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- The Impact of New Bike Lanes on Urban Transportation Dynamics



Introduction



Urban Transportation Challenges:

Traffic congestion
Environmental sustainability
Public safety concerns



Objective: To assess how new bike lanes affect:

Bike usage
Car dependency
Pedestrian safety



Study Areas: New York City (NYC) and San Francisco (SF)



Research Significance



Quality of Life: Current citywide congestion can be unbearable



Sustainability: Bike lanes reduce reliance on motor vehicles.



Safety: Fewer accidents and enhanced pedestrian confidence.



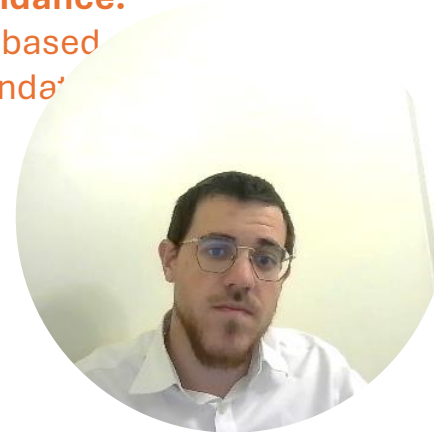
Economic Gains: Alleviating congestion can boost productivity (Hartgen and Fields, 2009).



Health Benefits: Increasingly sedentary lifestyles would benefit from increased cycling



Policy Guidance: Evidence-based recommendations for planners.



Prior Research

Impact of Bike Lanes on Cycling Rates	<p>Kraus & Koch (2021): Temporary bike lanes led to cycling increases of 11–48% during COVID-19.</p> <p>Buck & Buehler (2011): Bike lanes near bike-share stations increase bike-sharing utilization.</p>
Economic Impacts of Bike Lanes	<p>Arancibia et al. (2019): Replacing parking with bike lanes increased customer spending and foot traffic in Toronto.</p>
Congestion & Productivity	<p>Hartgen & Fields (2009): Mitigating congestion boosts productivity by up to 1%.</p> <p>Prud'homme & Lee (1999): Shorter commutes correlate with economic growth.</p>
Safety Benefits	<p>Buehler & Dill (2015): Dedicated bike lanes reduce pedestrian injuries by improving traffic organization.</p>
Research Gap	<p>Limited studies on bike lane effects on pedestrian and cyclist accidents across cities.</p> <p>Limited studies focusing on multiple cities and on finding quantifiable frameworks for untested cities.</p>



Methodology

Data Sources:

- Bike-sharing data: Citi Bike (NYC), Bay Wheels (SF)
- Traffic volume and accident data from public datasets
- Bike lane network from city open portals
- Demographic data from U.S. Census
- NYC data ranged from 6/2013 until 6/2024
- SF data ranged from 6/2017 until 5/2023

Key Data Variables:

- Bike count usage
- Bike lane network
- Motor vehicle usage
- Pedestrian accident and deaths

Feature Engineered Variables:

- Cumulative bike lanes
- Bike usage trend (seasonality extracted)
- Bike trend to car usage ratio



Methodology

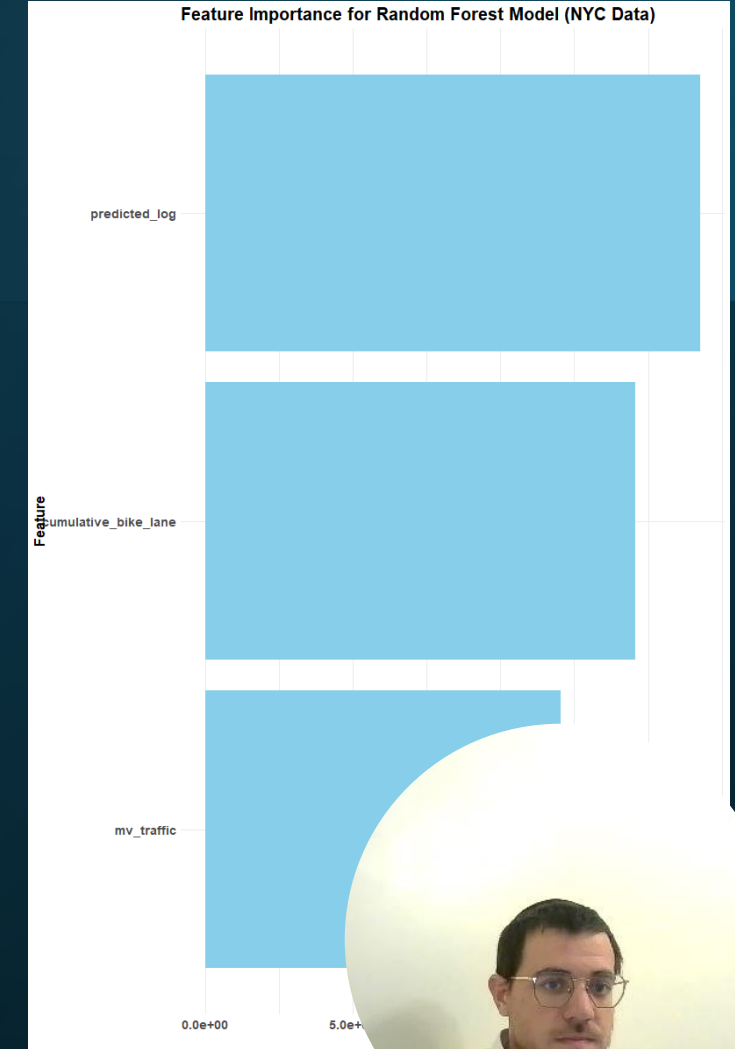
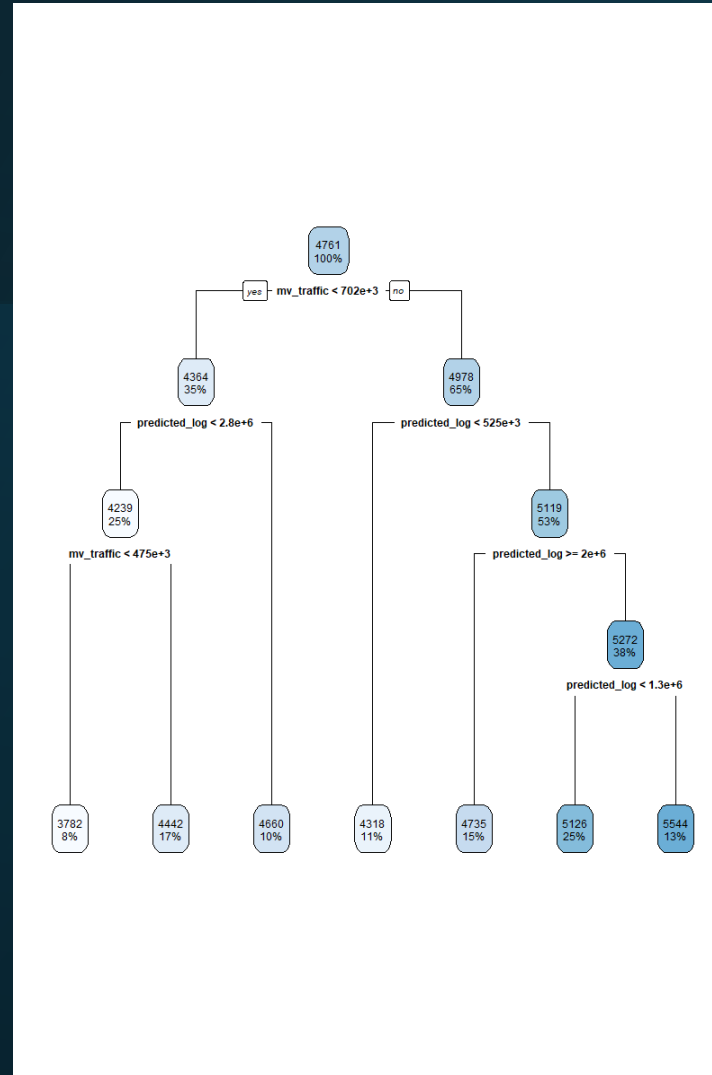
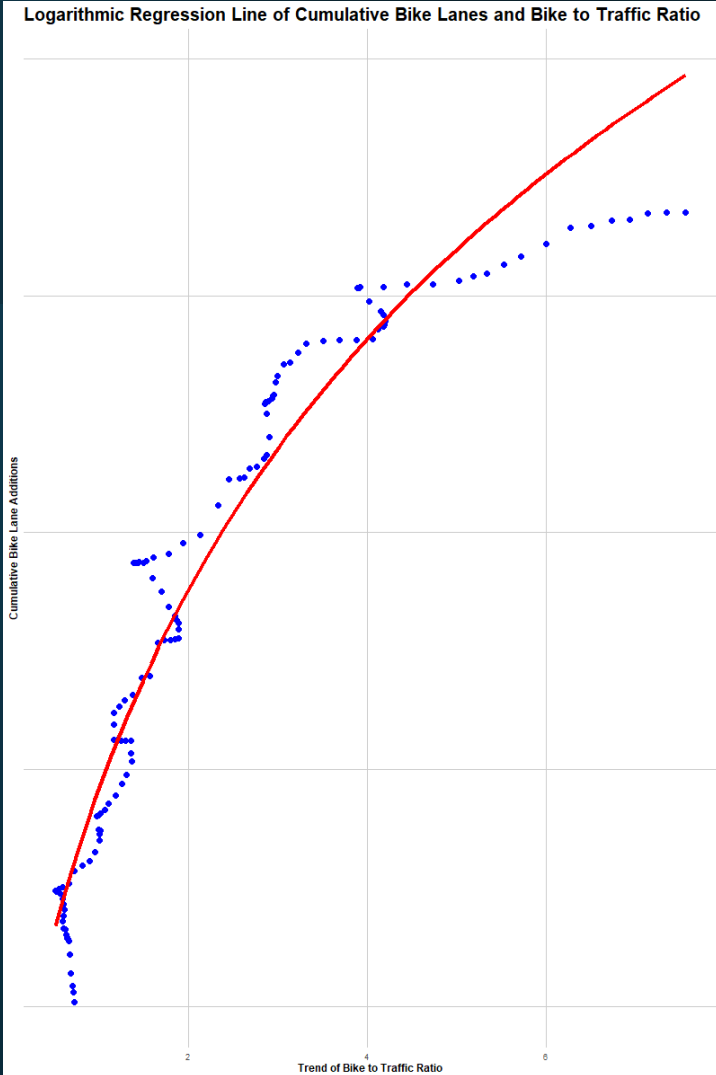
Modelling Techniques:

- **Logarithmic Regression:** Captures the logarithmic relationship between bike lane additions and bike-to-traffic ratios.
- **Decision Trees:** Identifies nonlinear interactions and thresholds, highlighting areas where bike lanes have the greatest impact.
- **Random Forest:** Aggregates decision trees for robust predictions, focusing on key variables like bike lane length and traffic volume.
- **XGBoost:** Utilizes advanced ensemble learning to uncover subtle patterns, offering high accuracy in predicting safety outcomes.
- **Support Vector Machines:** Explored but ultimately excluded due to suboptimal performance for this dataset

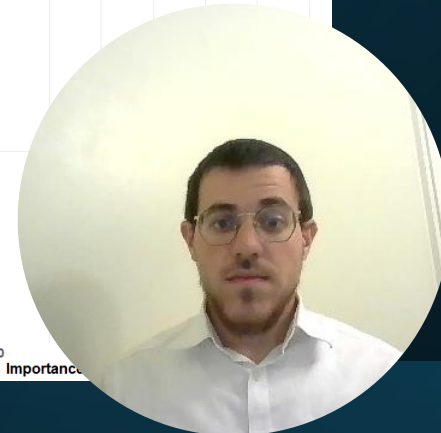
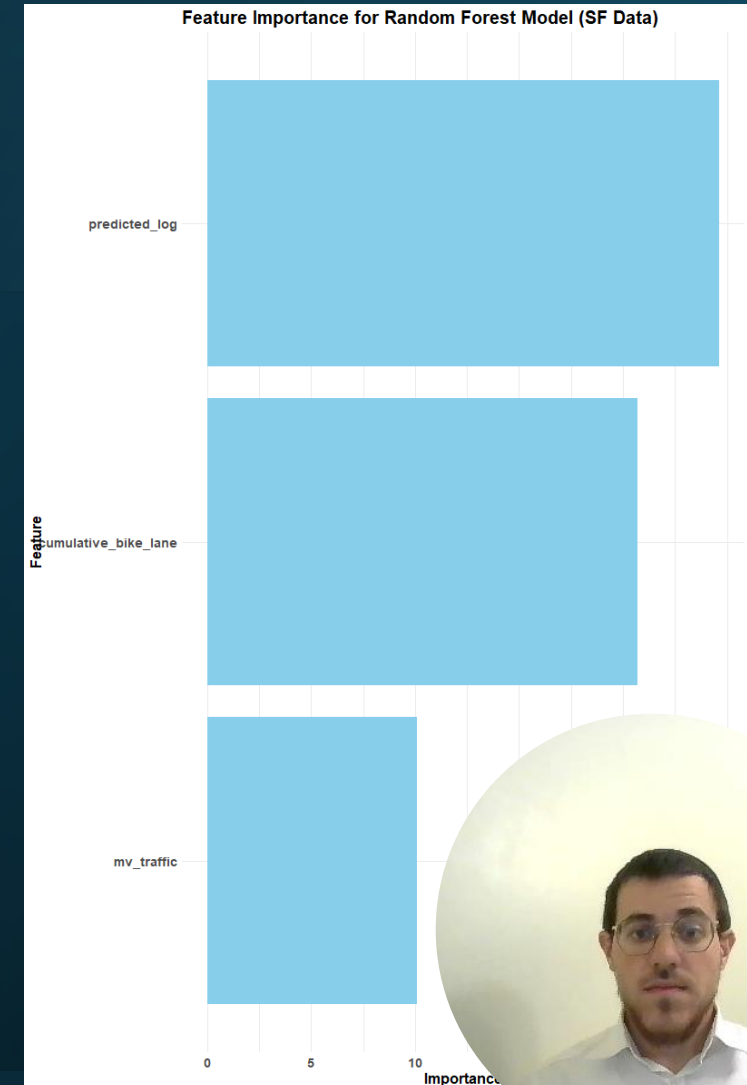
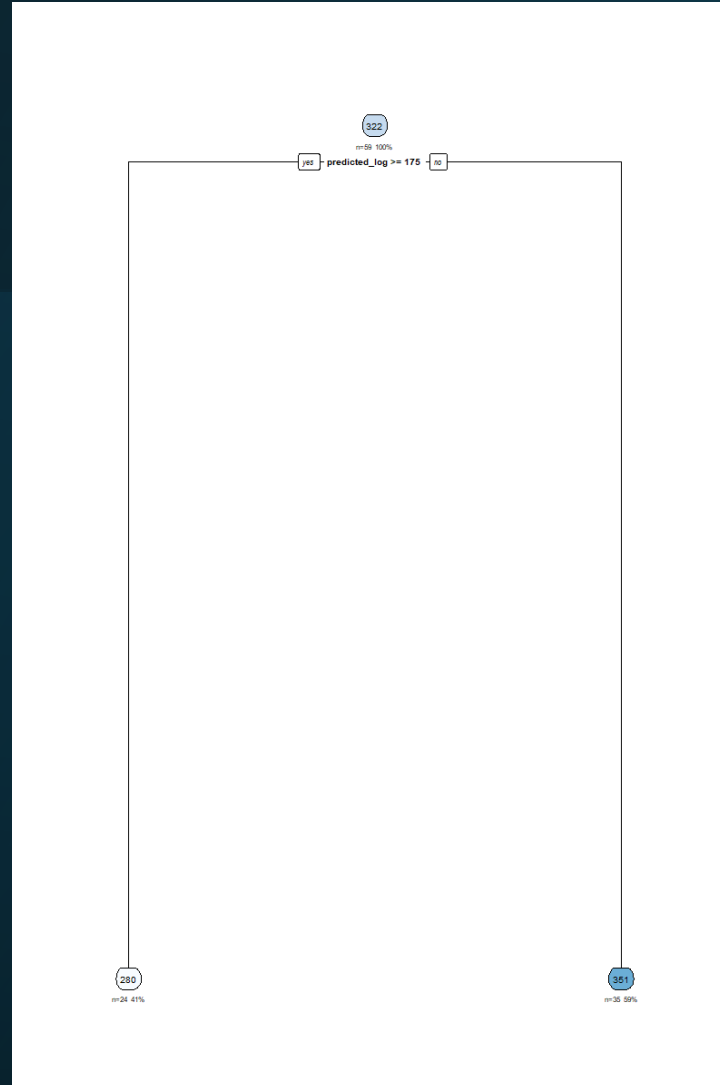
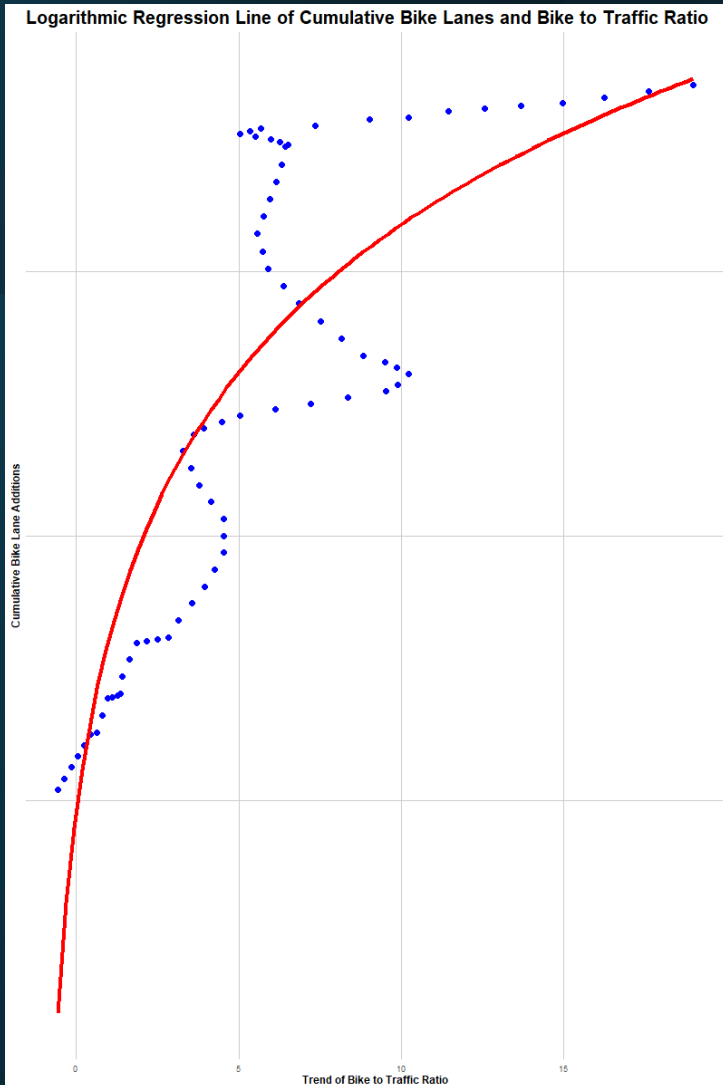
Seasonal adjustments to account for variation in bike usage



NYC Model Visuals



San Francisco Model Visuals



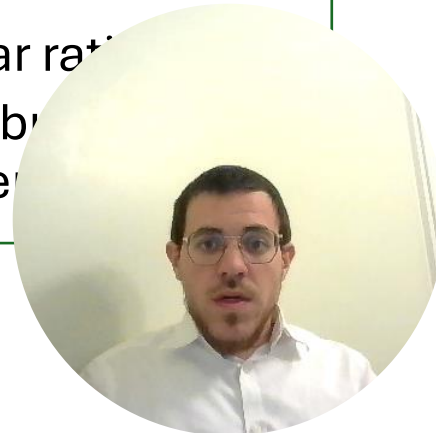
Key Findings - Relationships

Bike-to-Car Usage Ratio:

- Positive correlation with cumulative bike lane mileage.
- Relationship follows a logarithmic trend, indicating diminishing returns over time.

Traffic Volume and Accidents:

- Higher traffic volume correlates with increased accidents.
- Lower traffic areas see greater safety improvements with increased bike-to-car ratio.
- In lower traffic volume areas and times, more bike lanes should decrease accidents.



NYC vs. SF

Common Finding: Bike lane expansion drives increased safety and bike usage in both cities.

NYC:

- High traffic volume ($\geq 700,000$ vehicles/month) diminishes the effectiveness of bike lanes.
- Motor vehicle traffic is the dominant predictor of accidents.
- At lower traffic volumes, bike-to-car ratio is a significant predictor

SF:

- Smaller datasets show bike-to-car ratio as the key
- Bike lanes show stronger impacts in areas with low car dependency.





Models and Insights

Logarithmic Regression:

- Identifies a simple and accurate relationship between additional bike lanes and bike-to-car ratios
- Allows for easy forecasting for bike count and bike-to-car ratio for use in city planning and in other models.

Decision Trees:

- Identifies actionable thresholds (e.g., traffic volume <700,000 vehicles/month).
- Simple and interpretable for policymakers.

Random Forest:

- Balances model complexity with generalizability.
- Variable importance: Bike-to-car ratio, traffic volume, and cumulative bike lanes.

XGBoost:

- Best performance in NYC dataset (RMSE = 0.70).
- Captures nuanced interactions but requires more data for



Policy Recommendations

Prioritize Bike Lane Additions:

- Focus on areas with traffic volumes <700,000 vehicles/month.

Supplementary Measures:

- High-traffic areas need additional interventions:
 - Protected bike lanes
 - Traffic calming measures

Data-Driven Thresholds:

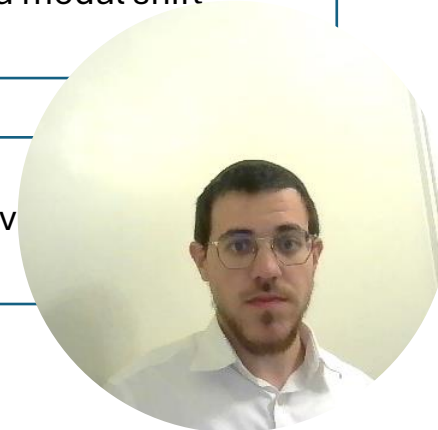
- Identify and address city-specific thresholds for maximizing bike lane effectiveness.

General Guidelines:

- Invest in cumulative bike lane infrastructure to encourage a modal shift toward cycling.

Use the General Framework for Additional Cities:

- While unseen cities might have varying thresholds, the prov framework can be utilized to find them.



Limitations

- **Data Constraints:**
 - Limited temporal scope (data covers only a decade).
 - Smaller dataset for SF limits generalizability.
- **Geographic Focus:**
 - Findings from NYC and SF may not directly apply to cities with different dynamics.
- **Data Consistency:**
 - Variability in data sources introduces potential biases.
- **Omitted Variables:**
 - Factors like weather, road quality, and enforcement of traffic laws not included.



Conclusion

- **Key Takeaways:**
 - Bike lane expansion correlates with increased bike usage and improved safety.
 - Impact varies across cities due to traffic volume, population density, and infrastructure.
- **Scalable Framework:**
 - Analytical tools and models can be adapted for other cities.
- **Actionable Insights:**
 - Invest strategically in bike lane infrastructure to promote sustainable and safer urban environments, particularly in areas with fewer than 700,000 motor vehicles per month.



Referenced Papers

- Hartgen and Fields (2009): Congestion's impact on economic productivity.
- Kraus and Koch (2021): Temporary bike lanes and lasting shifts in bike usage.
- Arancibia et al. (2019): Economic benefits of bike lane infrastructure.
- Github Repository with Code(link: <https://github.com/Shayaeng/Data698>).

