Planning & Forecasting Bus Transit Alternatives in El Paso, Texas

Client: El Paso Capital Improvements Department Alex Hoffman, *AICP, CNU-A* & Adam Gorski Sun Metro Local Bus Network Beaumont Hospital/Highland







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Yingxue Ou App Development

EXPLORATORY FEATURE DATA ANALYSIS ENGINEERING

MODELLING

Current Bus Network Sun Metro Mass Transit - El Paso, TX



WEB APP

Problem Statement

Sun Metro is looking to redesign its bus network system while maximizing both equity and revenue

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Sun Metro Context

- Experienced declining ridership for the last several years with rapid decrease in ridership as the pandemic began
- New services helped increase ridership



Image: Sun Metro, State of the System Report (2022)

BRIO

INTRODUCTION

Bus rapid transit lines
Four routes since 2014

EXPLORATORY

DATA ANALYSIS

FEATURE

ENGINEERING

 Account for 40% of system ridership



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EXPLORATORY FEATURE DATA ANALYSIS ENGINEERING

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"El Paso, often forgotten, is building a <mark>stronger transit network</mark> than most US cities." – Christof Spieler (Trains, Buses, People)



EXPLORATORY DATA ANALYSIS

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Use Case

To develop an evaluation framework for Sun Metro transit planners to maximize the social equity and fare revenue outcomes of alternative bus route scenarios

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Use Case

Bus transit demand model

To develop an evaluation framework for Sun Metro transit planners to maximize the social equity and fare revenue outcomes of alternative bus route scenarios

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EXPLORATORY DATA ANALYSIS FEATURE ENGINEERING

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Use Case

Bus transit demand model

To develop an evaluation framework for Sun Metro transit planners to maximize the social equity and fare revenue outcomes of alternative bus route scenarios

Informational network app



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El Paso Context Map

El Paso (County)





MODELLING

WEB APP

El Paso Context Map









MODELLING

WEB APP

El Paso Context Map

<mark>El Paso (County)</mark> El Paso (City) Fort Bliss







MODELLING

WEB APP

El Paso Context Map

<mark>El Paso (County)</mark> El Paso (City) <mark>Fort Bliss</mark> Franklin Mountains







FEATURE DATA ANALYSIS ENGINEERING

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El Paso Context Map

EXPLORATORY

El Paso (County) El Paso (City) Fort Bliss Franklin Mountains **Rio Grande River**







FEATURE DATA ANALYSIS ENGINEERING

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El Paso Context Map

EXPLORATORY

El Paso (County) El Paso (City) Fort Bliss Franklin Mountains Rio Grande River Sun Metro Network







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Downtown Spotlight





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Client-provided Data

- Ridership data for the year 2022
- Bus sensors collected how many people got on and off at every stop

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Data Structure					
Date	Route	Stop	On-board	Off-board	Geometry

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System-Wide Transit



Data: El Paso Capital Improvements Department, 2022



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El Paso Context Map

El Paso (County) El Paso (City) <mark>Rio Grande River</mark> Franklin Mountains Fort Bliss Sun Metro Transit Local Bus Routes





https://jtrummler.github.io/el-paso-ridership-2022/

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- Spatial Aggregation

- Spatial Unit: Hexbins
- Equal spatial structure

Hex Bin Grid El Paso, Texas



INTRODUCTION	EXPLORATORY DATA ANALYSIS	FEATURE ENGINEERING	MODELLING	WEB APP

Feature Selection

AMERICAN COMMUNITY SURVEY (2019)	NATIONAL WALKABILITY INDEX (2019)	LONGITUDINAL EMPLOYER- HOUSEHOLD DATA (2019)
RaceIncomeAbilityEducation	 Vehicle ownership Regional, destination, and job accessibility Intersection density 	 Age of employees Education of employees Income of employees Sector of jobs
OPEN DATA EL PASO	OPEN STREET MAP	OTHER SPATIAL FEATURES
SchoolsParksMajor roadways	 Health facilities Entertainment Shopping centers Food establishments 	• Stop density

INTRODUCTION	EXPLORATORY DATA ANALYSIS	FEATURE ENGINEERING	MODELLING	WEB APP

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OPEN DATA EL PASO	OPEN STREET MAP	OTHER SPATIAL FEATURES
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EXPLORATORY DATA ANALYSIS

%

%

FEATURE ENGINEERING

Racial Distribution in El Paso, TX (Total Population per square mile)

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White Population



Hispanic/Latino Population



Other Race Population



Black Population

80

60

40

% ■ 40

30

20

10



Asian Population



Data: ACS, 2019

EXPLORATORY DATA ANALYSIS

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Disabled Population



EXPLORATORY DATA ANALYSIS

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Median Household Income



EXPLORATORY DATA ANALYSIS

FEATURE ENGINEERING

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Employment Opportunity to Occupied Housing Ratio



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Model: XGBoost

Actual v. Predicted Ridership







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Actual vs. Predicted





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WEB APP

Actual vs. Predicted





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Generalizability



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El Paso Bus App

User: Sun Metro transit planner

Objective: Understand how a new bus route performs based on ridership and equity indicators

How: Upload route to web app to derive projected ridership and equity metrics

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WEB APP

El Paso Bus App



El Paso Bus System (chuembucket.github.io)



Any questions?

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Distance to Nearest Major Road



Distance to Nearest Park



Distance to Nearest Department Store

