# **Machine Learning Systems Design**

LolFFate

Milestone 3

## **Context**

- League of Legends (LoL) is one of the most popular video games in the world.
- It is:
  - o a **5v5 multiplayer** game;
  - which mixes strategy and skills;
  - o and is known for causing lots of **frustration**.
- Players can **ForFeit (FF)** after **15 min** of gameplay
- Problem:
  - Players waste time in unwinnable games, with no early-game performance insight. They wonder if their match is worth continuing, or how to improve it.





source: https://wiki.leagueoflegends.com/en-us/

### Idea

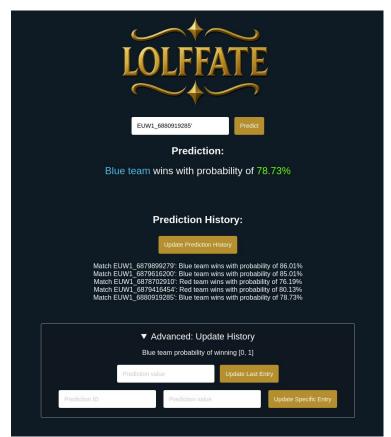
- A web dashboard which could predict their probability or winning after 15 minutes.
- Improves decision-making for the players:
  - They can have a clearer view by seeing which factors matter most (like gold, or objectives);
  - They can quickly spot their strengths and weaknesses.
- Potentially reduces frustration.





## **Our solution: LolFFate**

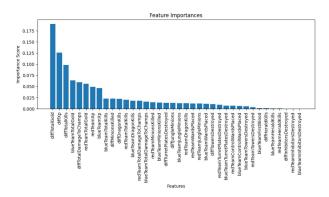
- FFate is a platform allowing LoL players to predict their probability of winning or losing their current game.
- The predictions are made thanks to an ML model and are served through Flask and Streamlit applications.
- As of now, our app has 2 versions:
  - The **online** version on **Google Cloud**;
  - The local version for the player's machine.



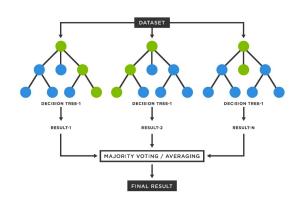
## The Model

- ML model used: Random Forest Classifier.
- It is trained using **Log-Loss** as test metric.

Regarding explanation of the results:



Random Forest feature importances





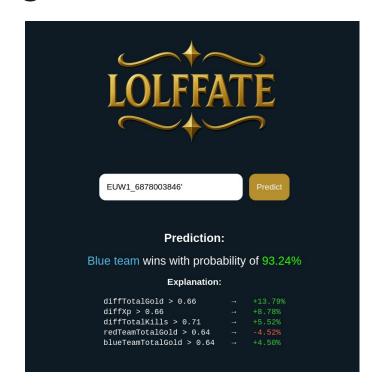
LIME explainer

## **Architectures for Model Serving**

- A Flask application serves our model.
- The Flask web platform provides different functionalities to the users:
  - Get the prediction probability of a game by inputting a game ID;
  - See the explanations on the features relevance in the prediction for a better understanding of it.

#### Scan to see it!





## **Architectures for Model Serving**

#### Scan to see it!





#### **Predictions**

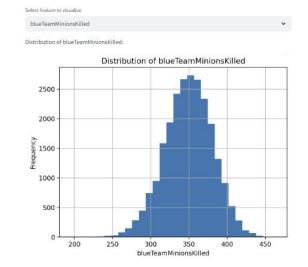


- A Streamlit app also serves our model!
- Same functionality as the flask app for the prediction part.
- ... but it also has data visualization for the dataset.

#### **Processed Data Statistics**

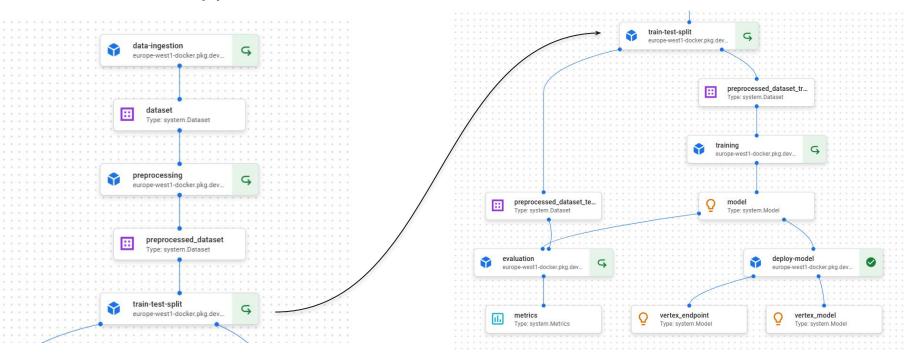
|       | blueTeamControlWardsPlaced | blueTeamWardsPlaced | blueTeamTotalKills | blueTeamDragonKills | blue |
|-------|----------------------------|---------------------|--------------------|---------------------|------|
| count | 24218                      | 24218               | 24218              | 24218               |      |
| mean  | 3,6104                     | 41.3643             | 12.7909            | 0.7379              |      |
| std   | 2.0183                     | 43.4773             | 4.9092             | 0.7221              |      |
| min   | 0                          | 9                   | 0                  | 0                   |      |
| 25%   | 2                          | 25                  | 9                  | 0                   |      |
| 50%   | 3                          | 29                  | 12                 | 1                   |      |
| 75%   | 5                          | 35                  | 16                 | 1                   |      |
| max   | 37                         | 603                 | 38                 | 2                   |      |

#### **Feature Distribution**



## **Model Pipeline**

• Vertex Al pipeline to build our model:



## **Model Deployment**

- Both the **Flask** and **Streamlit application** are available on **Google Cloud Run** 
  - They can therefore be accessed remotely
    Flask App → <a href="https://flask-app-30182159501.europe-west1.run.app/">https://flask-app-30182159501.europe-west1.run.app/</a>
    Streamlit App → <a href="https://streamlit-app-30182159501.europe-west1.run.app/">https://streamlit-app-30182159501.europe-west1.run.app/</a>
- The **online** version of our app makes predictions on **existing matches** from the training dataset.
  - For example, try entering the match ID EUW1 6880890229'
- The latest Flask application is automatically re-deployed on Google Cloud when a pull request on the main branch is merged thanks to the GitHub CICD.

### **Riot Web API**

- Riot Games provides two APIs for LoL
  - Web API
  - Client API (local)
- The Web API features:
  - Player info
  - Match history
  - Game statistics
  - o Timeline...
- The **API key** 
  - Only lasts 24h,
  - o is Rate-limited.
- **Permanent access** to the API requires
  - Production key,
  - Manual validation from Riot Games through a formal application process.



### Client API & Local Version

- The Client API features:
  - Information about local live game.
- We built a **local version** of our application
  - Uses Client API.
  - Makes outcome predictions on the ongoing match launched on the player's machine.
- Demo



# **Machine Learning Systems Design**

LolFFate

Thank you for listening!

## Milestone 1: Feedback consideration

- Available on GitHub in <u>Documentation/Milestone2</u>
- **Experimentation** review
  - Further **explanations** for our motivations:
    - Addressing features **relevance** & **selection**;
    - Addressing our model evaluation.
- Use case review
  - Better **definition** of our product value:
    - Prediction of the winning probability;
    - Proposition of an online dashboard;
    - Allows an improved decision making.