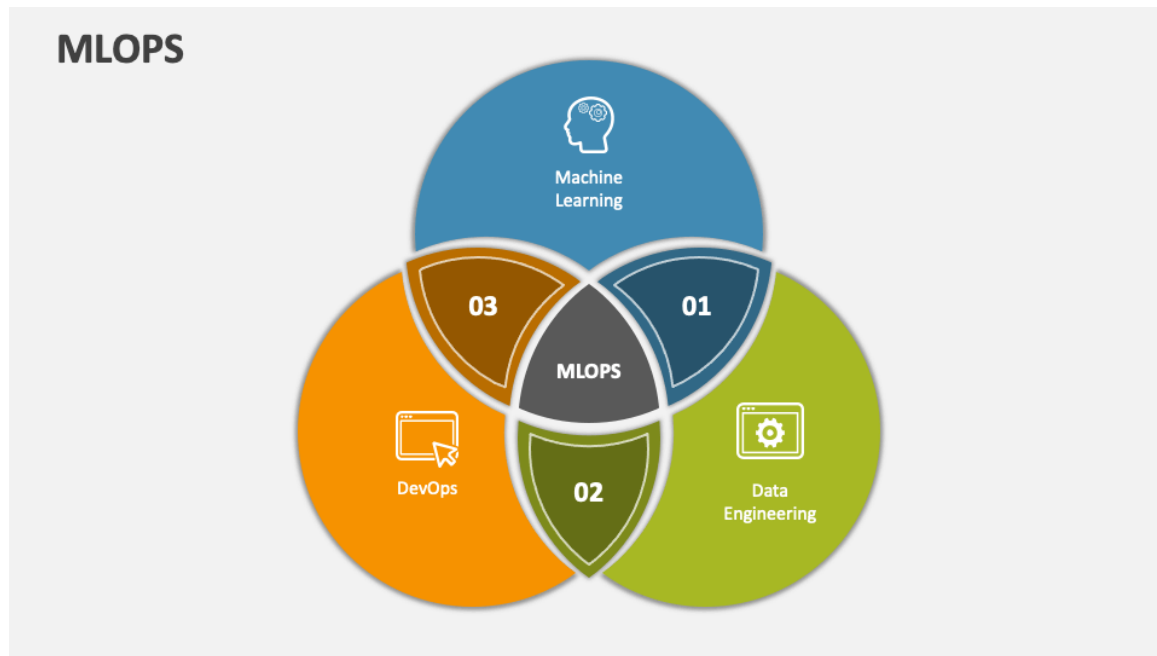
Práticas Tecnológicas, 07.11.2023

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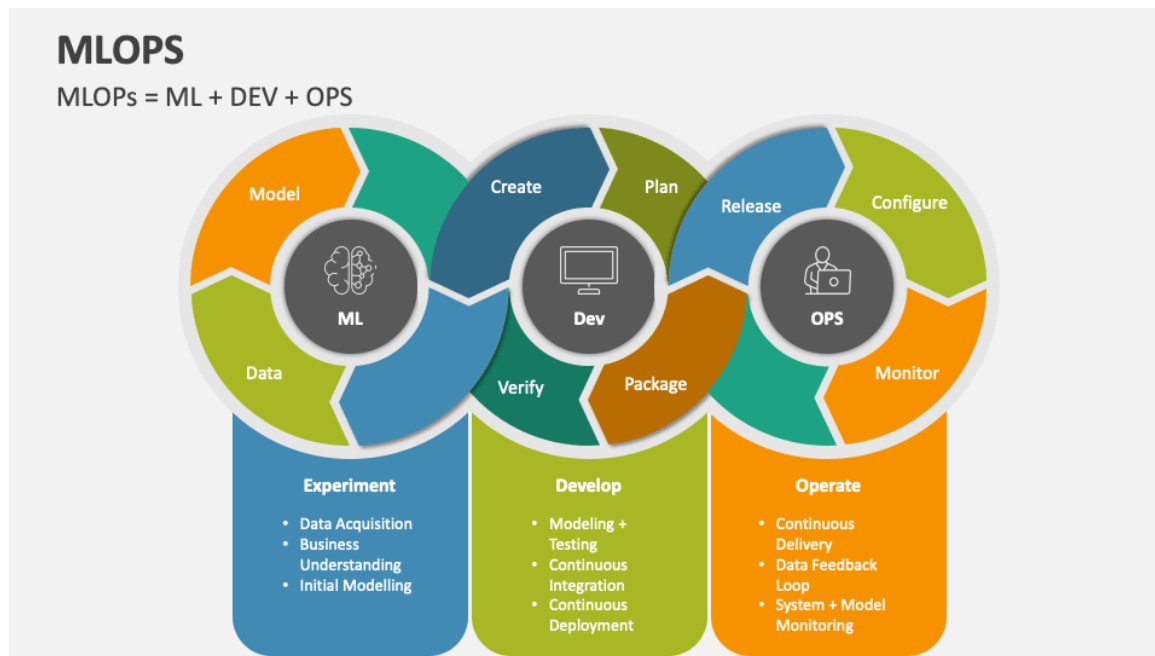
An Indra company

MLOps



O que é MLOps

O MLOps é a prática de combinar desenvolvimento de software e operações para implementar, gerenciar e evoluir modelos de aprendizado de máquina de forma eficiente.



Benefícios do MLOps

1. Melhoria de Performance

- Otimização contínua dos modelos para obter resultados cada vez melhores.

2. Escalabilidade

- Possibilidade de lidar com grandes volumes de dados e modelos complexos.

3. Confiabilidade

- Análise, monitoramento e alertas para evitar falhas e garantir a estabilidade dos modelos.

MLOps



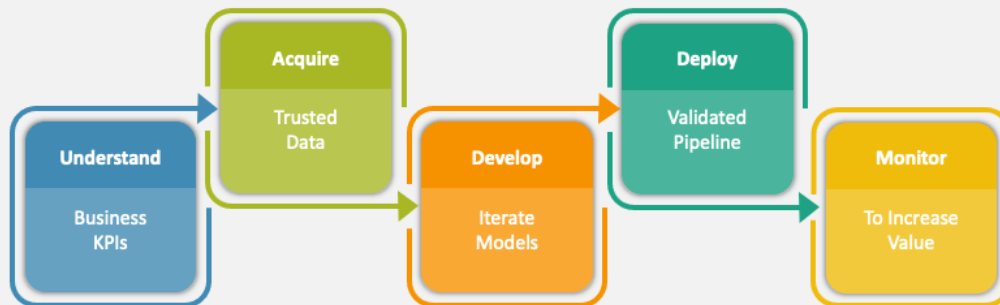
Melhores práticas para a implementação do MLOps

- Padronização
 - Estabeleça diretrizes claras para o desenvolvimento, treinamento e implantação de modelos.
- Monitoramento Contínuo
 - Acompanhe o desempenho dos modelos e faça melhorias regulares.
- Documentação
 - Registre todas as etapas do processo para facilitar a manutenção e a colaboração.

MLOps

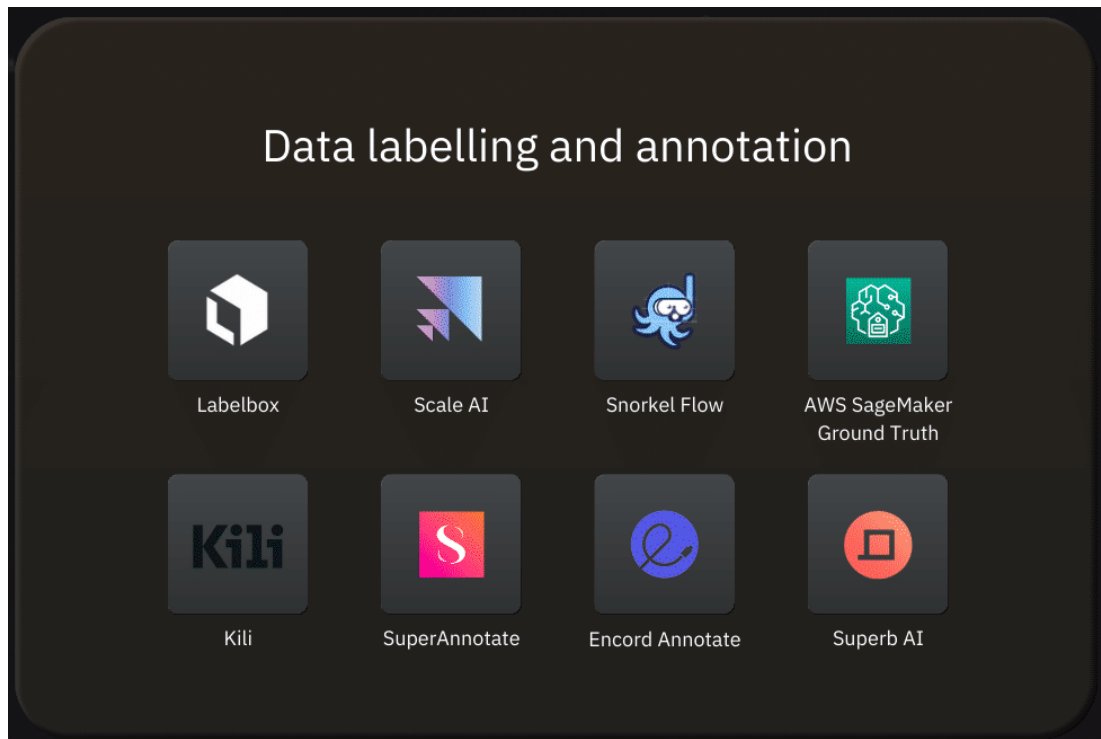
MLOPS

The Framework

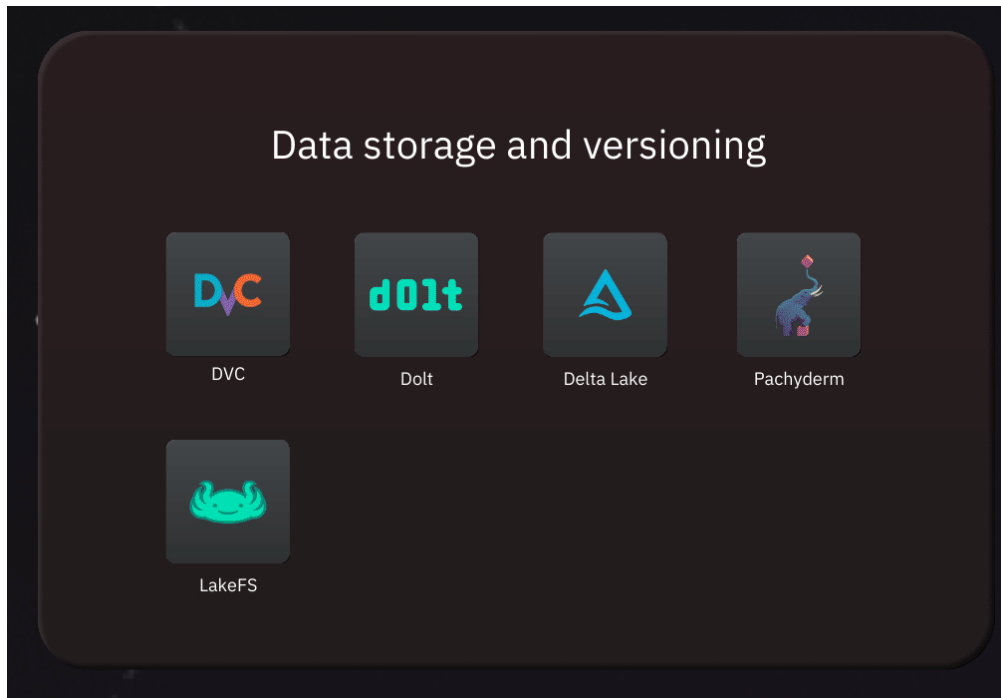


Source : Informatics

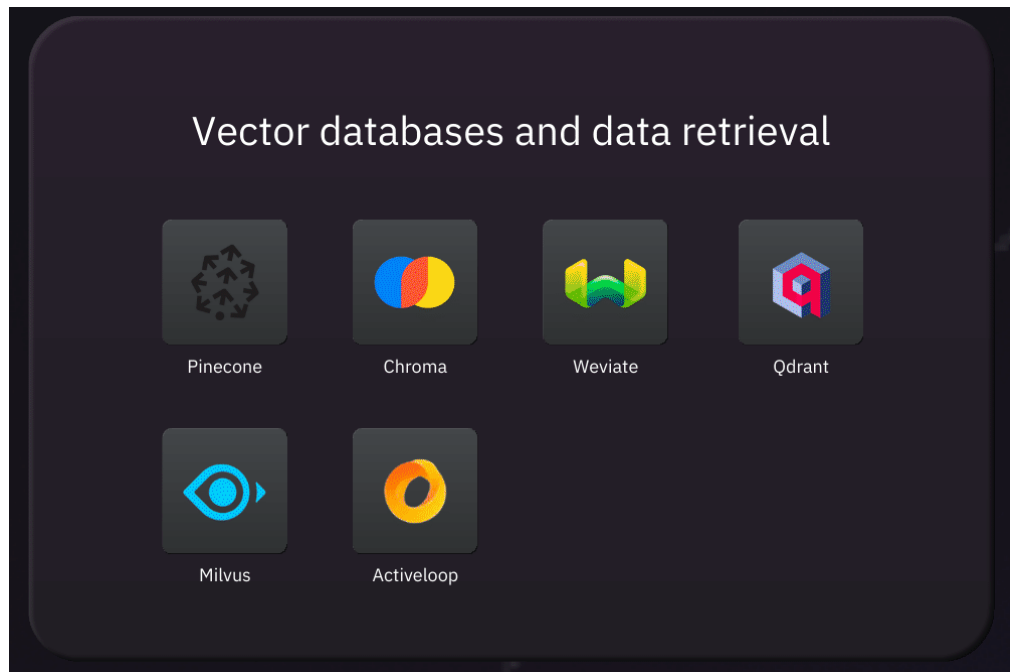
Ferramentas de MLOps



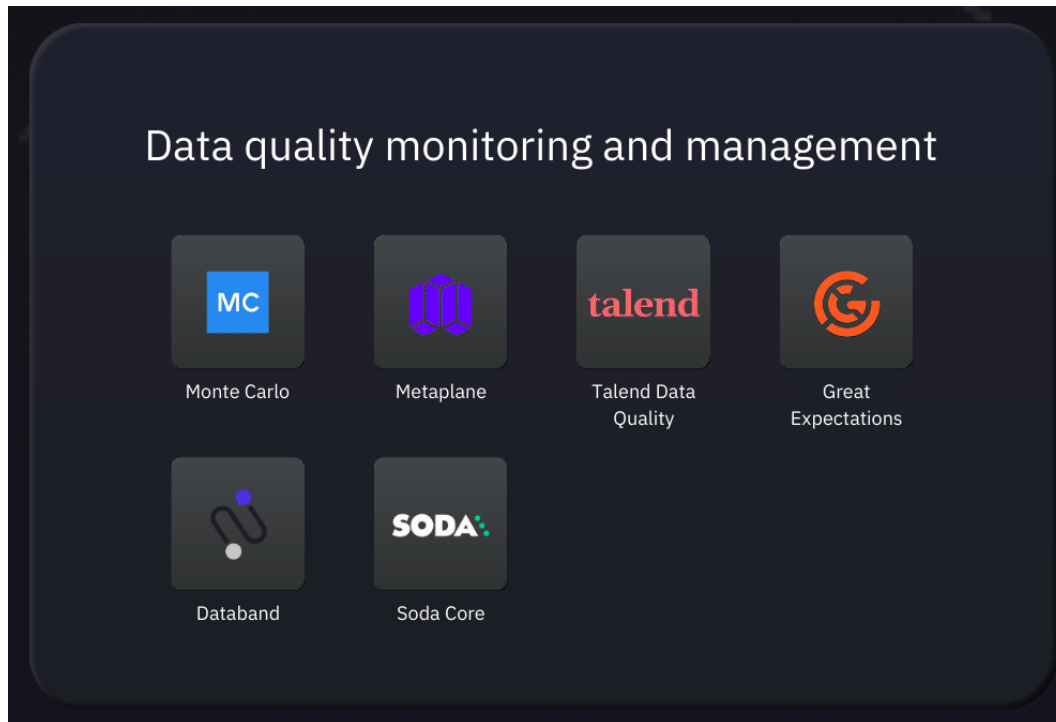
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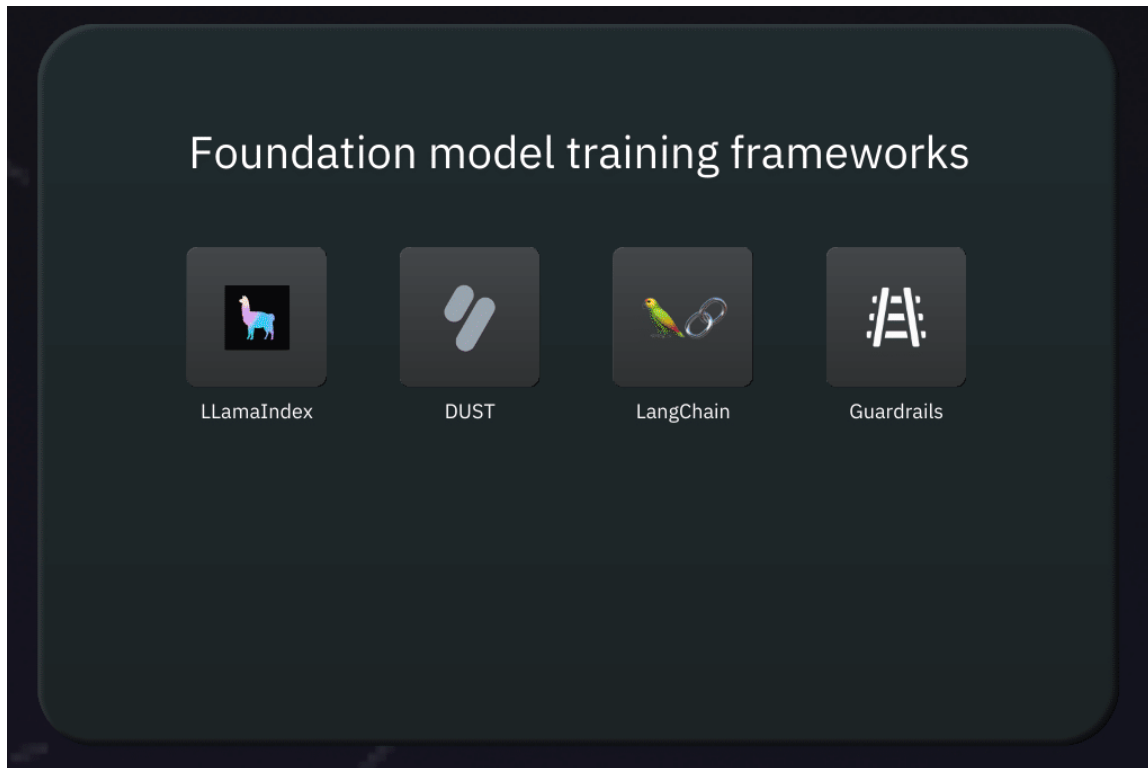
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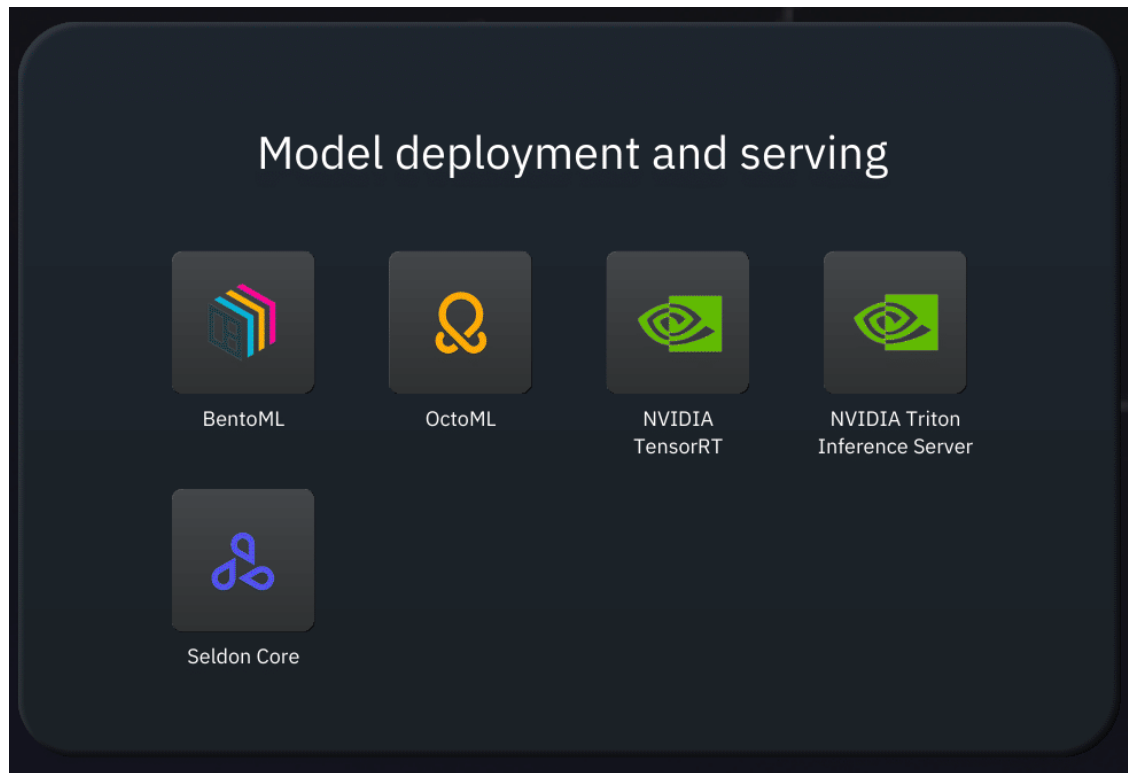
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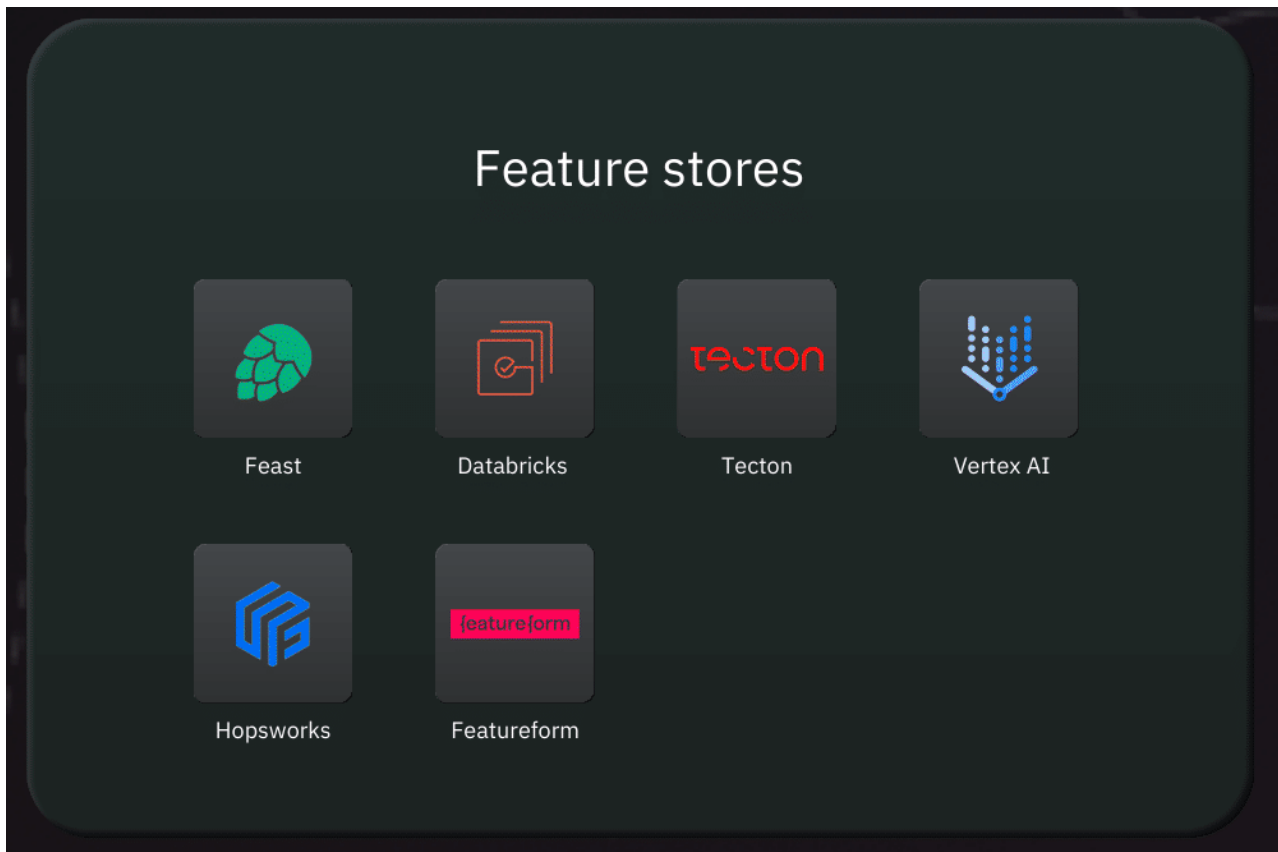
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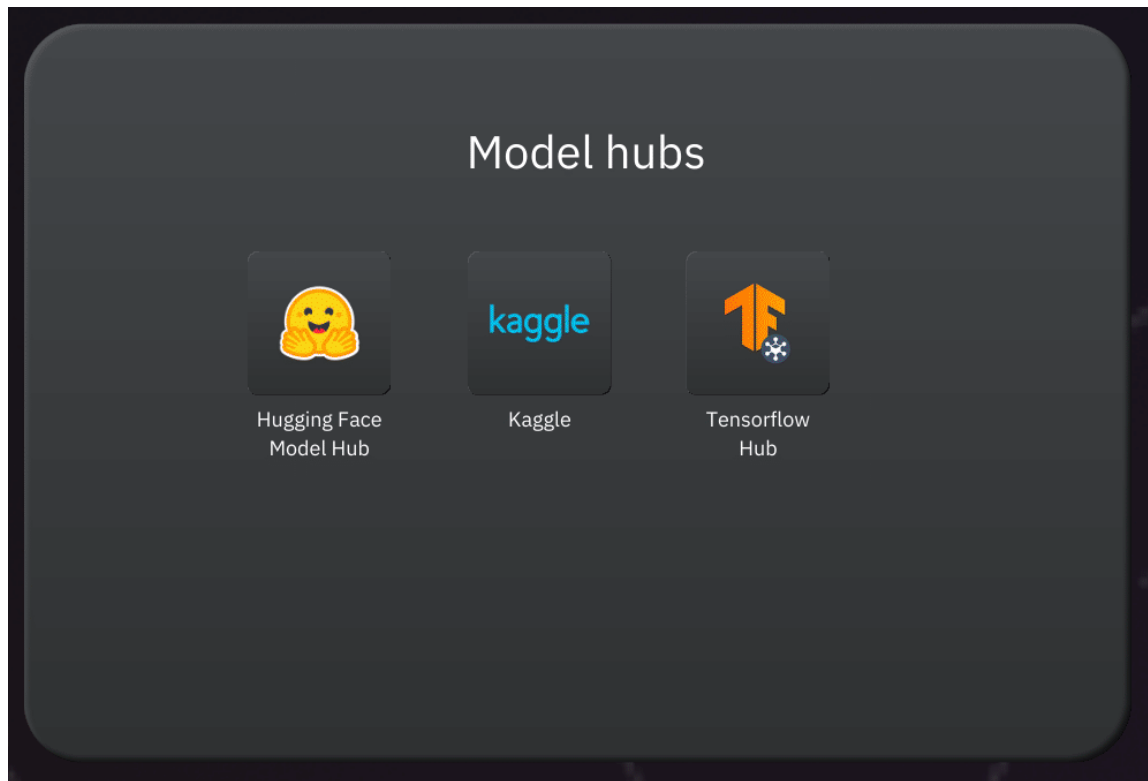
Ferramentas de MLOps



Ferramentas de MLOps



Ferramentas de MLOps



Ferramentas de MLOps

Experiment tracking, metadata storage
and management



AimStack



neptune.ai

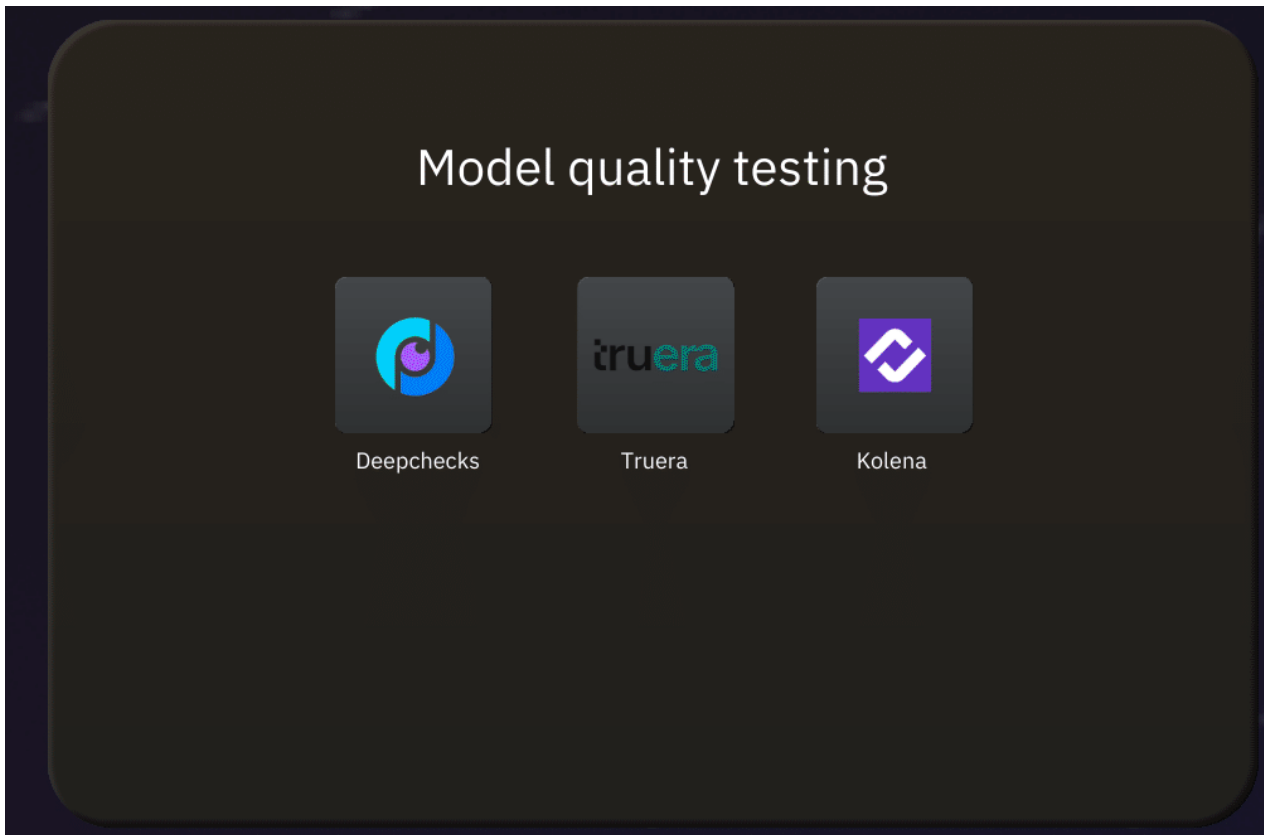


MLflow



Comet ML

Ferramentas de MLOps



Ferramentas de MLOps

Workflow orchestration and pipelining tools



ZenML



Kedro



Flyte

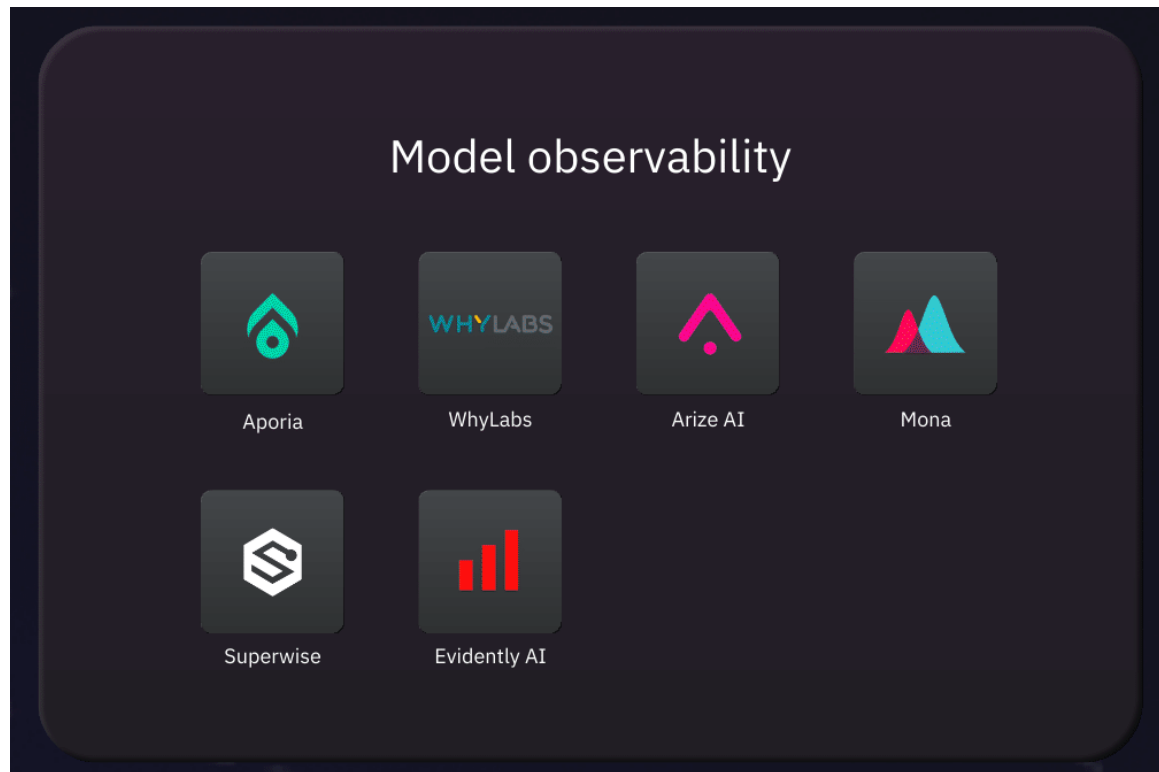


Prefect

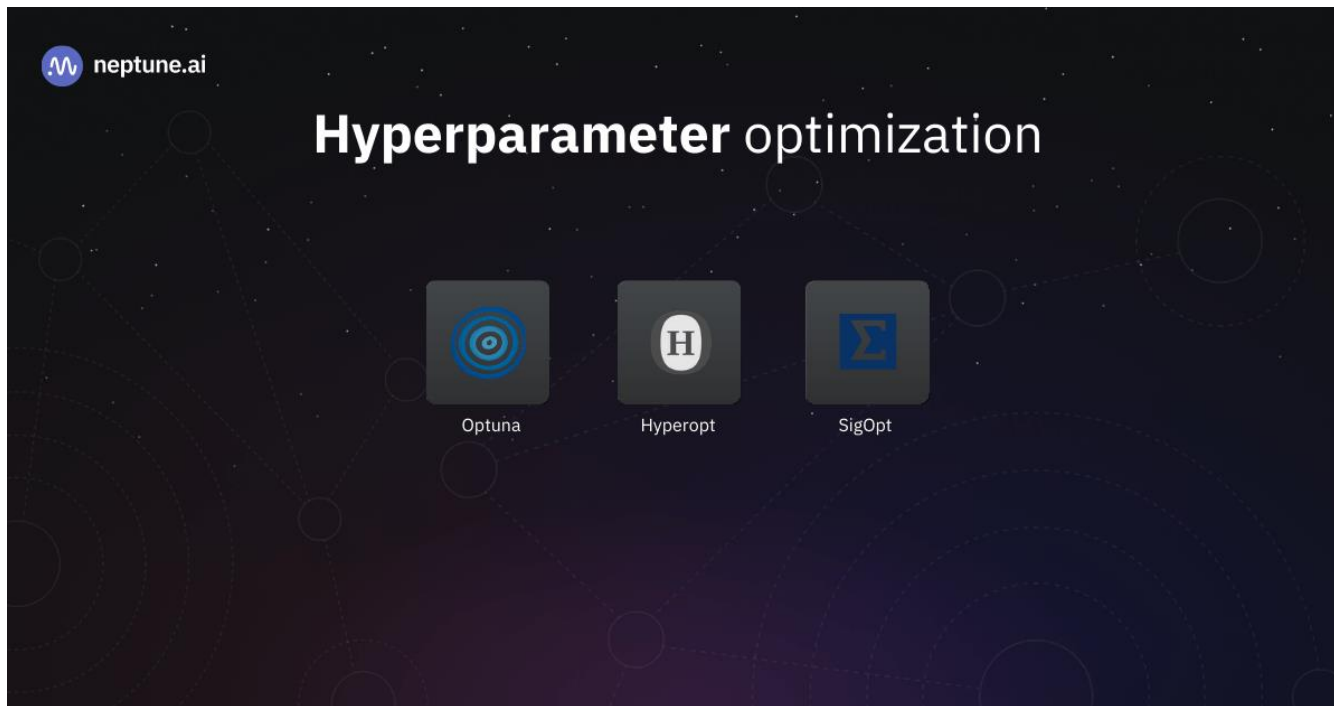


Mage AI

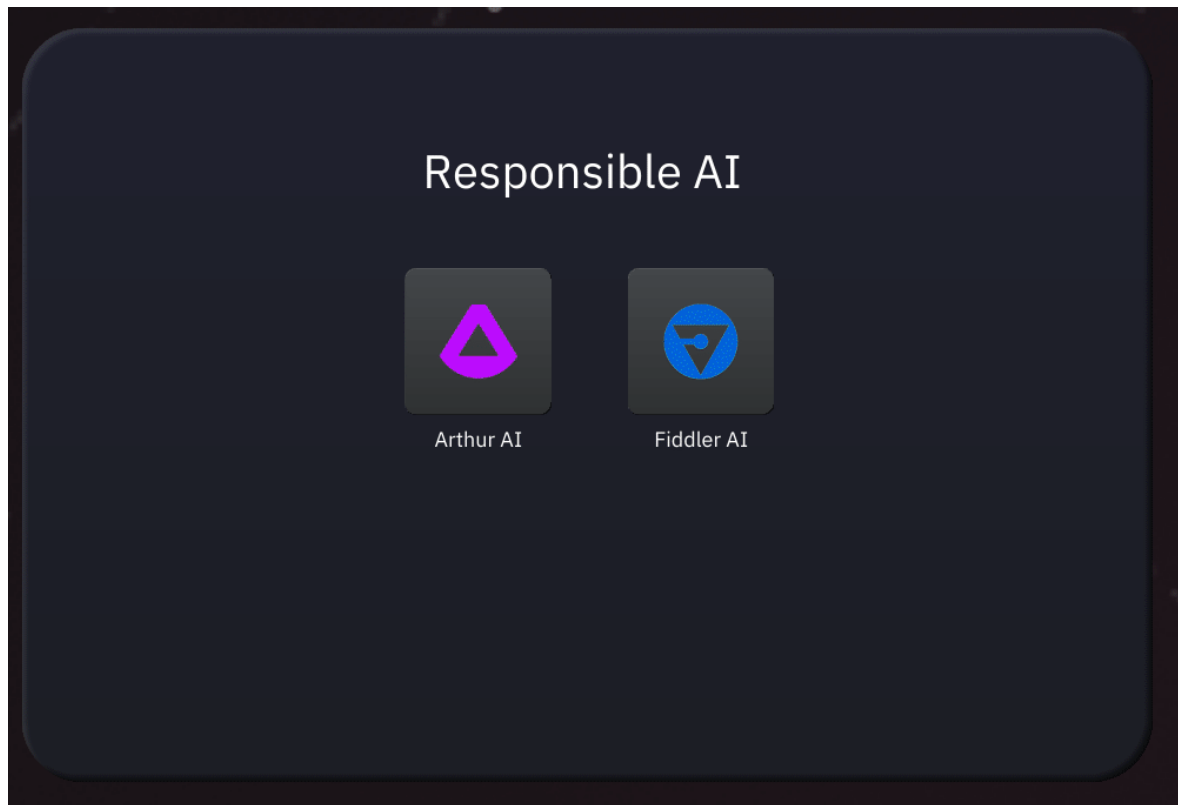
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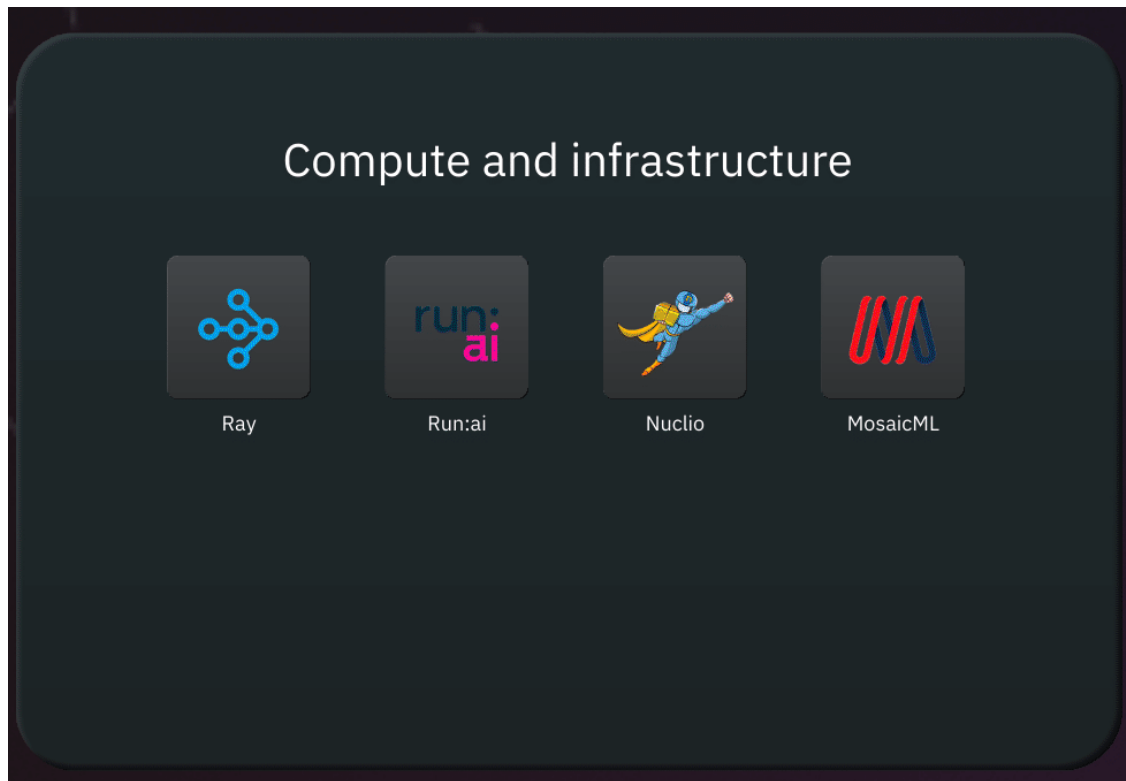
Ferramentas de MLOps



Ferramentas de MLOps



Ferramentas de MLOps



Ferramentas de MLOps

GPU Cloud Servers and Serverless GPUs



Paperspace



Baseten



Lambda

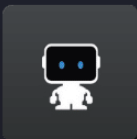


Modal

Ferramentas de MLOps

End-to-end MLOps platforms

Closed-source



DataRobot



Azure ML



Databricks



Domino



Amazon
SageMaker



Vertex AI



Weights &
Biases



Valohai



Qwak



TrueFoundry

Open-source



Metaflow

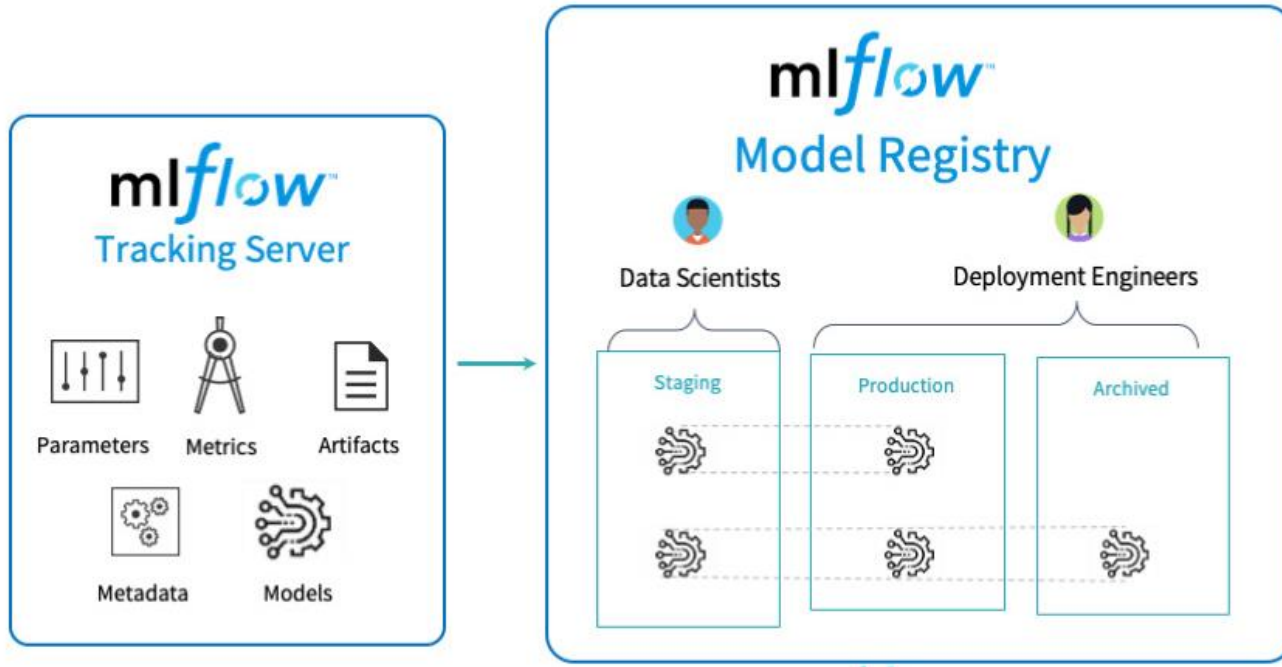


Kubeflow

MLFlow

O MLflow é uma ferramenta desenvolvida para auxiliar no desenvolvimento e implantação de projetos de Machine Learning. Ele permite a organização, rastreamento e gerenciamento eficiente do ciclo de vida de modelos de ML.

MLFlow



MLFlow componentes



TRACKING

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



PROJECTS

Package data science code in a format that enables reproducible runs on many platforms



MODEL REGISTRY

Store, annotate, and manage models in a central repository



MODELS

Deploy machine learning models in diverse serving environments

MLFlow componentes

O MLflow é composto por quatro componentes principais: Tracking, Model Registry, Models e Projects. O Tracking permite o rastreamento de experimentos e a reprodução de resultados. O Model Registry oferece recursos para o gerenciamento de modelos treinados. Já o Models dá as ferramentas tanto para fazer deploy local quanto conectar com outras ferramentas de deploy. Enquanto que o Projects facilita o empacotamento de código, dependências e artefatos de modelos em um formato padronizado.

Tracking

Experiments

☐ Default☒ nbexperimento**nbexperimento**[Provide Feedback](#)[Share](#)

Experiment ID: 942392586230131708 Artifact Location: file:///c:/Users/

[Description Edit](#)

Time created ▾

State: Active ▾

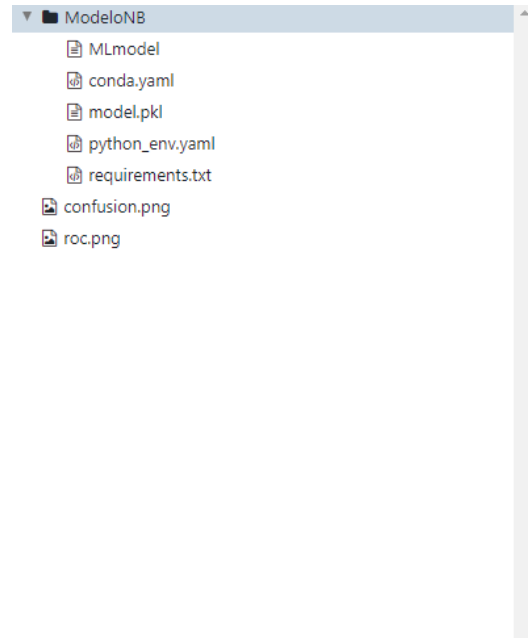
Sort: recall ▾

Columns ▾

[+ New run](#)Table Chart Evaluation **Experimental**

								Metrics		
<input type="checkbox"/>		Run Name	Created	Dataset	Duration	Source	Models	accuracy	auc	f1
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<input type="checkbox"/>		fun-owl-740	2 months ago	-	24.0s	c:\Users\...	sklearn	0.69666666...	0.66000000...	0.7
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<input type="checkbox"/>		blushing-robin-634	2 months ago	-	1.6s	c:\Users\...	-	0.69666666...	0.66000000...	0.7
<input type="checkbox"/>		luminous-colt-863	2 months ago	-	36.4s	c:\Users\...	sklearn	0.69666666...	0.66000000...	0.7
<input type="checkbox"/>		victorious-grub-863	2 months ago	-	0.9s	c:\Users\...	-	0.69666666...	0.66000000...	0.7

Projects



Model Registry

Registered Models

Filter registered models by name or tags ⓘ Q

Name ⌵⌴	Latest version	Aliased versions	Created by	Last modified	Tags
Sklearn1	Version 1			2023-11-06 14:32:27	—

MLOps



Referências

- <https://neptune.ai/blog/mlops-tools-platforms-landscape>
- <https://mlflow.org/docs/latest/>
- [Course: MLOps: Implantação e Operação de Modelos de Machine Learning | Udemý Business](#)
- <https://www.activestate.com/wp-content/uploads/2018/10/webinar-slides-mlops.pdf>
- <https://drive.google.com/file/d/11sbsEWOYID5wlpU58CA6VSwKLAfB69xl/view>
- <https://www.collidu.com/presentation-mlops>

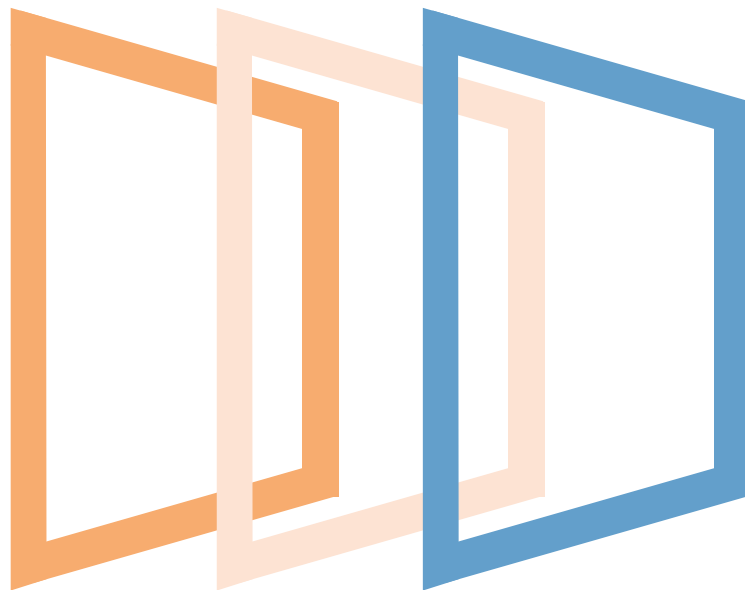
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