

Agenda

- Problem Statement
- Data Exploration
- Features
- Methodology
- Results
- Improvements
- Conclusion
- **Evaluation**

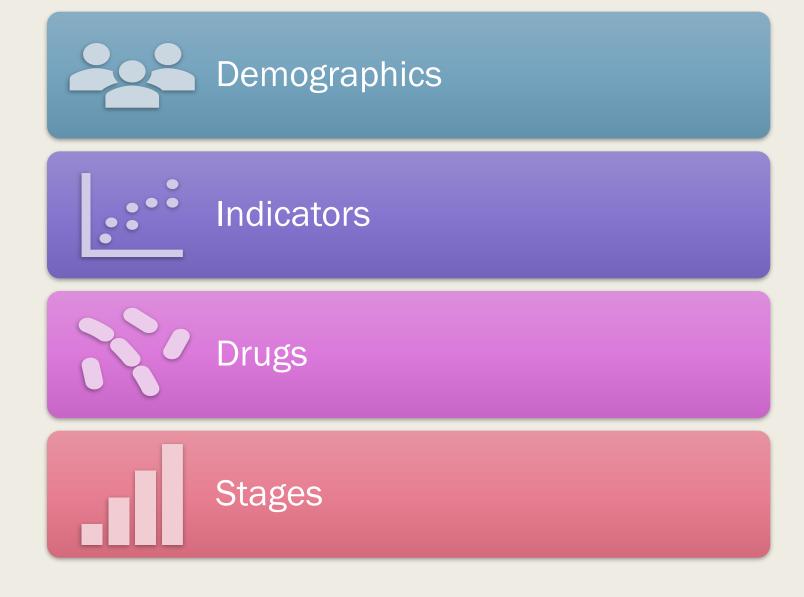
Problem Statement

• Given a set of longitudinal data of different lab measurements for patients diagnosed with chronic kidney disease (CKD).

• Predict whether a patient will progress in CKD staging or not.



Data Exploration



Problem Statement

Data Exploration

Features

Mode

Results

Improvements

Demographics

- 300 patients
- Categorical: Race (5), Gender (2)
- Discrete: Age

Problem Statement

Data Exploration

Features

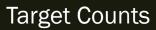
Model

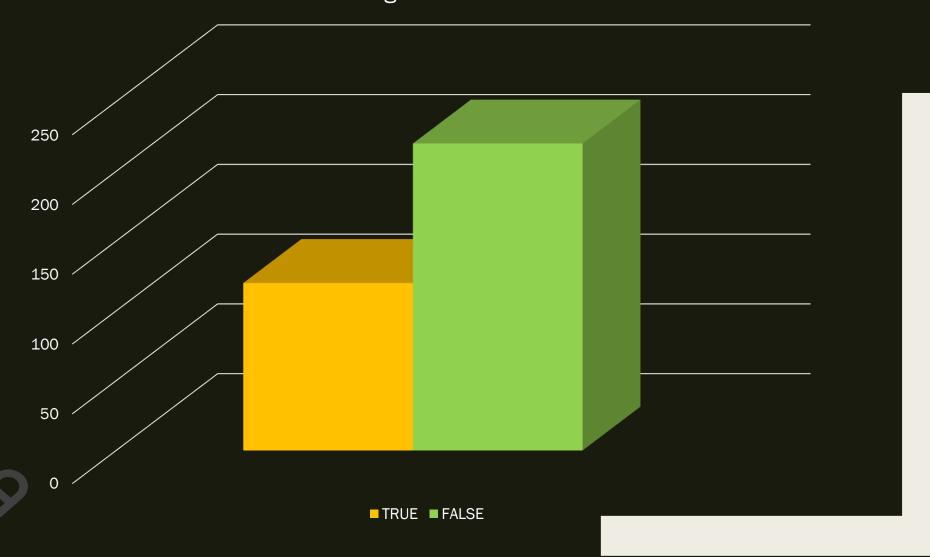
Results

Improvements

Conclusion

Stages





Problem Statemen

Data Exploration

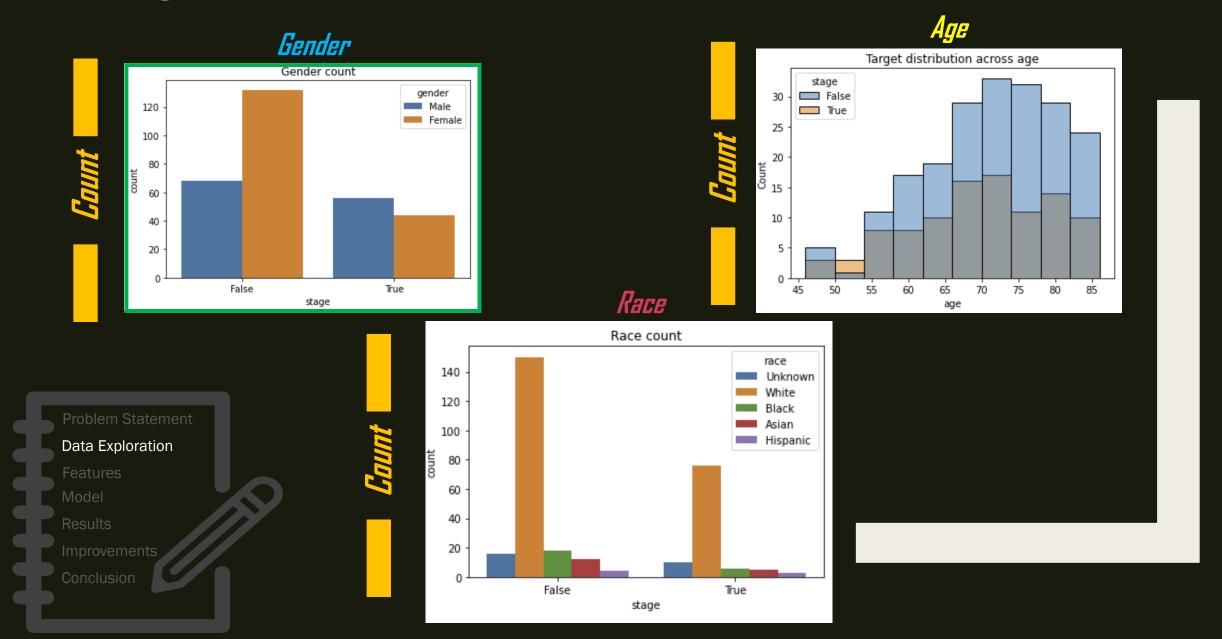
Features

Mode

Results

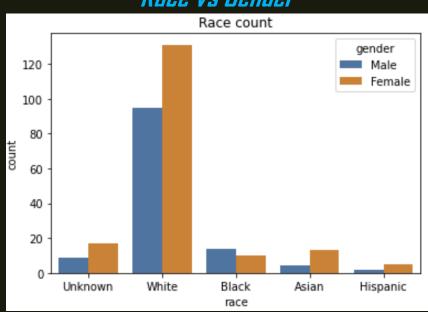
Improvements

Demographics



Demographics





Problem Statemen

Data Exploration

Features

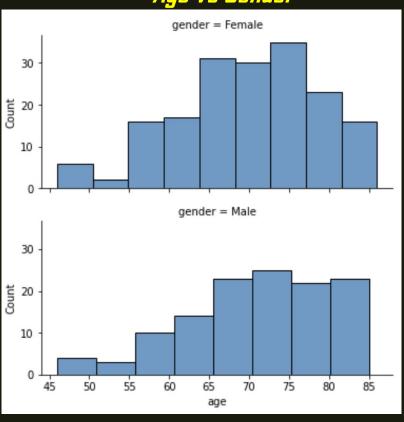
Mode

Results

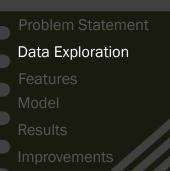
Improvements

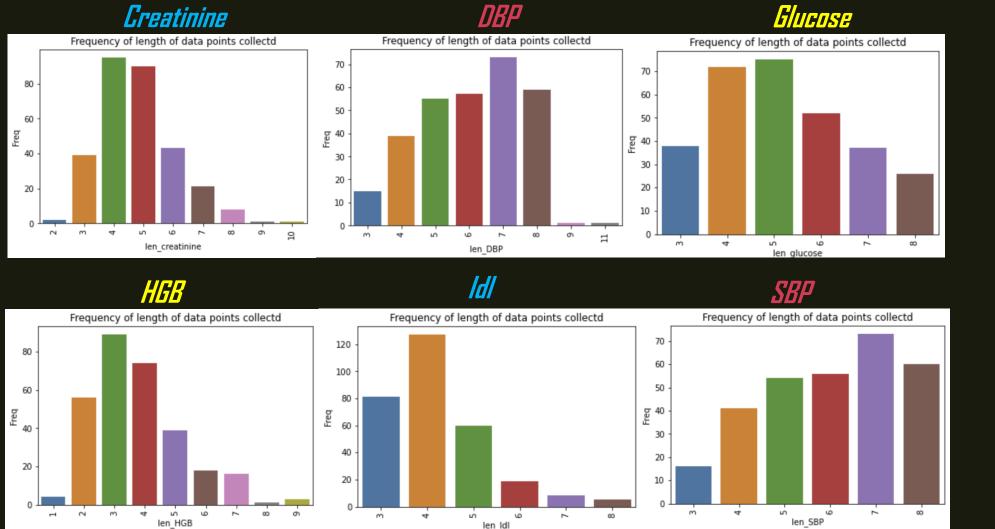
Conclusion

Age vs Gender



- 6 types
- 700 days
- Continuous: Measurement values
- Number of measurements and timestamps
 - vary for same patients per indicator
 - vary across all patients





Number of measurements

eature with length distribution

Problem Statemen

Data Exploration

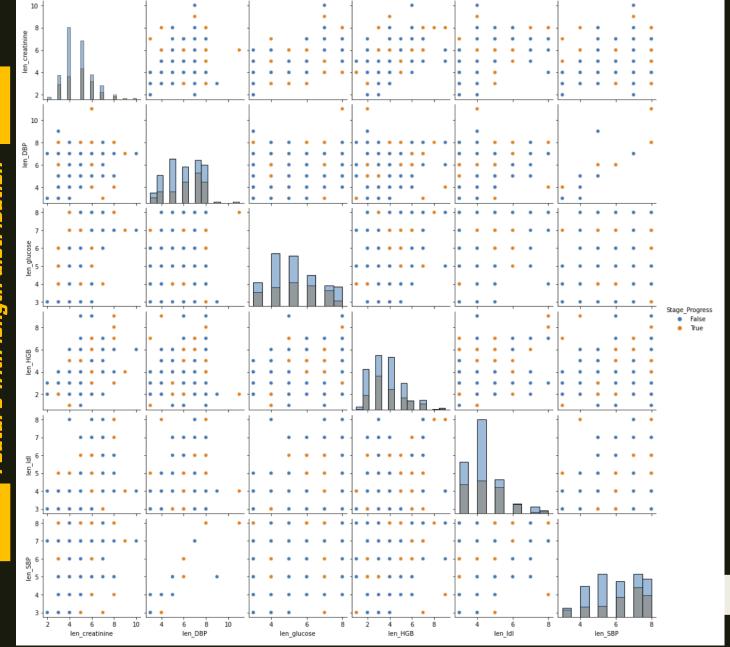
Features

Mode

Result

Improvements

Conclusion



Feature with length distribution

eature with length distribution

Problem Statemen

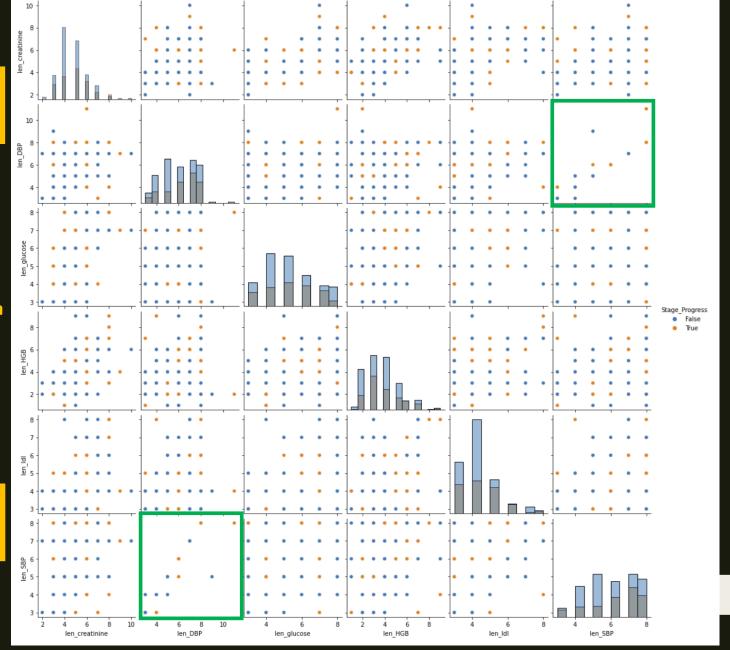
Data Exploration

Features

Mode

Result

Improvements



Feature with length distribution

- Problem Statement

 Data Exploration

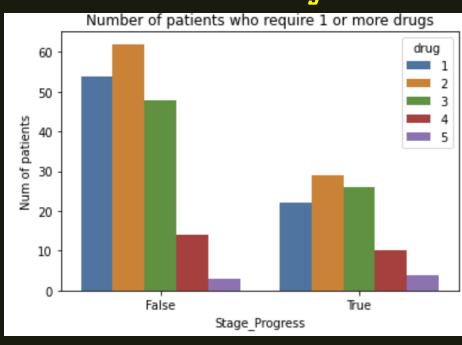
 Features
- Model

Results

Improvements

- **21** drugs
- 26 dosage levels
- 28 missing
- 700 days
- Categorical: Drug types, Dosage levels
- Varying number of drugs and dosage levels

Number of drugs



Problem Statemen

Data Exploration

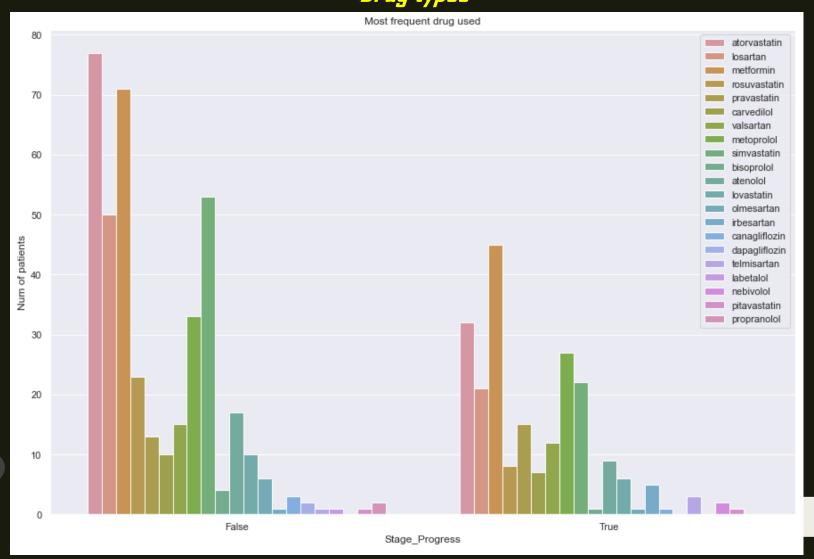
Features

Mode

Results

Improvements





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Problem Statement

Data Exploration

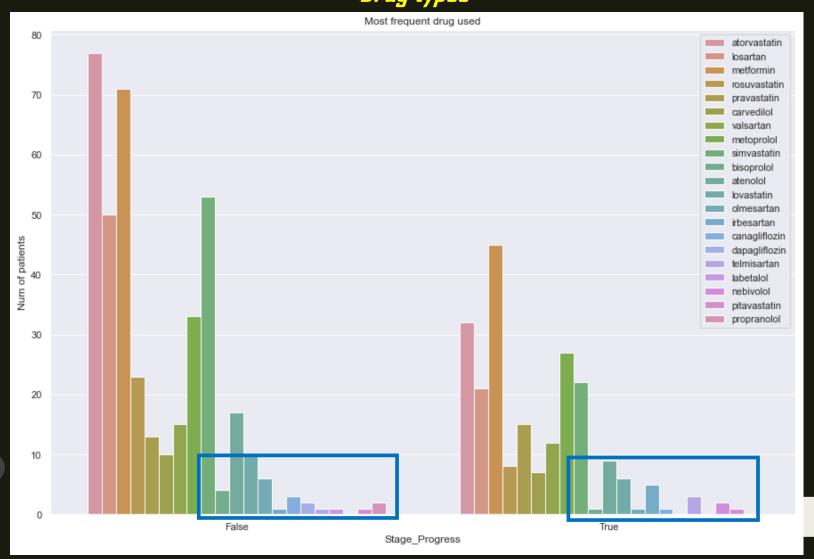
Features

Mode

Results

Improvements





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Problem Statement

Data Exploration

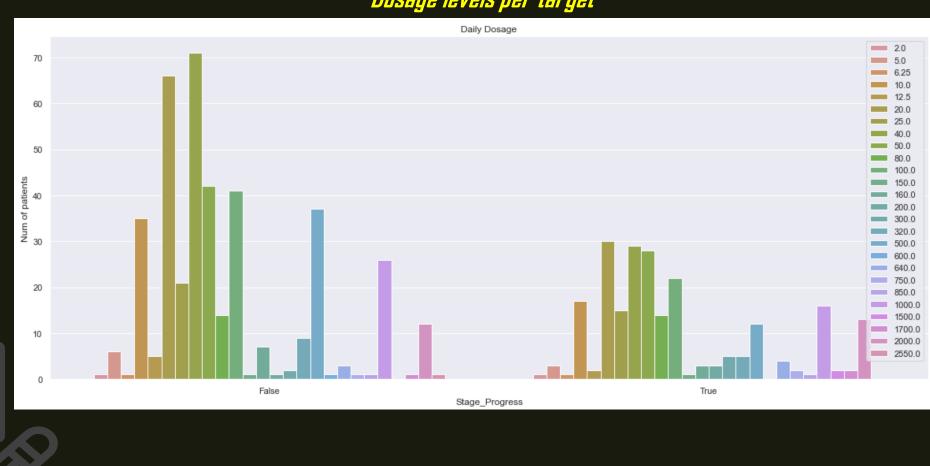
Features

Mode

Results

Improvements

Dosage levels per target



Problem Statemen

Data Exploration

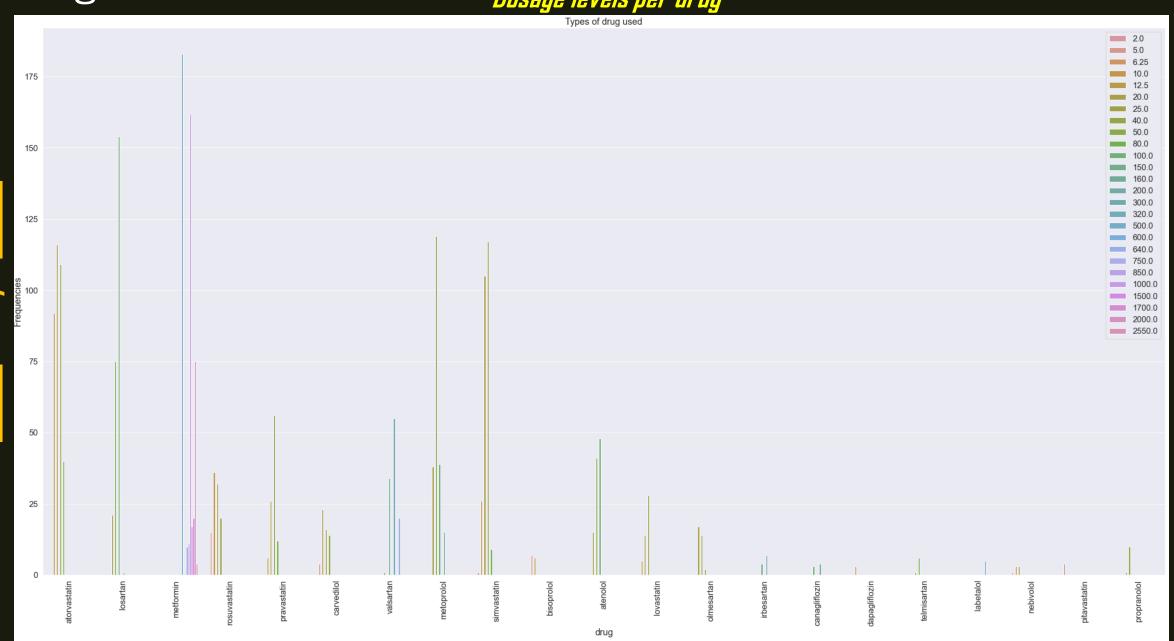
Features

Mode

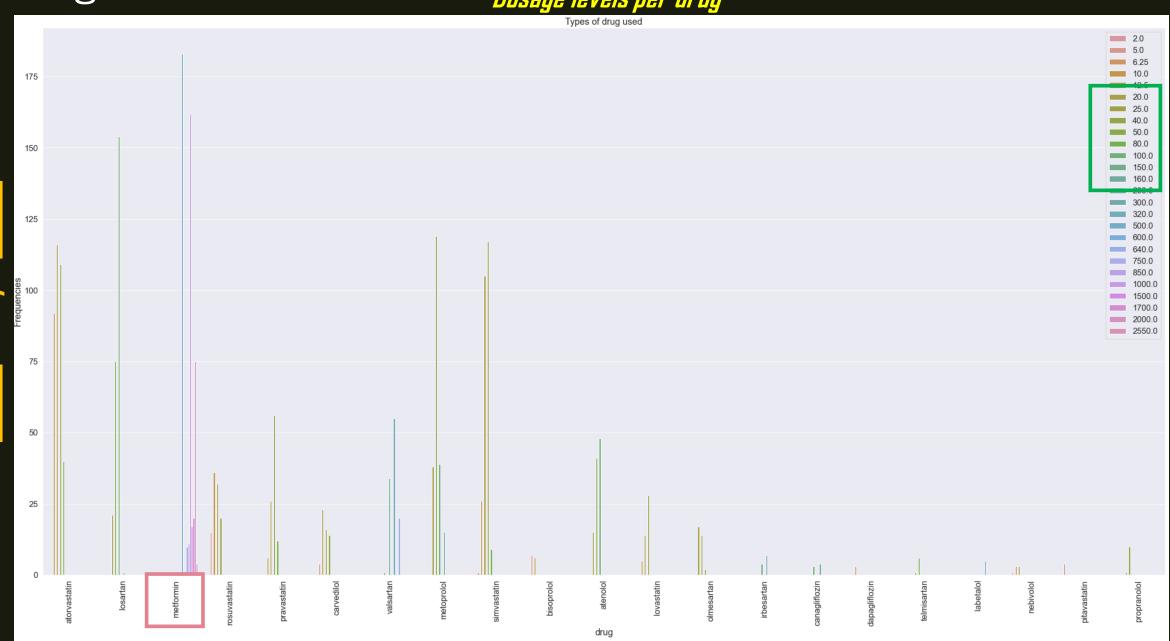
Results

Improvements

Dosage levels per drug



Dosage levels per drug



Demographics

Indicators

Drugs

Combine minority races

Normalize age





Features

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Improvements

Demographics

Indicators

Drugs

Combine minority races

Normalize age

Interpolate the data points linearly to form 1D signal

Normalize the values of 1D signal

Features

Demographics

Indicators

Drugs

Combine minority races

Interpolate
the data
points linearly
to form 1D
signal

Reduce the number of drugs

Normalize age

Normalize the values of 1D signal

Form 1D signals with the dosage levels

Problem Statemen

Features

Model

Results

Improvements

Selected drugs

Problem Statement

Data Exploration

Features

Model

Results

Improvements



Samples

Problem Statemen[.]

Data Exploration

Features

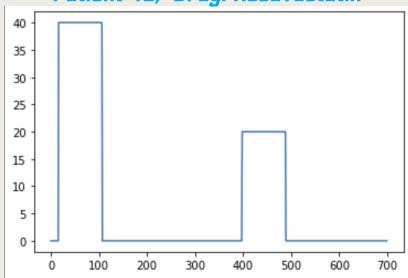
Mode

Results

Improvements

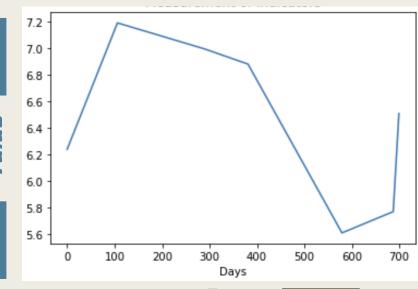
Conclusion





Dosage

Patient 0 , Indicator: Glucose



Why 1D signal/wave?

Problem Statement

Data Exploration

Features

Model

Results

Improvements

How to input many 1D signals?



Day 0	Day 1				Day	Day
		•	•	•	698	699

Problem Statement

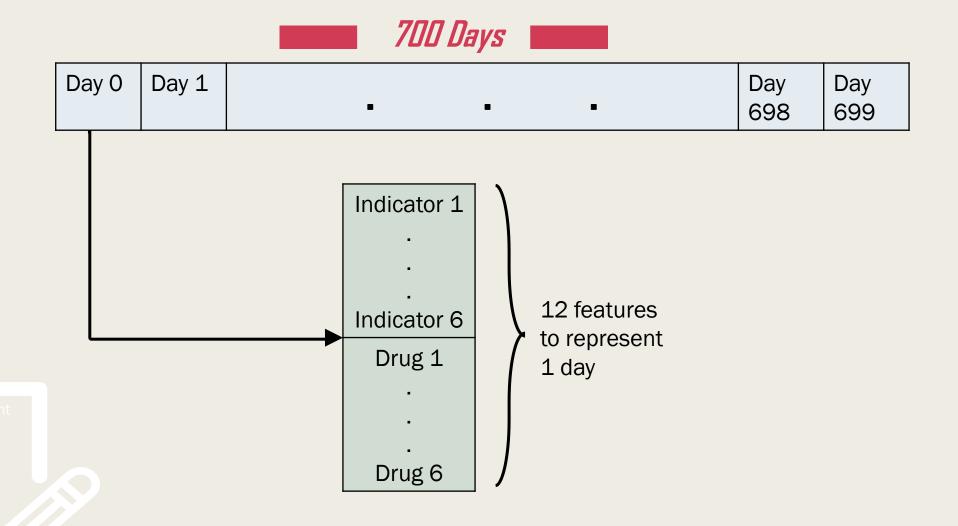
Data Exploration

Features

Mode

Results

Improvements

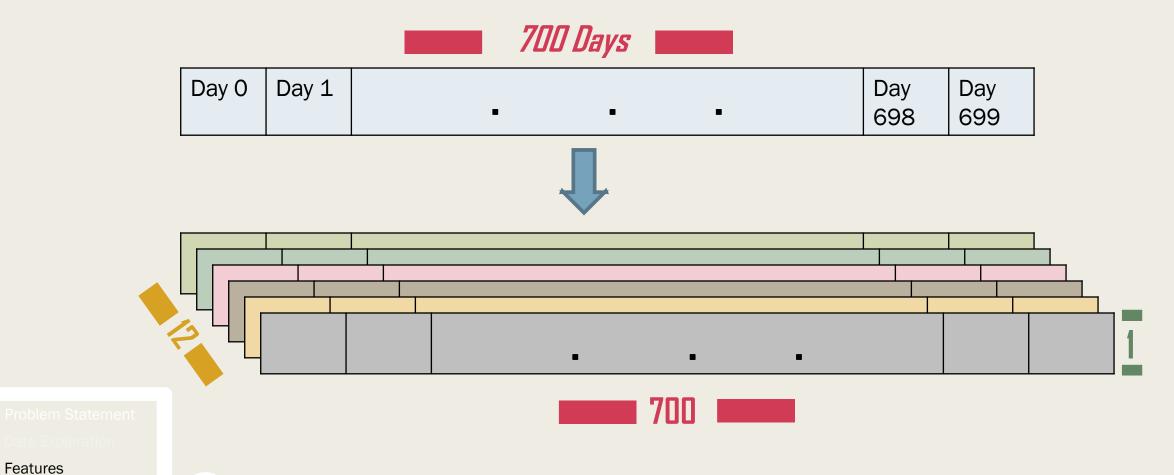


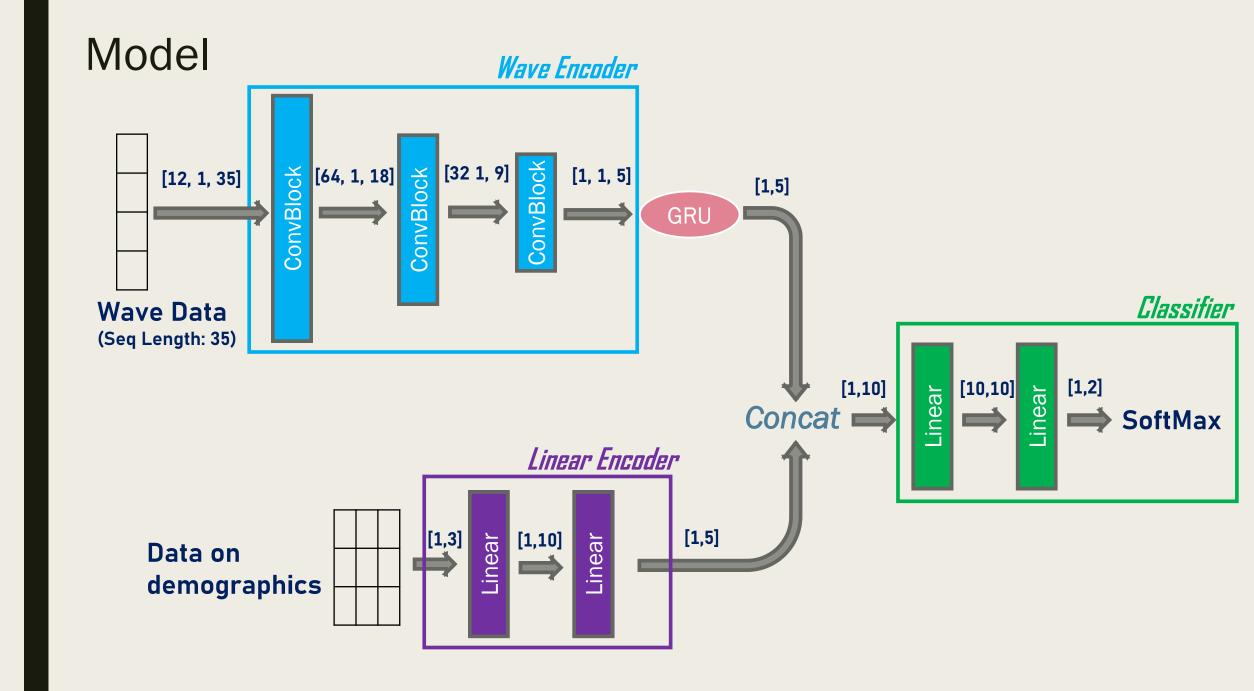
Features

Model

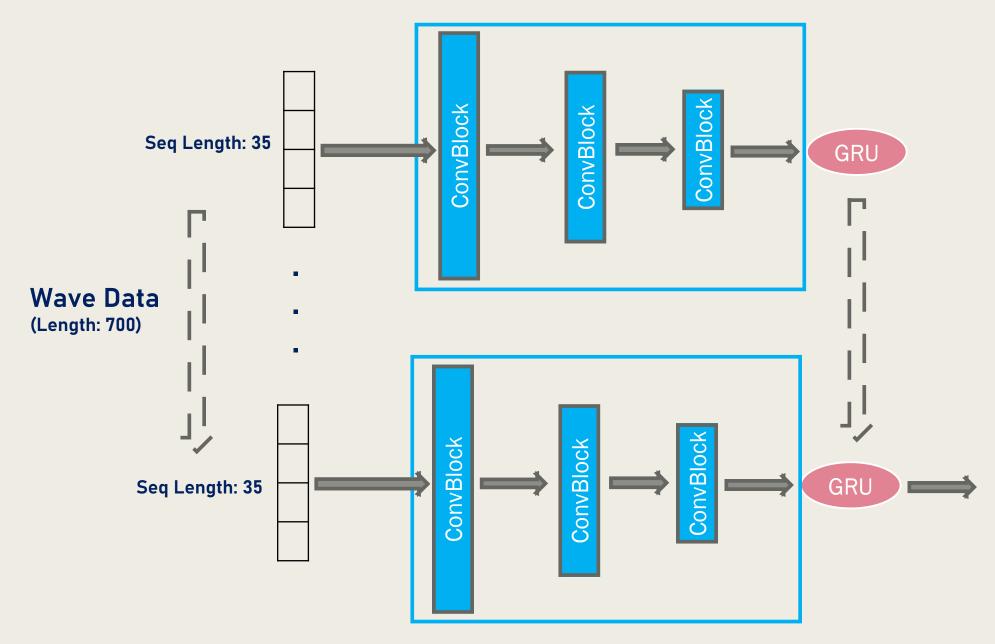
Result

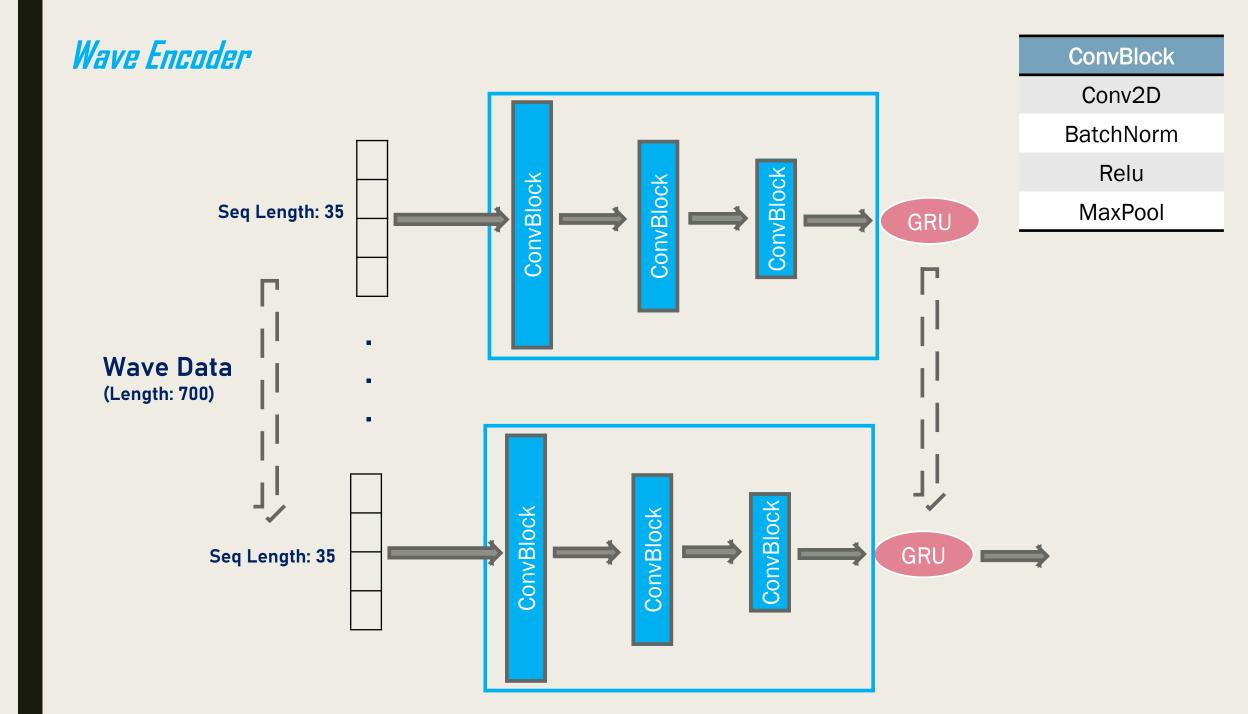
Improvements





Wave Encoder





Results

Train/Val

Problem Statemen

Data Exploration

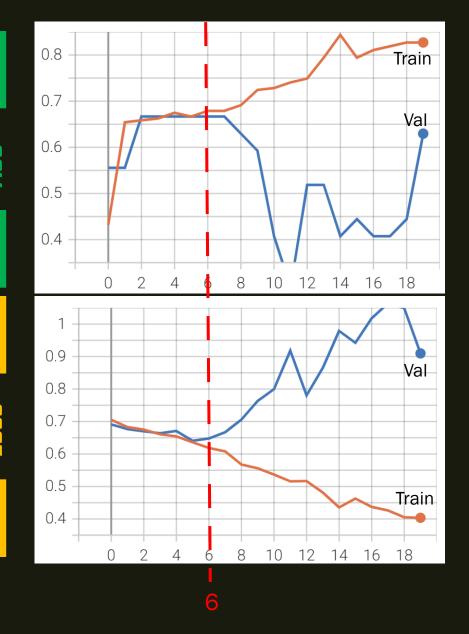
Features

Mode

Results

Improvements

Conclusion



Epoch

Results

Train/Val

Problem Statement

Data Exploration

Features

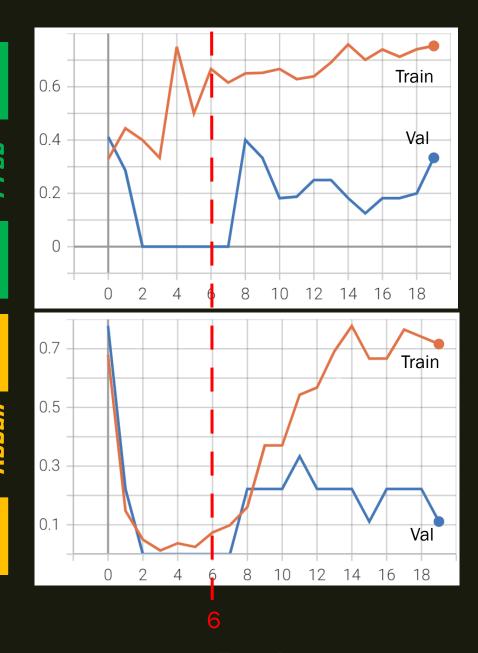
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Mode

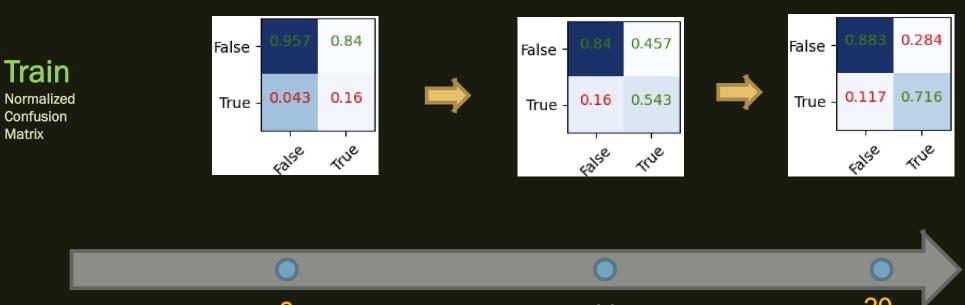
Results

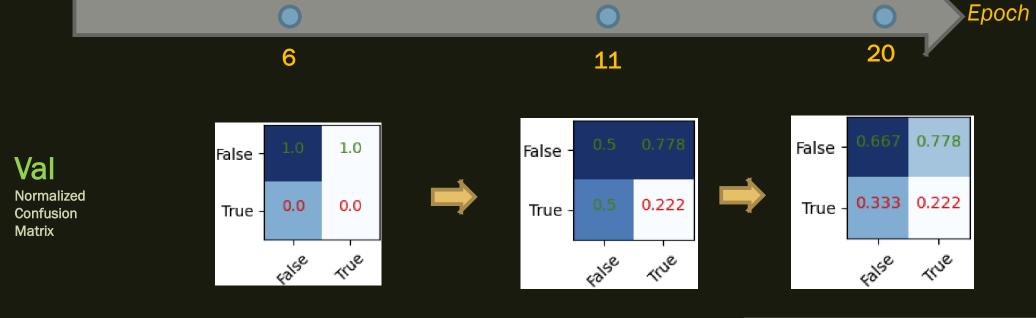
Improvements

Conclusion



Epoch





True Labels

Results

Test

Normalized Confusion Matrix



Problem Statement
Data Exploration
Features

Mode

Results

Improvements

Improvements



Increasing collection of data samples



Optimizing the current model



Feature Engineering

Problem Statement
Data Exploration
Features
Model
Results
Improvements

Conclusion



Deep Learning approach



Multi modal architecture



Results not favorable



Requires further refinement

Problem Statement

Data Exploration

Features

Results

Improvements

Thank You!