

ROUTED – DYNAMIC BUS SCHEDULING

Under the guidance of
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INTRODUCTION

- Importance of bus transportation in public transport
- Shortcomings of bus transportation
- Reasons for the shortcomings
- Solution: Dynamic scheduling

PROBLEM STATEMENT

- Public transit - a mix of private business and government
- Current BEST bus services are static
- Inefficient as well as underutilization of resources

EXISTING SOLUTION

- Human schedulers.
- Demographics of regions(residential,commercial areas) are considered.
- Manual travelling by Schedulers.
- Large workforce required.
- Lengthy period of research.
- Benefits few compared to the effort required.

OUR PROPOSAL

- Predict number of trips required on each route based on passenger records
- Allocation of buses on each routes based on trip prediction
- Dynamic Schedule generation for coming day
- Reusable buses(i.e. Buses not fixed to a single route)
- Schedules and allocation based records for each route in both direction

LITERATURE SURVEY

- Our prime focus has been to find out research papers that can be realized or cited in our solution.
- Literature survey has been mainly focused in the fields of:
 - ❑ Optimal resource allocation
 - ❑ Bus Scheduling algorithms
- Primary hurdle has been finding relevant research in alignment with our project objectives .
- Another aspect has been identifying the trade-offs between different attributes/features that can affect the creation of Dynamic Bus Schedules.
- Papers on data cleaning have been considered during the review.

BUS ALLOCATION ALGORITHMS

- Primary aim has been to
 - ❑ Identify papers proposing mathematical models for Bus Allocation
 - ❑ Papers defining various angles to approach the problem of Bus Allocation
 - ❑ Papers focusing on the identification of different useful attributes/features in the data
- Some of the important research papers surveyed in this regard are:
 - ❑ Optimal Resource Allocation For Projects by Carbno Collin
 - ❑ The Allocation Of Buses In Heavily Utilized Networks With Overlapping Routes by Anthony F. Han and Nigel Wilson
- Our main focus in this survey was to understand different existing approaches.

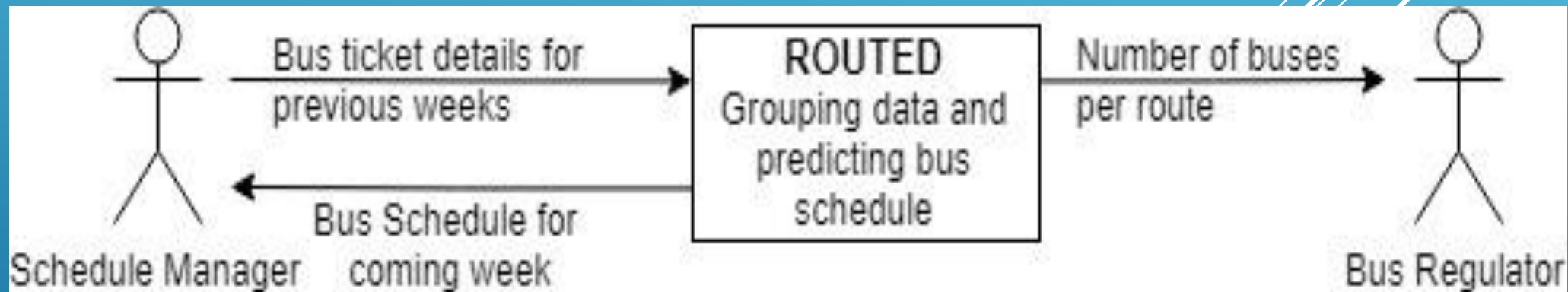
BUS SCHEDULING ALGORITHMS

- Approaches considered within the survey vary widely from statistical methods to data mining models and linear programming.
- Some of the important research papers surveyed in this regard are:
 - ❑ Bus Scheduling Model: A Literature Review by Mohammad HesamHafezi, Amiruddin Ismail and Ramez A. Al-Mansob
 - ❑ Optimal Multi-vehicle Type Transit Timetabling And Vehicle Scheduling by Avishai (Avi) Ceder
- Our main focus in this survey was to identify methods suitable for our solution.

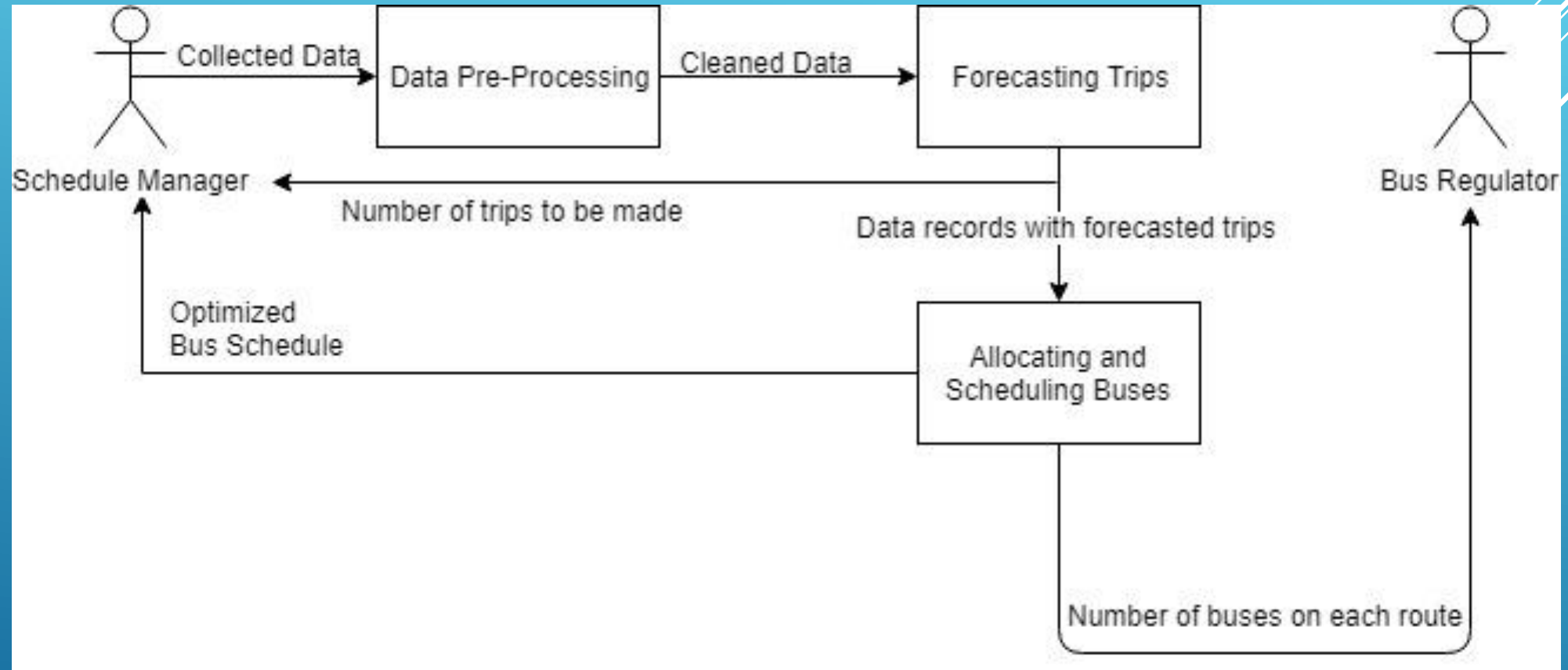
LITERATURE SURVEY OVERVIEW

- The literature available on the topics of our interest lack
 - ❑ Research papers that consider only ticket records for Bus scheduling and Allocation
 - ❑ Research papers that provide a complete model of Bus Scheduling and Allocation simultaneously
 - ❑ Clear distinction between the importance of different attributes that are used for clustering, scheduling and allocation
- As part of the review, we considered 18 research papers from relevant fields
- The research papers have been viewed as a guiding direction and not as a solution to be implemented and compared with the theoretical results

HIGH LEVEL ARCHITECTURAL DIAGRAM

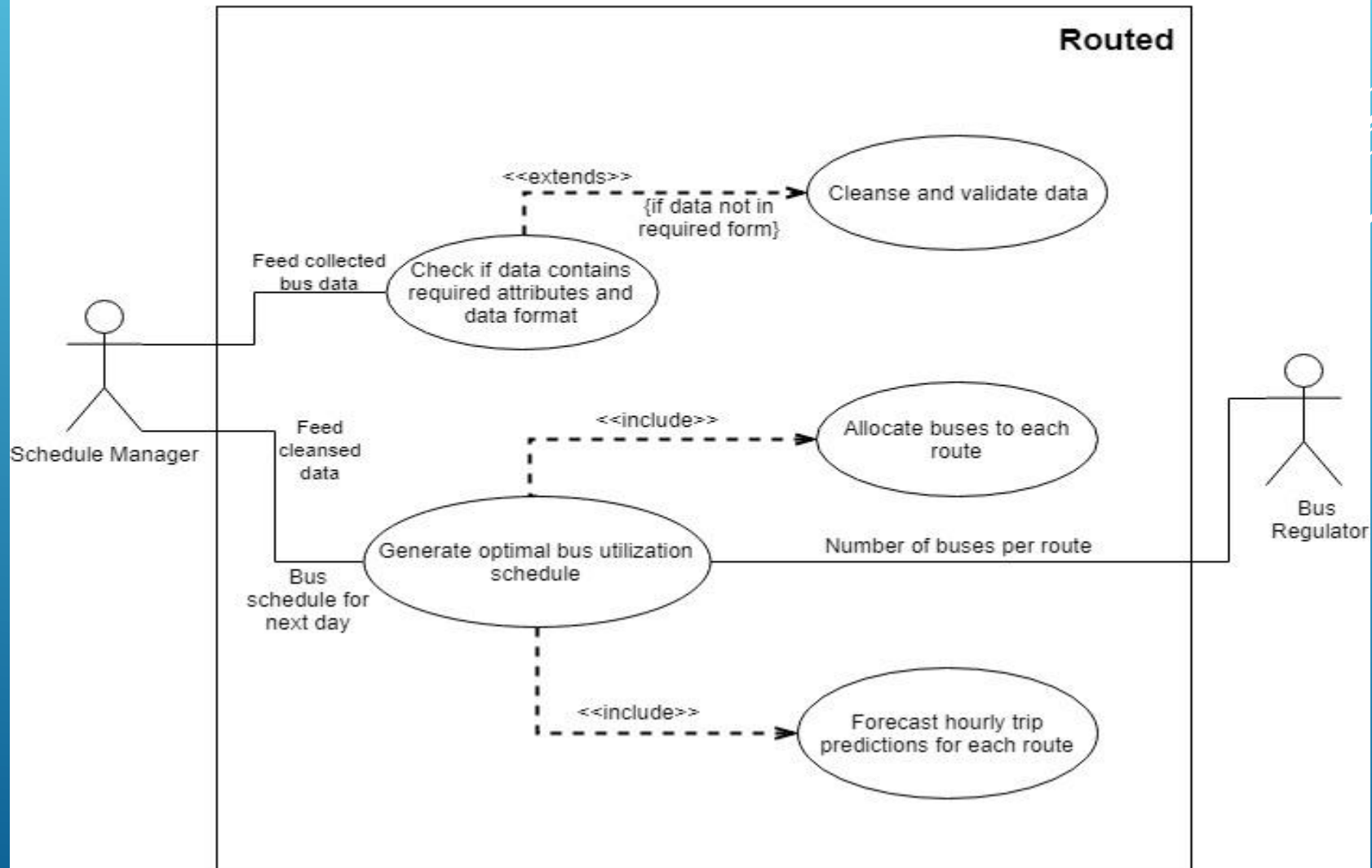


LOW LEVEL ARCHITECTURAL DIAGRAM




USE CASE DIAGRAM

Routed - Use Case Diagram




STEPS OF PROPOSED SOLUTION


The proposed solution can be broken down into four steps:

- ▶ Data Collection
 - ▶ Data Pre-processing
 - ▶ Trip Prediction
 - ▶ Bus Allocation and Scheduling
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DATA COLLECTION

- ▶ The input data for our project has been obtained from Vikhroli Bust Depot, Mumbai
 - ▶ Contains information about 16 routes
 - ▶ Input data contains attributes like number of trips, passengers, total km travelled for every timeslot in both directions
 - ▶ Number of passengers ranged from as low as 50 to as high as 600 while the number of trips were in the range 0 to 10
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DATA PRE-PROCESSING

- ▶ Raw data often incomplete, inconsistent and likely to be error prone
 - ▶ Data pre-processing to the rescue. It ensures data is compatible with proposed method
 - ▶ Split input data into different files for up and down direction
 - ▶ Filling empty values with the constant zero
 - ▶ Enumerating days of week. Monday = 1 and Sunday = 7
 - ▶ Important in our proposed model to ensure appropriate trip forecast and subsequent bus allocation and scheduling
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TRIP PREDICTION

- ▶ Chosen models have the ability to inherently identify trends, variations and seasonality
 - ▶ Chosen models include ARIMAX, SARIMAX and LSTM RNNs
 - ▶ These models consider passenger frequency on a day along a route for every timeslot and accordingly decide how many trips need to be made in order to service the passenger demands
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ARIMAX, SARIMAX AND LSTM RNN

- ▶ The ARIMA (Auto-regressive integrated moving average) model is a time-series analysis model which considers future values of a variable (time series) to be dependent on its previous values.
- ▶ SARIMAX (Seasonal ARIMAX), like ARIMAX, is a time series analysis model that takes seasonality into consideration along with ARIMAX. In a seasonal ARIMA model, seasonal AR and MA terms predict attribute value using data values and errors at times with lags that are multiples of S (the span of the seasonality)
- ▶ LSTM units can store information and trends in the memory associated with it and thus, can remember inputs, associations, etc. over a long period of time.


BUS ALLOCATION AND SCHEDULING

- ▶ Bus scheduling (timetabling) and optimal allocation of buses help cut down the cost of resources
 - ▶ Bus allocation refers to distributing buses across routes so as to meet the criteria of number of trips to be made
 - ▶ Bus scheduling generates a timetable for the allocated buses with the help of reuse while maintaining an average headway
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BUS ALLOCATION AND SCHEDULING

- ▶ This algorithm uses the trips for each slot to schedule the buses in each time slot with the aim of reducing the number of buses allocated for each route
 - ▶ The algorithm uses the concept of empty trips (sending an empty trip from in one direction to reuse the bus in other direction if required) and allocating new buses when a given trip cannot be scheduled by using the allocated buses
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EXPERIMENTAL SETUP

- ▶ In the ARIMAX model, after analysing trends and patterns in input data, a (1,1,0) model was chosen as it provides better flexibility and control over non-stationary trend. The 'I' component is not used as is but a difference function of our own is created
 - ▶ In SARIMAX, parameters are chosen so as to stabilize the data and minimize seasonality for short term forecasts
 - ▶ A two layered six node structure was used for the LSTM implementation
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RESULTS


Date	SVM	ARIMAX	SARIMAX	Poly Regression	LSTM
8/2/18	5	5	4	6	5
9/2/18	5	7	5	5	8
10/2/18	3	5	5	6	6
11/2/18	2	3	4	5	4
12/2/18	5	3	3	5	5
13/2/18	7	3	5	7	7
14/2/18	5	3	5	5	7
Average	4.57	4.14	4.42	5.57	6

RESULTS (CONTINUED)


- ▶ The Polynomial Regression performs the worst due to the presence of outliers.
- ▶ LSTM and SVM show comparative results but do not show significant improvement over Polynomial Regression.
- ▶ ARIMAX and SARIMAX perform the best as they track the seasonality trends and patterns in our data and also keep a track of the outliers.



CONCLUSION

- ▶ The new system ensures that all the considerations of the current solution (availability of buses, reasonable waiting time for passengers and spare buses for unforeseen situations) are met
 - ▶ It ensures that optimal number of buses are used for each route to cut down operational costs while maintaining an acceptable level of efficiency (in terms of headway).
 - ▶ It helps overcome the problems in the current implementations where schedules are generated manually
 - ▶ This can also lead to inconsistencies due to human interference which is alleviated to some extent in this system
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FUTURE POSSIBILITIES

- ▶ Consideration of overlapping routes
 - ▶ Dynamically altering buses on routes even during the day using live tracking
 - ▶ Considering different types of buses that can be run on the routes, e.g. express buses, buses with different capacities
 - ▶ Allowing the buses to run subsets of the entire routes and changing routes at intersection points
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THANK YOU

