A 3D-rendered puzzle with white pieces. In the center, there is a dark, irregular, ink-blot-like shape. Inside this dark shape is a single red puzzle piece. The text "Model deployment" is written in white, sans-serif font across the red piece and the dark shape. A thin white horizontal line runs across the bottom of the dark shape.

Model
deployment

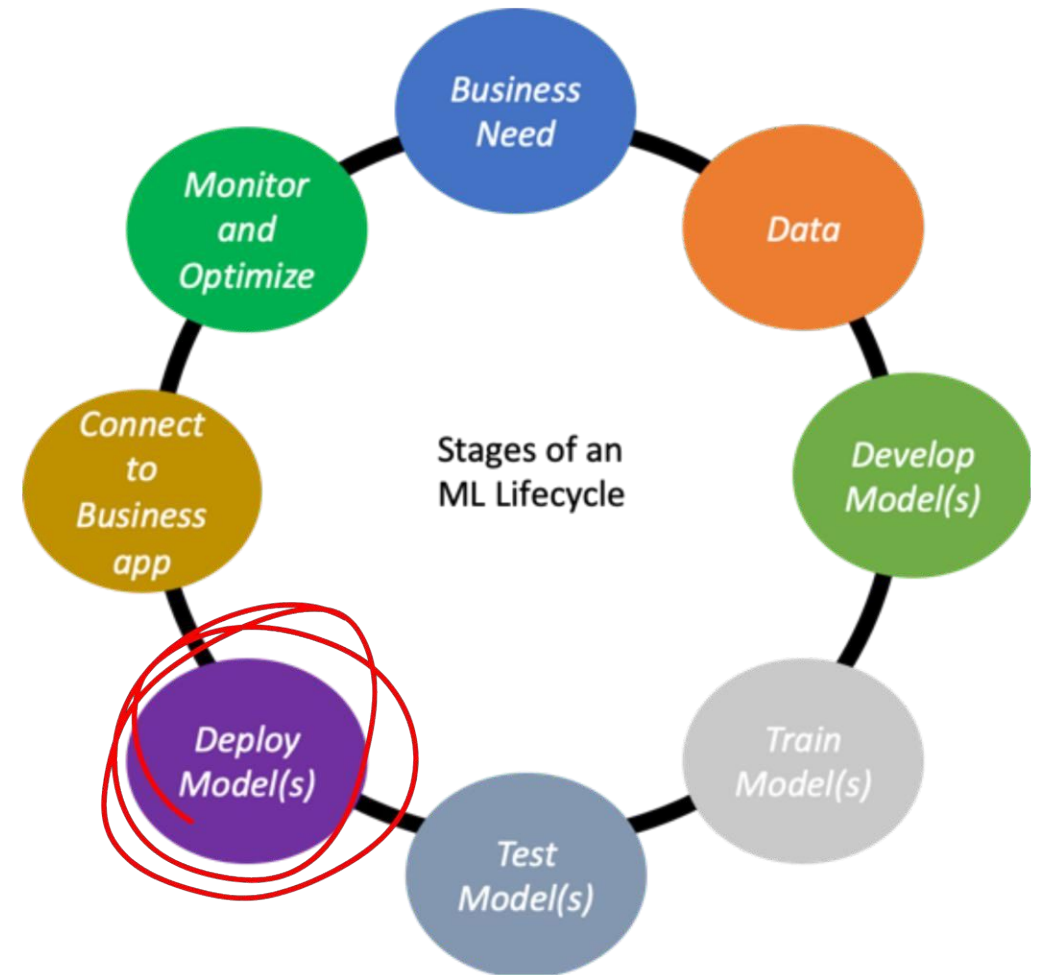
Content

- What is model deployment
- Why model deployment
- Train the model and save it
- Why flask
- Why Heroku
- Creating a web app
- Commit code into GitHub
- Link GitHub to Heroku



What is model deployment?

- One of the last stages in the ML life cycle.
- Integrating ML models into an existing production environment
- It should be available to the end users.
- Or to make business decisions based on data.



Why it is important?

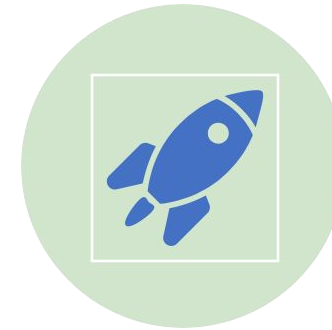
"No machine learning model is valuable, unless it's deployed to production." – Luigi Patrino



TO MAKE MOST
VALUE OUT OF ML
MODELS



LOT OF
CHALLENGES



FUTURE-PRO
OF

Things to consider

Input data and output data: Data storage, Data pre- processing pipeline, Input data stream, Output data stream

Frequency and urgency

Batch or real-time predictions

Latency: how fast output should be

Privacy: User privacy

Computing costs

Frameworks and tooling



Frameworks

Tensorflow
Pytorch
Scikit-learn



Programming languages

Python
R
jav a



Cloud environment

AWS
GCP
Azure



How to choose the best one?

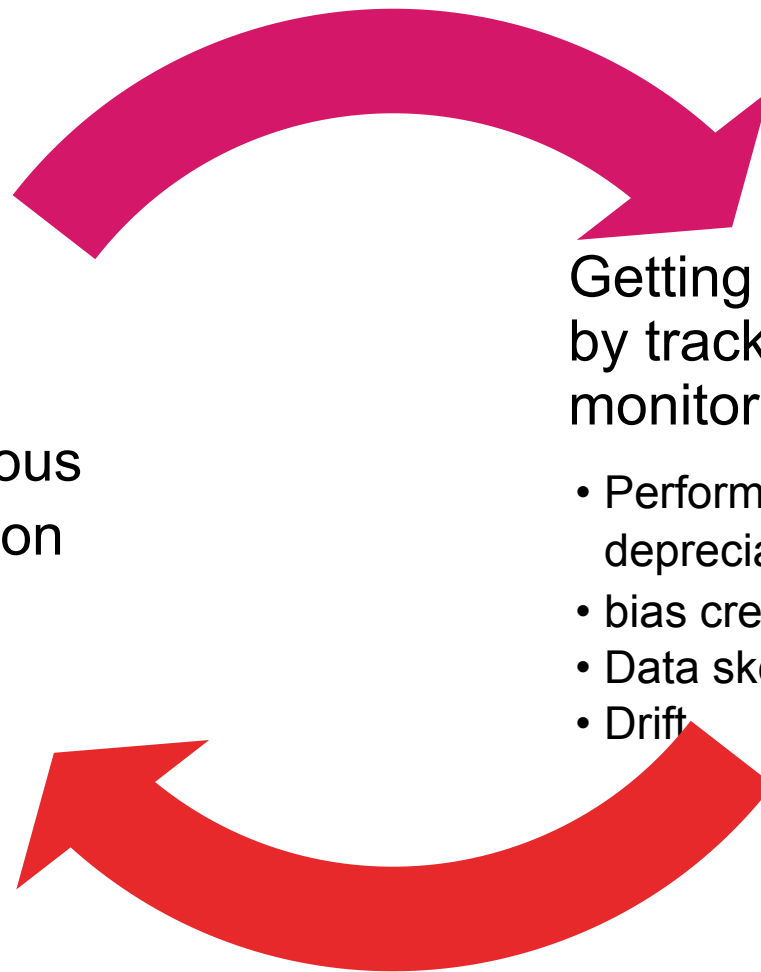
Efficiency
Popularity
Support

Feedback and iteration

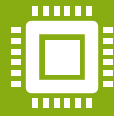
Continuous
integration

Getting feedback
by tracking and
monitoring

- Performance depreciation/decay
- bias creep
- Data skew
- Drift



Things to consider while building models



Portability: Is the ability of software to be transferred from one machine or system to another.



Scalability: Is the ability of a program to scale.



Operationalization: Refers to the deployment of models to be consumed by business applications.



Test: Refers to the validation of output to processes and input.

System Architecture

- Architecture can be defined as the way software components are arranged and the interactions between them.
 - Modularity
 - Reproducibility
 - Scalability
 - Extensibility
 - Testing

High-Level Architecture of an ML System



Data Layer: Access to all the data sources.



Feature Layer: Generating feature data. Which should be transparent, reusable and scalable



Scoring Layer: the scoring layer transforms features into predictions.



Evaluation Layer: Monitor and compare how closely the training predictions match the predictions on live traffic.

Different methods to deploy

- Train

- Batch: Ad-hoc training
- Real-time: Learning on fly
 - Data doesn't fit into memory
 - If data distribution drift over time
 - Data is a function of time

- Serve

- Batch
- Realtime

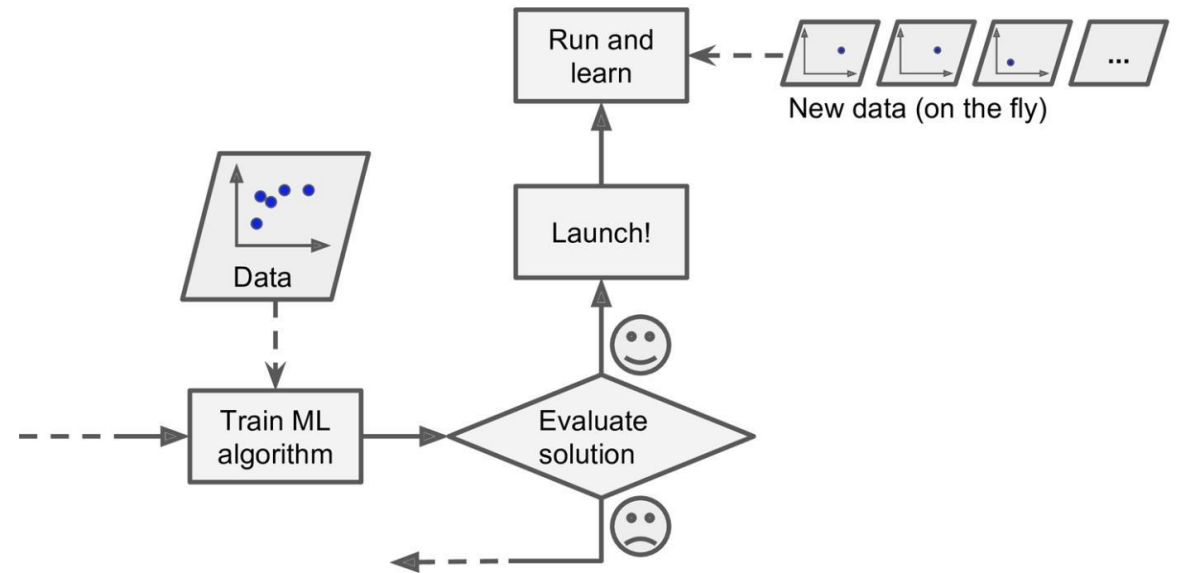


Figure 1-13. Online learning

*Ask your
questions?*





*Train the model
and save it*

Flask

- API-first approach
- It is a framework that allows you to build web applications.
- Other frameworks like Django, Falcon, Hug and many more.
- For R, we have a package called plumber.
- Pip install flask

Steps

- Function to load the saved model
- Create root path
- Create a route path to predict the class
- Return the result

Ask your questions?



Heroku

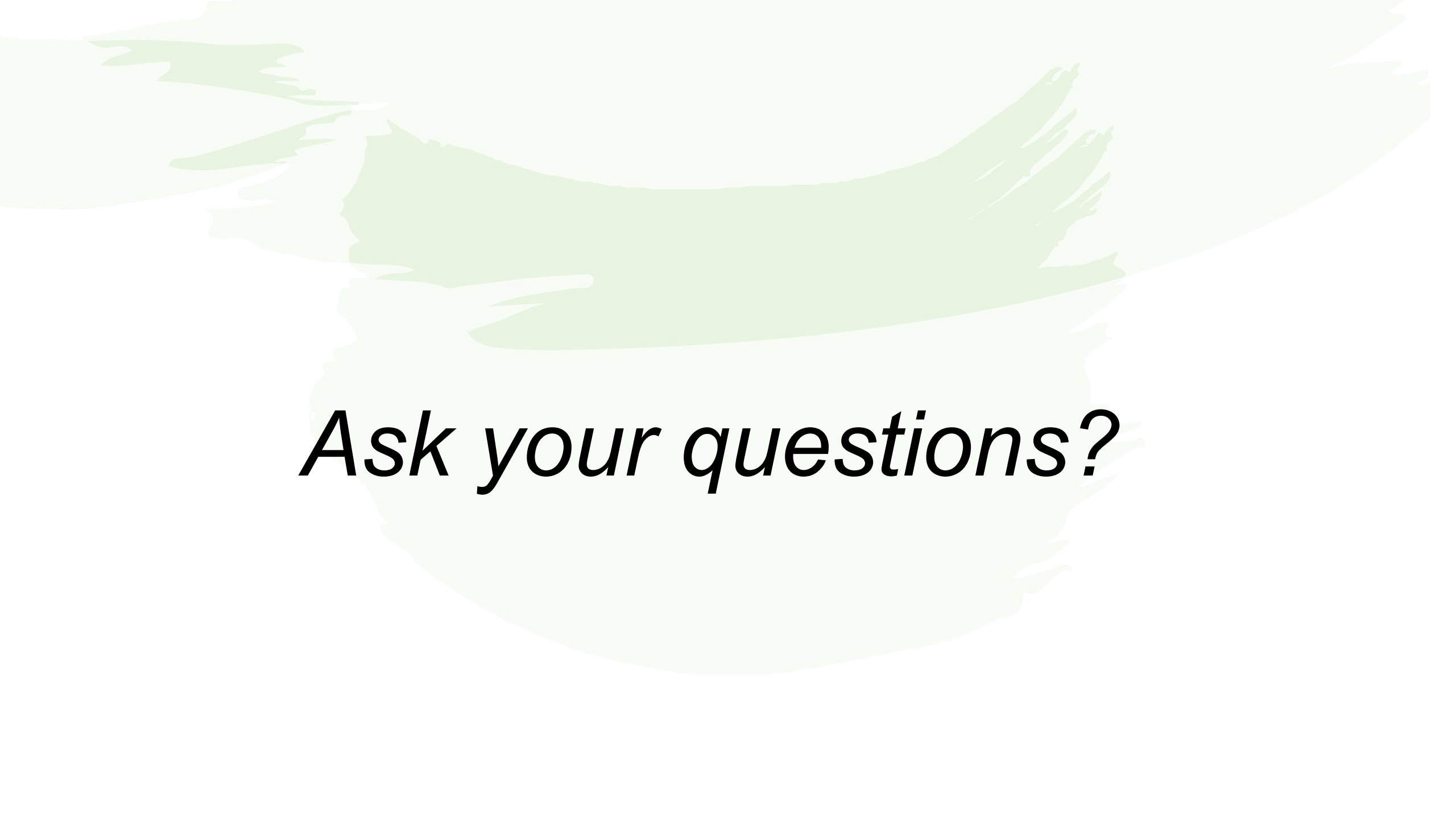
- Heroku is a platform as a service (PaaS) that enables the deployment of web apps based on a managed container system, with integrated data services and a powerful ecosystem.

Steps

- Create Procfile
- Create requirements.txt
- 2 ways to deploy
 - From UI
 - Commit Files to GitHub
 - Deploying With Github on heroku
 - With CLI

With CLI

- heroku login
- heroku create appname
- git init
- git add .
- git commit -m 'commit'
- git push heroku master
- heroku open

The background of the slide features several broad, horizontal brushstrokes in a light green color, creating a textured, artistic effect. The strokes vary in opacity and thickness, with some appearing more saturated than others.

Ask your questions?

Slide Download Link

You can download the slides from the below link:

https://docs.google.com/presentation/d/12niH7HnkhC5OpdgO3kl-kR--ziizbw_p7Bv2FGZwDe8/edit?usp=sharing

Thank you

