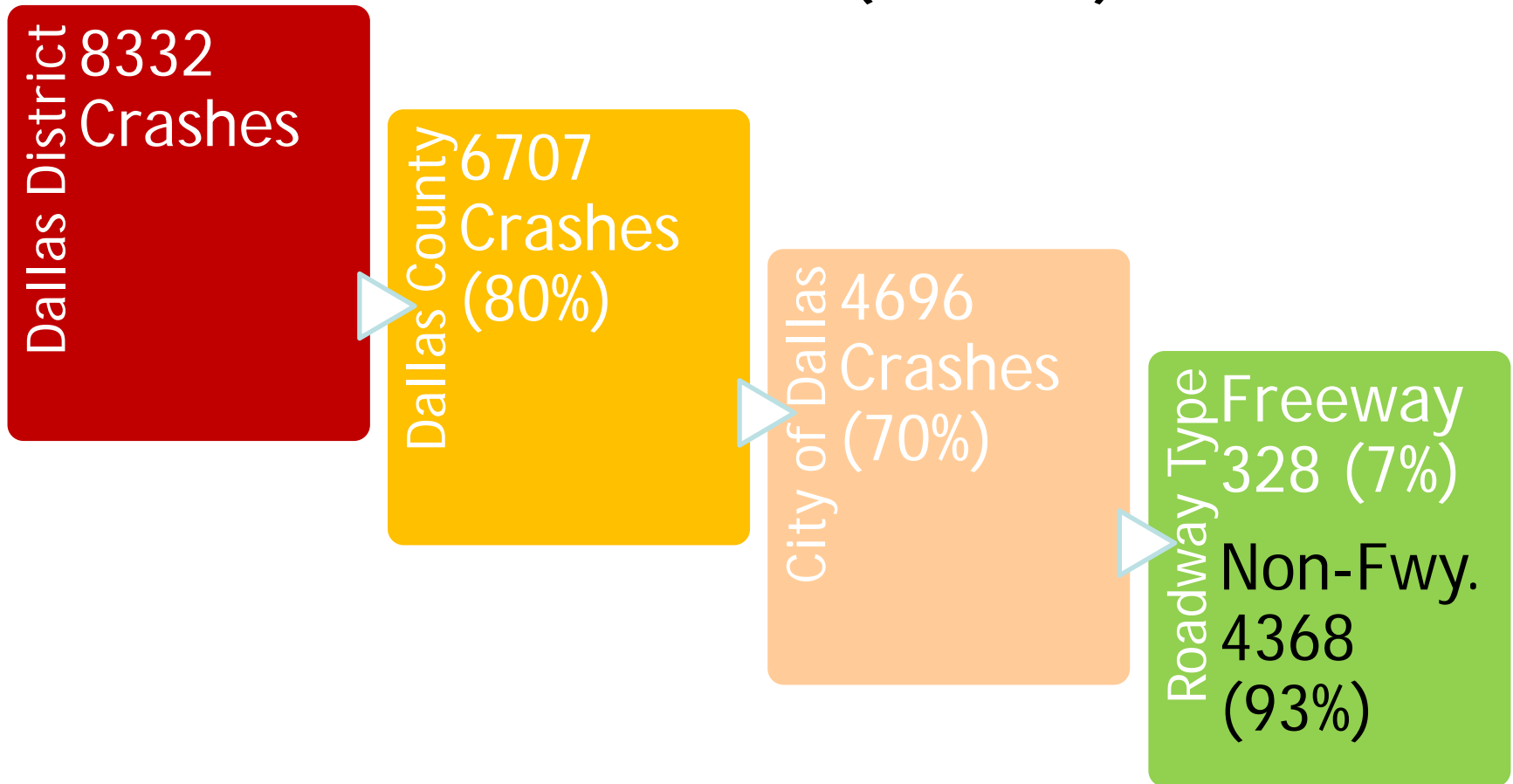


Understanding Dallas District Pedestrian Safety Issues (Part 2) & Applying Machine Learning to Crash Typing Process





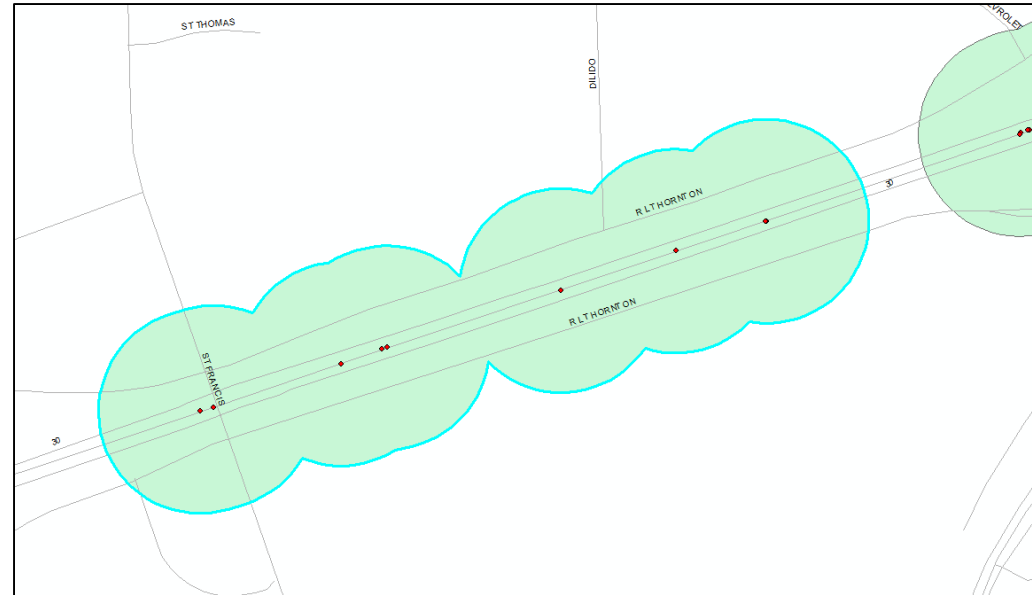
Dallas District Pedestrian Crashes 2008-2017 (KABC)



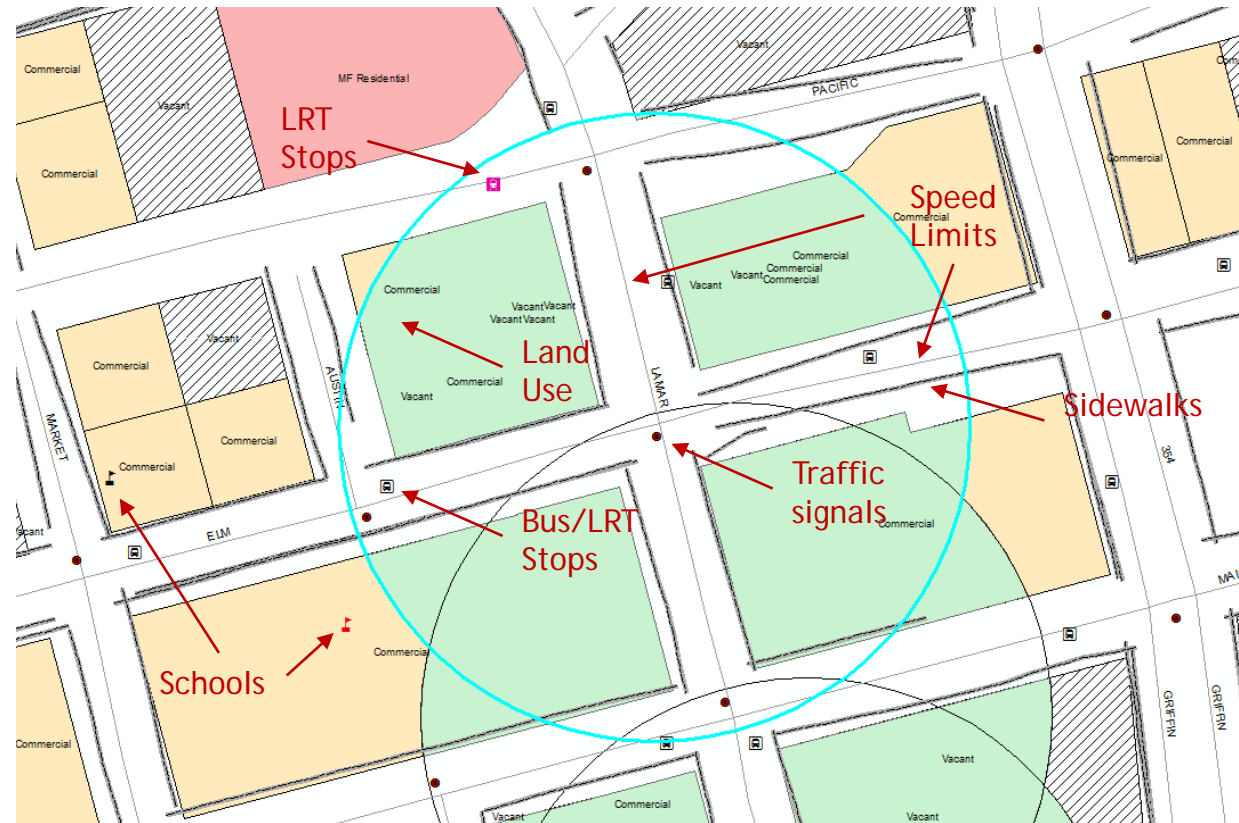


Dallas Freeway Ped. Crash Clusters

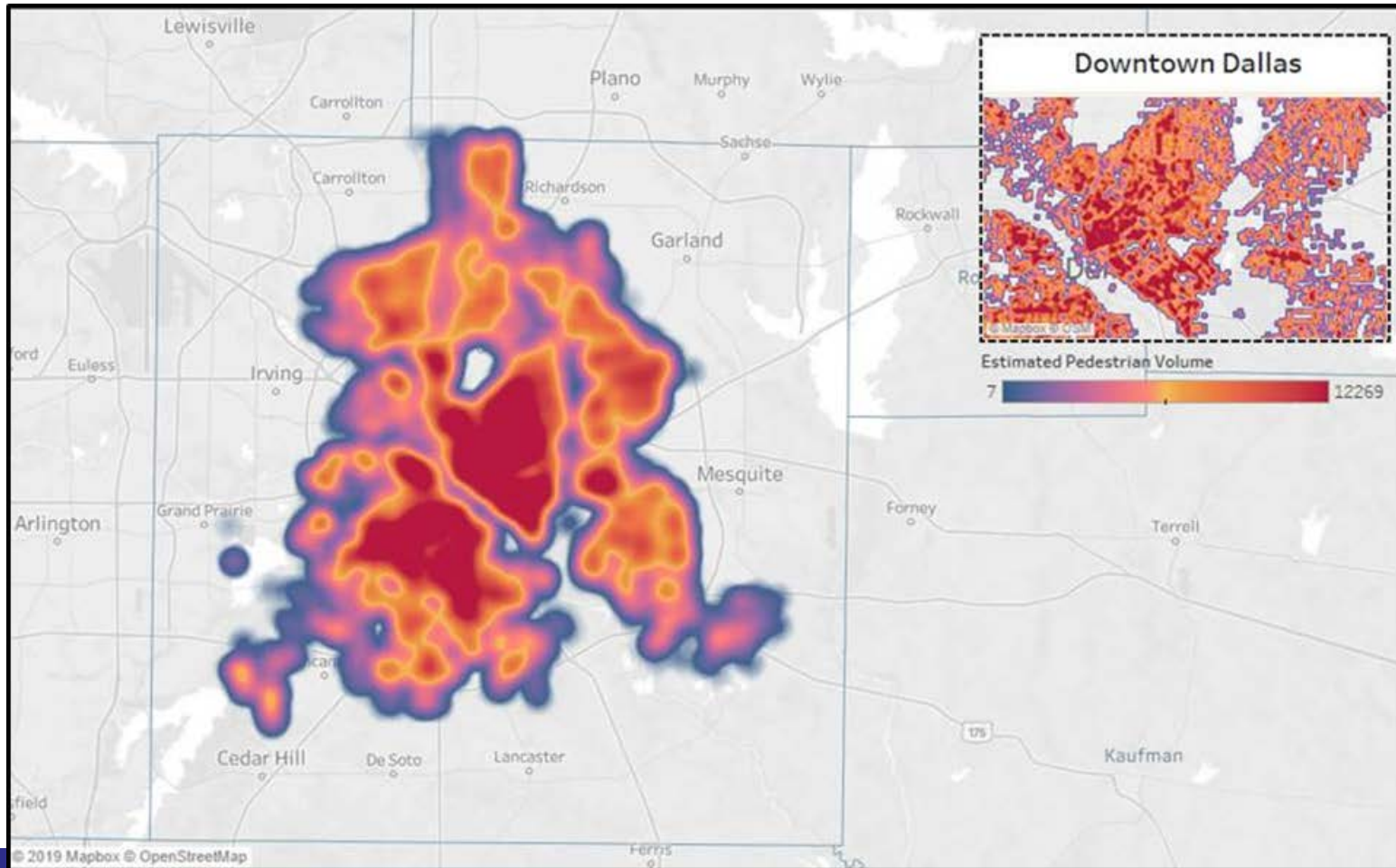
- 59 clusters (±600 ft.)
- IH30, St. Francis-Dilido
- #1 by Crash Frequency
- 10 crashes (1/year)
- TxDOT constructed Pedestrian Bridge (\$2.25M)



Estimating Pedestrian Exposure (Volume)



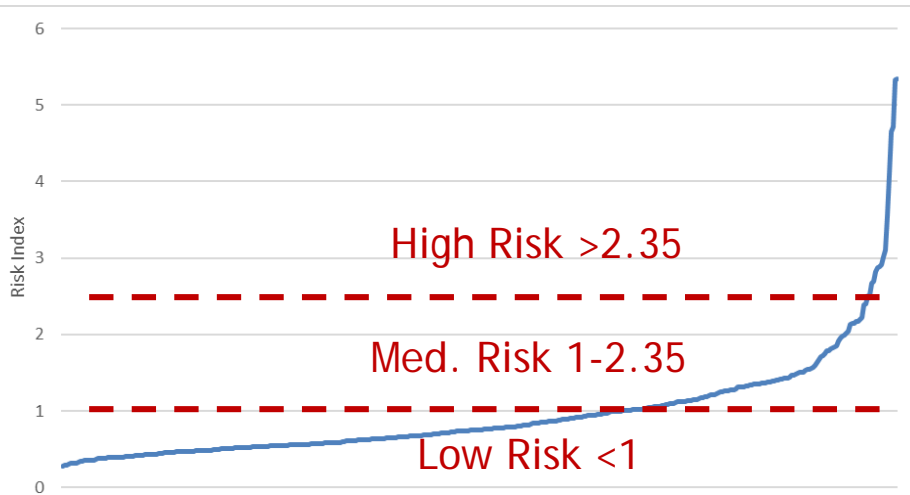
Daily Estimated Intersection Pedestrian Volumes



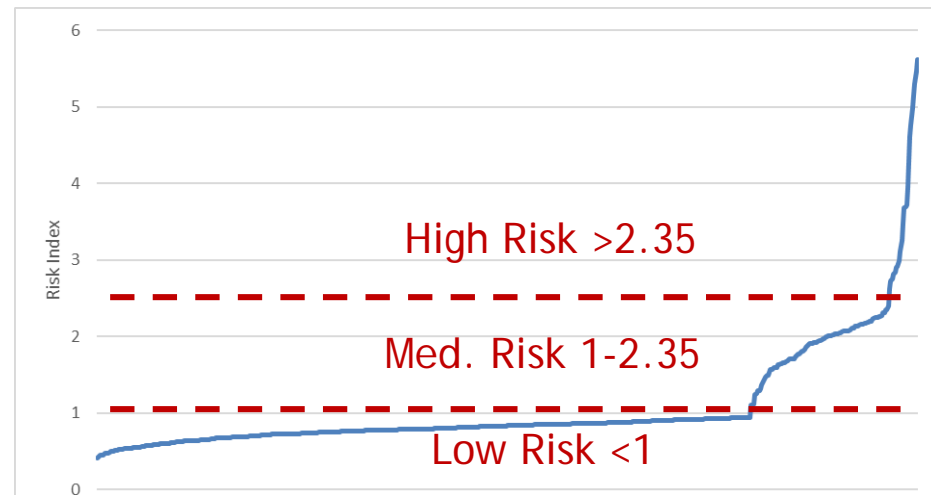


Safety Risk Index

Safety Risk Index = Expected (EB)/Predicted (SPF)



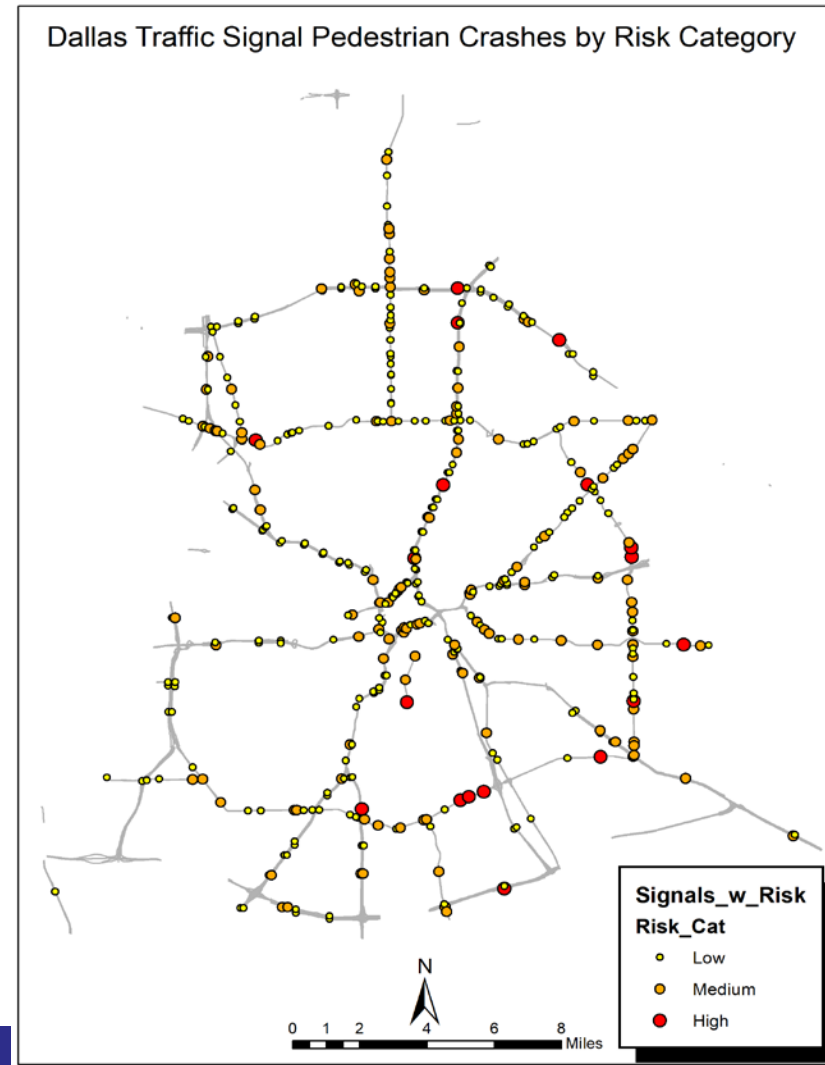
Signalized (On-System)



Stop-controlled (On-System)

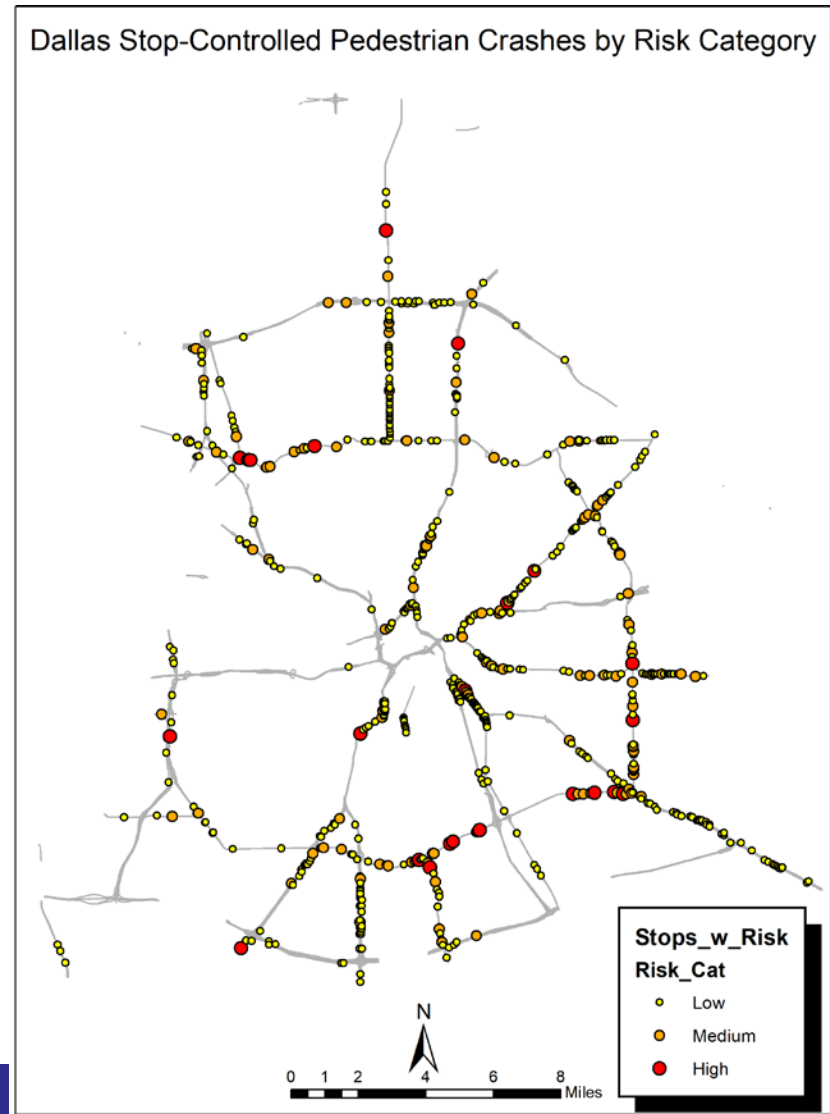
High Risk Dallas Signals (on system)

| Street1 | Street2 | Risk Index |
|----------------------|----------------------|------------|
| LBJ WBSR | Skillman | 5.34 |
| Corinth | Morrell | 5.33 |
| Buckner | John West | 4.71 |
| Great Trinity Forest | Jim Miller | 4.65 |
| COMMUNITY | NORTHWEST | 4.09 |
| Scyene | St Augustine | 3.55 |
| Bonnie View | Great Trinity Forest | 3.11 |
| Central SBSR | Lemmon | 3.01 |
| Bonnie View | LBJ EBSR | 2.91 |
| Great Trinity Forest | Wadsworth | 2.89 |
| Central NBSR | Mockingbird | 2.87 |
| Bonnie View | Ledbetter | 2.82 |
| Coit RD | IH 635 WB FR | 2.70 |
| BUCKNER | GROVECREST/MATTISON | 2.67 |
| Buckner | Chenault | 2.51 |
| FOREST LN | CENTRAL SBSR | 2.51 |
| Buckner | Poppy | 2.40 |
| ANN ARBOR | R L THORNTON NBSR | 2.38 |



High Risk Dallas Stops (on system)


| Street1 | Street2 | Risk Index |
|--------------------------|---------------|------------|
| E LEDBETTER DR | CORRIGAN DR | 5.62 |
| W NORTHWEST HWY | STARLIGHT RD | 5.47 |
| E LEDBETTER DR | CORRIGAN AVE | 5.31 |
| S BUCKNER BLVD | NORVELL DR | 5.15 |
| GREAT TRINITY FOREST WAY | STONEPORT DR | 4.98 |
| S LANCASTER RD | ARDEN RD | 4.77 |
| GREAT TRINITY FOREST WAY | CRANFILL DR | 4.62 |
| HARRY HINES BLVD | STOREY LN | 3.95 |
| GREAT TRINITY FOREST WAY | S MURDEAUX LN | 3.72 |
| S CENTRAL SERV NB | JORDAN ST | 3.70 |
| N CENTRAL SERV NB | BONNER DR | 3.68 |
| W NORTHWEST HWY | KENDALE DR | 3.49 |
| GREAT TRINITY FOREST WAY | HILLBURN DR | 3.25 |
| GREAT TRINITY FOREST WAY | HILLBURN DR | 3.12 |
| PRESTON RD | BERRY TRL | 2.99 |
| EAST GRAND AVE | CORONADO AVE | 2.92 |
| W NORTHWEST HWY | STARLIGHT RD | 2.90 |
| E LEDBETTER DR | KILDARE AVE | 2.84 |
| S WALTON WALKER SERV NB | PREAKNESS LN | 2.82 |
| EAST GRAND AVE | PHILIP AVE | 2.75 |
| MARVIN D LOVE SERV SB | GLENNLYONS DR | 2.73 |
| GREAT TRINITY FOREST WAY | SATINWOOD DR | 2.62 |
| S BUCKNER BLVD | TILLMAN ST | 2.40 |
| S R L THORNTON SERV NB | E PAGE AVE | 2.35 |





Applying Machine Learning to Pedestrian Crash Typing Process

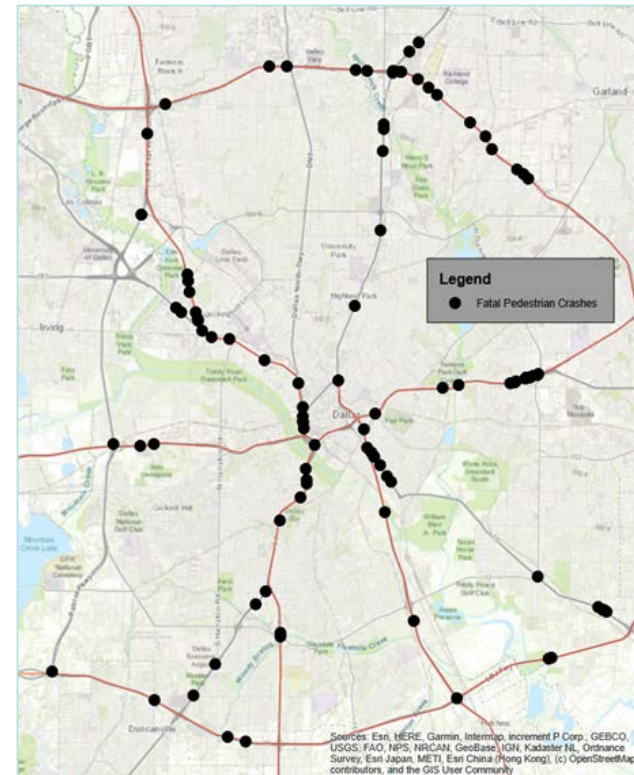
- Crash databases contain insufficient details about ped/bike crashes
- Crash details are typically in crash narratives and diagrams
- Objective: develop framework for applying machine learning to classify ped crashes from the unstructured textual content
 - intended vs. unintended
 - driver at-fault or pedestrian at-fault
 - 55 crash types (in progress)




Applying Machine Learning to Crash Typing Process

Dallas Fatal (K) Pedestrian Crash Data

- 128 Freeway Ped. Fatal crashes, 2008-2017
- 101 crash narratives reviewed (25 missing + 2 not readable)
- 65 (51%) Intended vs. 35 (27%) Unintended
- Unintended is defined as:
 - person struck and associated with a vehicle
 - a worker actively performing their duty at the scene






Applying Machine Learning to Crash Typing Process

Dallas K Crash Data (Confusion Matrix)

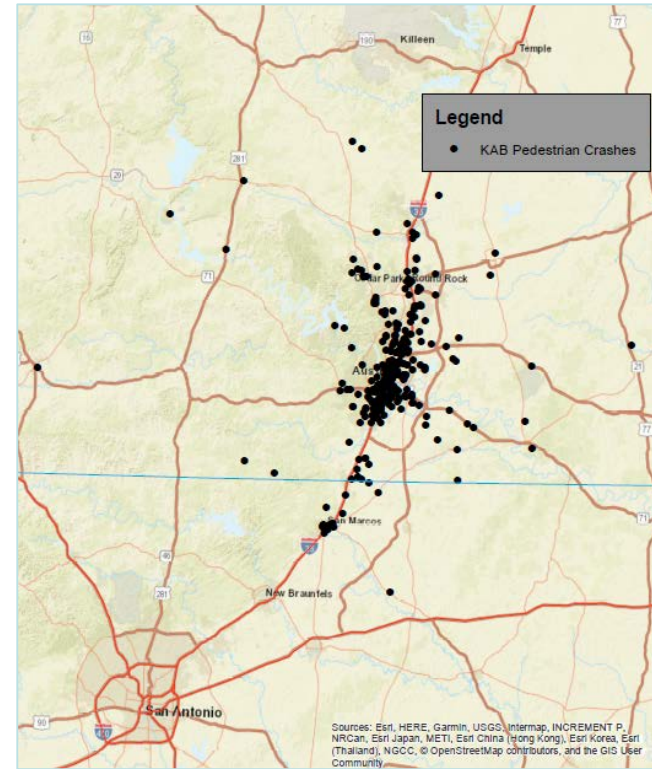
| Model | Intension Class (Observed) | Training (60 crashes) | | Test (30 crashes) | |
|---------|----------------------------|-----------------------|------------------------|----------------------|------------------------|
| | | Intended (Predicted) | Unintended (Predicted) | Intended (Predicted) | Unintended (Predicted) |
| SVM | Intended | 26 | 14 | 10 | 6 |
| | Unintended | 8 | 12 | 6 | 8 |
| RF | Intended | 25 | 15 | 10 | 6 |
| | Unintended | 8 | 12 | 6 | 8 |
| XGBoost | Intended | 29 | 11 | 12 | 4 |
| | Unintended | 6 | 14 | 5 | 9 |




Applying Machine Learning to Crash Typing Process

Austin KAB Crash Data

- 295 KAB Ped crashes on all roadways, 2018
- 45% Motorist at-fault vs. 42% Ped at-fault
- At-fault Examples:
 - Motorist: ped crossing & struck by turning vehicle
 - Pedestrian: ped crossing & struck and vehicle was not turning or ped dashed or dart-out






Applying Machine Learning to Crash Typing Process

Austin KAB Crash Data (Confusion Matrix)

| Model | At-Fault Class (Observed) | Training (205 crashes) | | Test (90 crashes) | |
|---------|---------------------------|------------------------|------------------------|----------------------|------------------------|
| | | Motorist (Predicted) | Pedestrian (Predicted) | Motorist (Predicted) | Pedestrian (Predicted) |
| SVM | Motorist | 70 | 35 | 31 | 16 |
| | Pedestrian | 44 | 56 | 22 | 21 |
| RF | Motorist | 68 | 37 | 30 | 17 |
| | Pedestrian | 46 | 54 | 22 | 21 |
| XGBoost | Motorist | 75 | 30 | 75 | 30 |
| | Pedestrian | 39 | 61 | 39 | 61 |



Applying Machine Learning to Crash Typing Process

- XGBoost technique performed best in classifying pedestrian crash types
- Dallas K Crashes: Intended vs. Unintended (accuracy up to 72% for training data and 70% for test data)
- Austin KAB Crashes: Pedestrian at-fault vs. Motorist at-fault (accuracy up to 66% for training data and 65% for test data)