

PBIC Livable Communities Webinar Series

Tools for Pedestrian and Bicycle Safety and Exposure Analysis



David Ragland, Founding Director, UC Berkeley SafeTREC

John Bigham, GIS Program Manager, SafeTREC

Robert Schneider, Researcher, SafeTREC

June 5, 1 pm



Pedestrian and Bicycle Information Center



Today's Presentation

- ⇒ **Introduction and housekeeping**
- ⇒ **Audio issues?** Dial into the phone line instead of using “mic & speakers”
- ⇒ **PBIC Trainings and Webinars**
<http://www.walkinginfo.org>
- ⇒ **Registration and Archives at**
<http://walkinginfo.org/webinars>
- ⇒ **Questions at the end**



Webinar

Tools for Pedestrian and Bicycle Safety and Exposure Analysis Tuesday, June 5, from 10-11:30am (PDT)



❖ Introduction

- ❖ David Ragland, UC Berkeley SafeTREC
[❖ www.tsc.berkeley.edu](http://www.tsc.berkeley.edu)



Topics

- SafeTREC (Overview)
- Pedestrian and Bicyclist Safety (Examples)
- Data Reports and Data Tools (Examples)
- Data steps for pedestrian and bicyclist safety

The logo graphic consists of a vertical black line intersecting a horizontal black line. To the left of the intersection, there are three overlapping squares: a blue square at the top, a light blue square in the middle, and a green square at the bottom. The text 'SafeTREC' is positioned to the right of the vertical line, starting from the top of the horizontal line.

SafeTREC

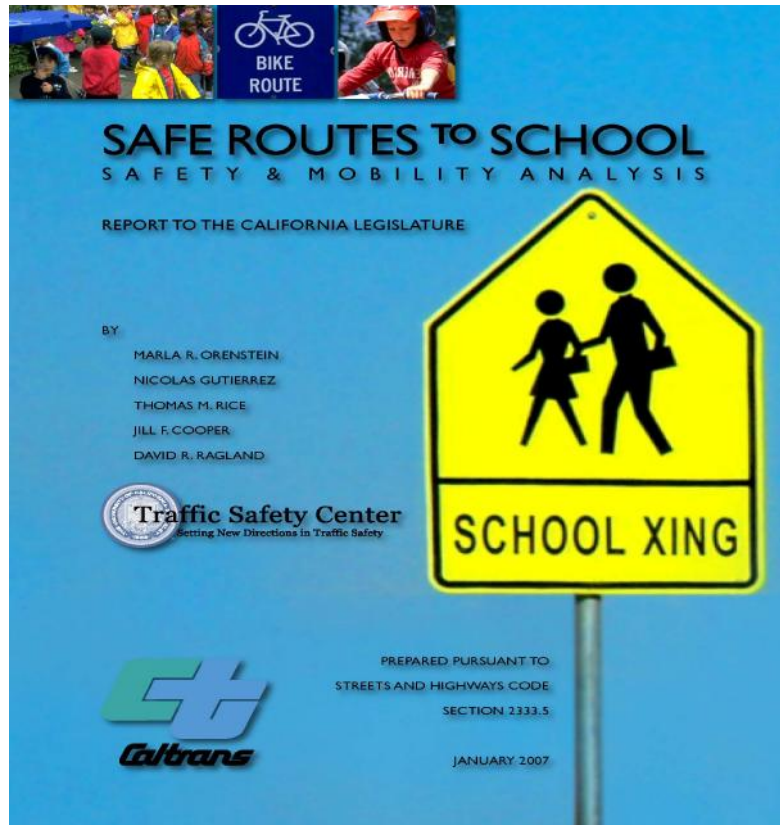
- Founded in 2000 with a grant from OTS to reduce traffic fatalities and injuries through multi-disciplinary collaboration in education, technical assistance, and outreach.
- UC Partners include Public Health, Transportation Engineering, City and Regional Planning
- Funders have included NHTSA, OTS, Caltrans, local cities, agencies, foundations



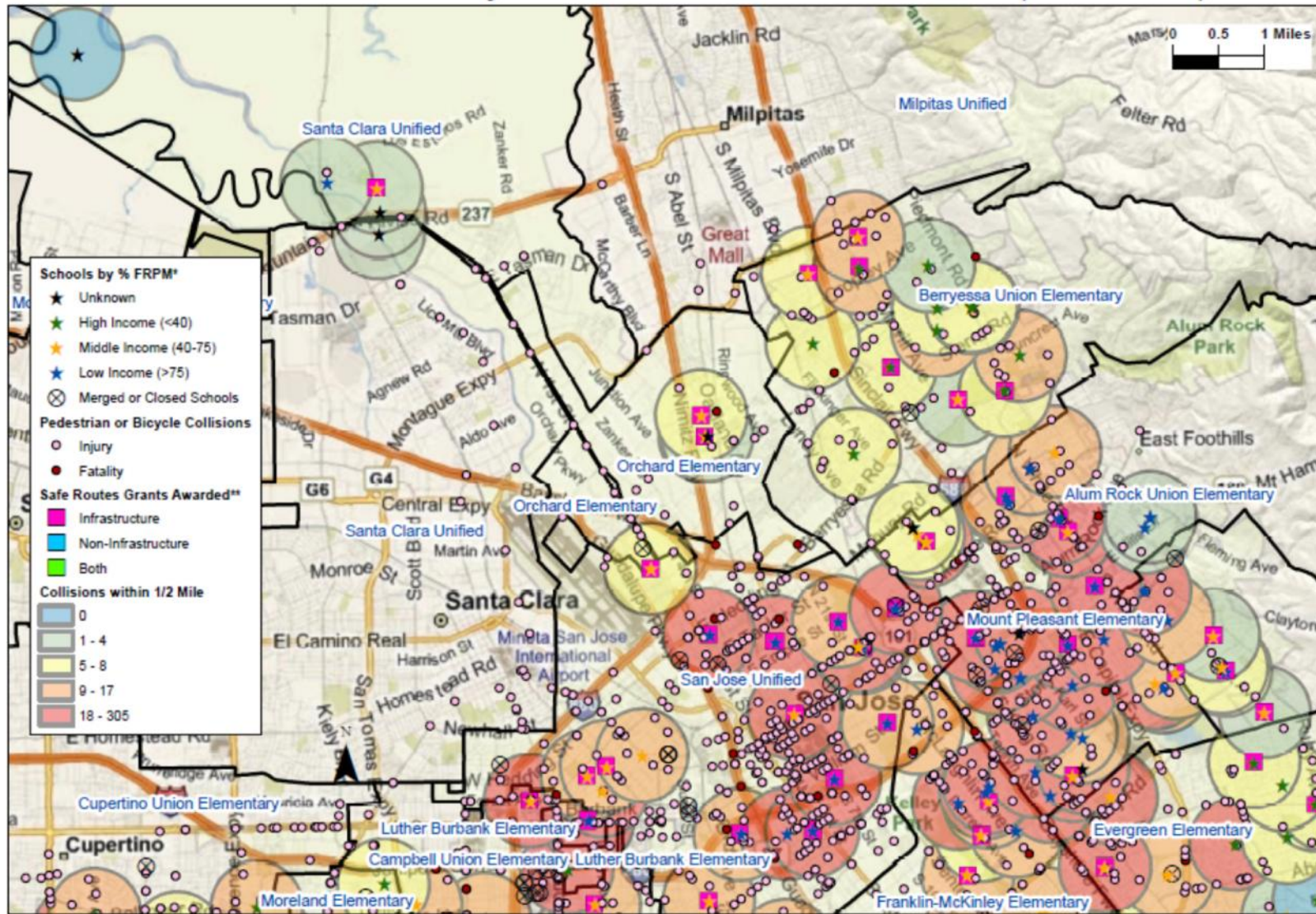
Topics

- SafeTREC (Overview)
- Pedestrian and Bicyclist Safety (Examples)
- Data Reports and Data Tools (Examples)
- Data steps for pedestrian and bicyclist safety

Safe Routes to School Safety and Mobility Analysis: Report to the California Legislature



San Jose - Pedestrian or Bicycle Collisions Near School Sites (2006-2008)



*Schools classified according to percentage of students eligible for the Free/Reduced Price Meal Program (2008).
 **Safe Routes to School awards include state and federal funding from 2005 - 2010.

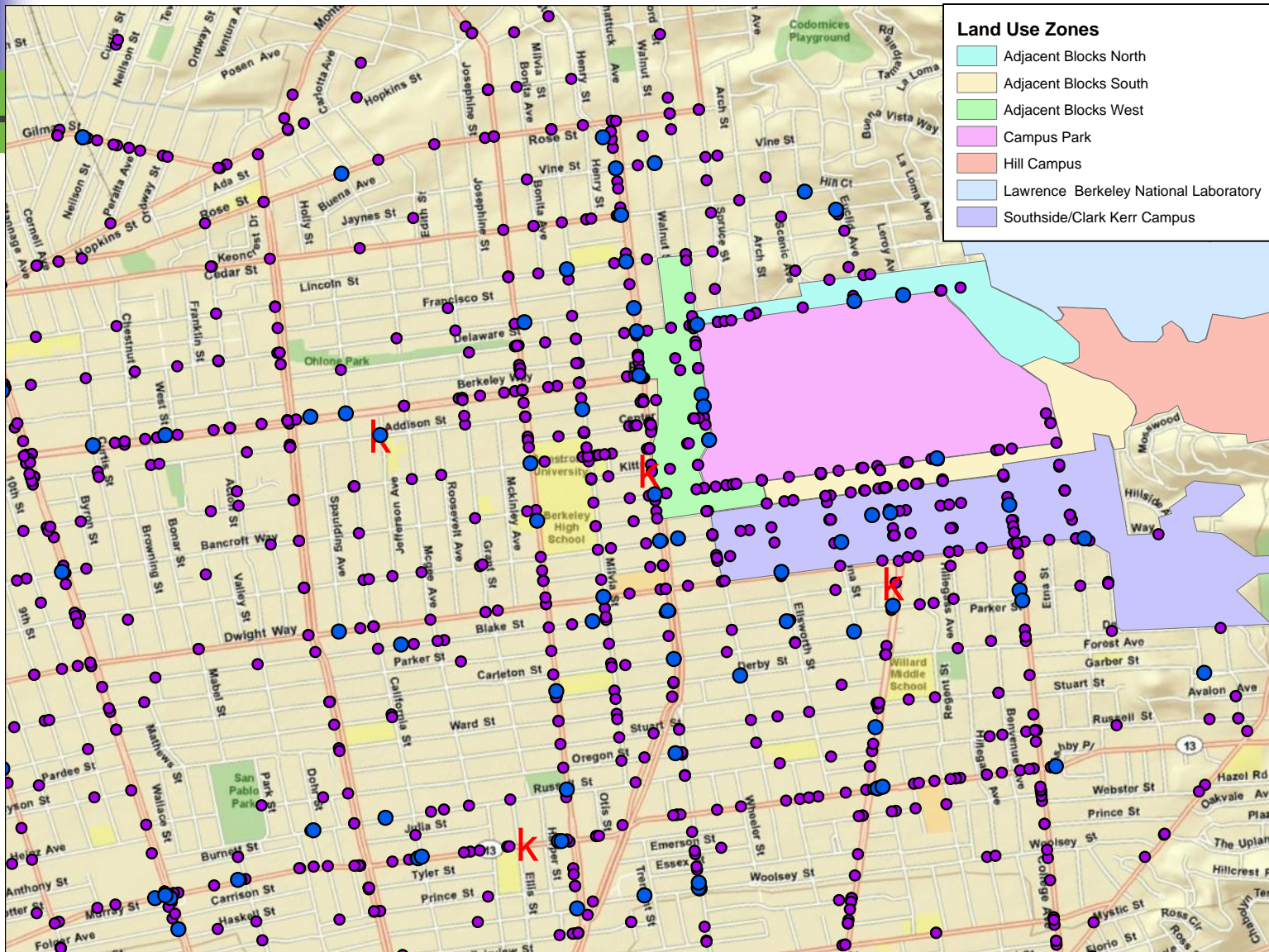
Sources: California Public School Database; SWITRS 2006-2008; Bing Maps



SafeTREC

UC Campus Periphery Project

K Fatal
 ● Severe Injury
 ● Minor Injury



Barriers to Transit among Seniors

TRANSIT TRAVEL TRAINING PROGRAMS A HOW-TO GUIDE





Topics

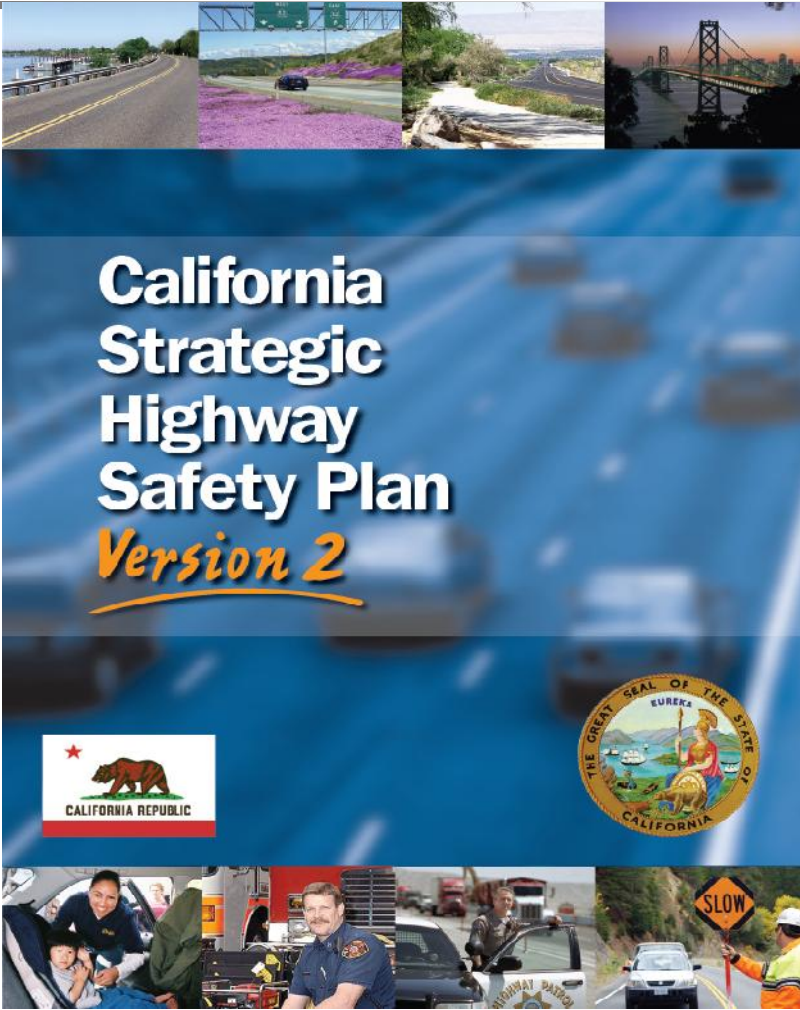
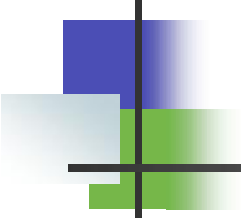
- SafeTREC (Overview)
- Pedestrian and Bicyclist Safety (Examples)
- Data Reports and Data Tools (Examples)
- Data steps for pedestrian and bicyclist safety



Strategic Highway Safety Plan (Data Support Contract)

- Roles
 - Data Support
 - Provide standard and customized data analyses to each Challenge Area
 - 5% Report
 - Local Roads
 - Challenge area participation

SHSP Version 2



5% Report



The screenshot shows a web browser window displaying the FHWA Safety website. The page title is "California 2008 Five Percent Report - FHWA Safety". The browser address bar shows the URL "http://safety.fhwa.dot.gov/fivepercent/08rca.htm". The page features a navigation menu with links for Home, About, Subject Index, Events, Links, Newsletters, and Contact. A search bar is located on the left side. The main content area includes a section for "California 2008 Five Percent Report" with a brief description of the report's purpose and a disclaimer regarding discovery and admission into evidence. Below this, there is a section for "The 2008 California 5 Percent Report Highway Safety Improvement Program August 14, 2008" with contact information for the California Department of Transportation and the California State Association of Counties.

California 2008 Five Percent Report - FHWA Safety - Windows Internet Explorer

http://safety.fhwa.dot.gov/fivepercent/08rca.htm

California 2008 Five Percent Report - FHWA Safety

U.S. Department of Transportation
Federal Highway Administration

FHWA Home | Feedback

FHWA Safety

Home | About | Subject Index | Events | Links | Newsletters | Contact

Search Safety:

Go

Facts/Statistics/Data
Policy & Guidelines
Training & Education
Safety Research
Tools & Technology
Newsletters

State Programs
Local Programs
Community Resources
Road Safety Audits (RSA)

Interactions
Pedestrians & Bicyclists
Safe Routes to School
Roadway Departure

Geometric Design
Motorcyclist Advisory Council (MAC-FHWA)
Nighttime Visibility
Older Road Users
Railroad Xings
Roadside Hardware
Rumble Strips
Transportation Safety Planning
Speed Management
Work Zones

Home > Five Percent Reports

California 2008 Five Percent Report

This report is in response to the Federal requirement that each state describe at least 5 percent of its locations currently exhibiting the most severe highway safety needs, in accordance with Sections 148(c)(1)(D) and 143(g)(3)(A), of Title 23, *United States Code*. Each state's report is to include potential remedies to the hazardous locations identified, estimated costs of the remedies, and impediments to implementation of the remedies other than costs. The reports included on this web site represent a variety of methods utilized and various degrees of map coverage. Therefore, this report cannot be compared with the other reports included on this Web site.

Protection from Discovery and Admission into Evidence—Under 23 U.S.C. 148(c)(4) information collected or compiled for any purpose directly relating to this report shall not be subject to discovery or admitted into evidence in a Federal or State court proceeding or considered for other purposes in any action for damages arising from any occurrence at a location identified or addressed in the reports.

Additional information, including the specific legislative requirements, can be found in the guidance provided by the Federal Highway Administration,
<http://safety.fhwa.dot.gov/safetyedu/fiveguidance.htm>

The 2008 California 5 Percent Report Highway Safety Improvement Program August 14, 2008

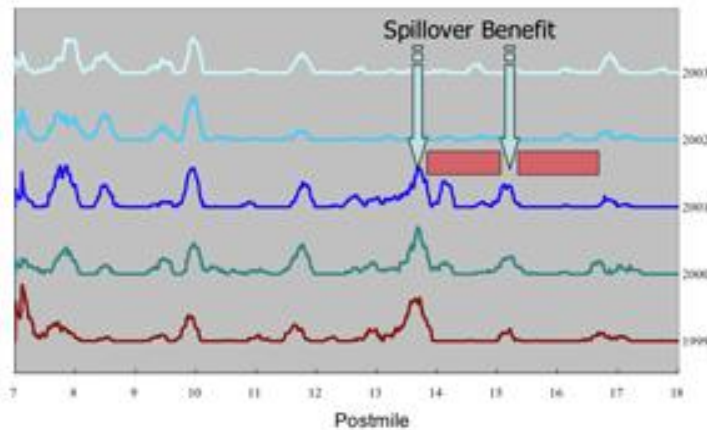
Prepared by:
The California Department of Transportation
1120 N Street
Sacramento, CA 95814

In Partnership with the:
California State Association of Counties
1100 K Street, Suite 101
Sacramento, CA 95811

Internet 100%

Continuous Risk Profile (CRP)

Continuous Risk Profile (CRP) Demonstration Webinar for Caltrans District Leaders

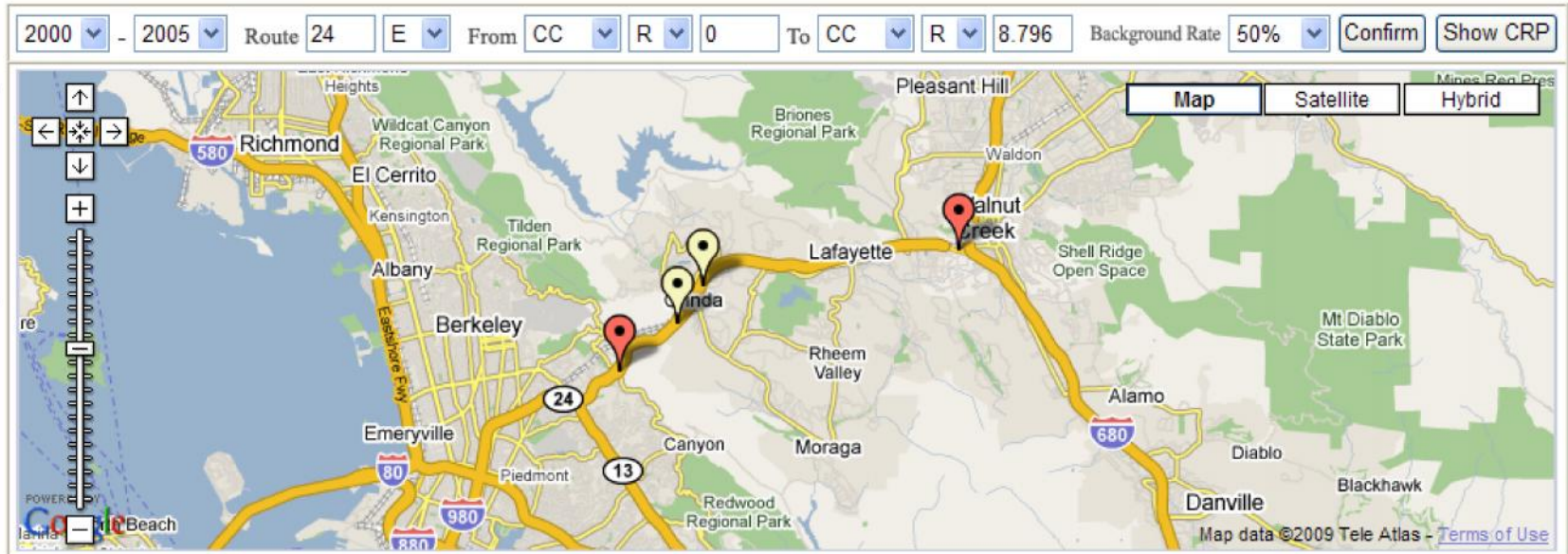


Background: Many existing methods for detecting collision concentration locations (such as the conventional sliding moving window approach) require segmentation of roadways and assume traffic collision data are spatially uncorrelated, resulting in false positives and false negatives.

CRP Capabilities:

- does not require segmentation of roadways
- spatial correlation in the collision data does not affect results
- lower false positive rates
- proactive identification of locations
- plots are highly reproducible over the years
- can capture “spillover benefit” of countermeasures
- simple to use.

Continuous Risk Profile Analysis



Field Report

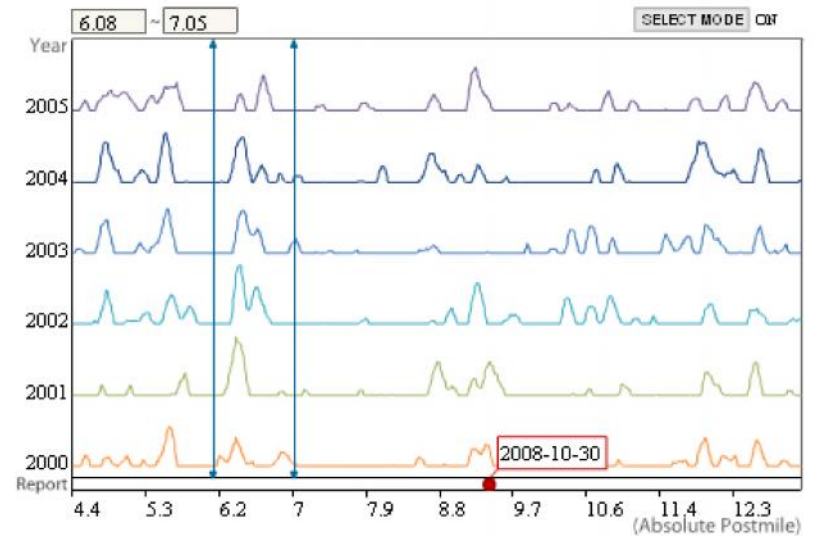


County	CC	Route	24E (Postmile: R5.046)
Date	2008-01-01	Time	19:00
Coordinate Location	37.89129, -122.14302		

Download File

[Sunset.jpg](#)

Description of file: Description of file



Collision Distribution

Primary Collision Factor

Type of Collision

Severity

Show CRP Result

2006 1 Before&After Report | 2006 Proactive Detection Report 14



Topics

- SafeTREC (Overview)
- Pedestrian and Bicyclist Safety (Examples)
- Data Reports and Data Tools (Examples)
- Data steps for pedestrian and bicyclist safety

Data steps for pedestrian and bicyclist safety

	Areas	Examples from SafeTREC	Presenter
1.	Crash/injury data	TIMS (geocoding)	John
2.	Data access	Public Access to TIMS	John
3.	Pedestrian/bicycle volume	Location-based analyses	Bob
4.	Hazard assessment	Bayesian analysis, Continuous Risk Profile	
5.	Causal analysis / countermeasure assessment	Collision modification factors	
6.	Benefit/cost	Safety Index	John
7.	Integration with larger roadway data systems	Integrate active transportation data with Caltrans data system	

PBIC Webinar—Tools for Pedestrian and Bicycle Safety and Exposure Analysis

John Bigham
jbigham@berkeley.edu

Safe Transportation Research and Education Center
University of California, Berkeley
www.safetrec.berkeley.edu

Topics

- Overview of TIMS
- Accessing and visualizing pedestrian and bicycle collision data in TIMS
 - SWITRS Query & Map
 - SWITRS GIS Map
- Benefit-cost calculator for safety countermeasures

Transportation Injury Mapping System (TIMS)

- Provides data and mapping analysis tools and information for traffic safety related research, policy and planning.
- Free account application, open to everyone
- <http://tims.berkeley.edu>



SWITRS

- California Statewide Integrated Traffic Records System
- Maintained by California Highway Patrol
- Approximately 200,000 injury collisions each year

SWITRS Query & Map Tool

- Data query focused application
 - Quick results, quick refresh
- One page summary statistics
- Download collision, party, victim files
- Google Maps collision display
 - 5,000 collisions limit
 - Collision points clustered until zoomed in

SWITRS GIS Map

- Map-centric collision viewing with other data layers (census tracts, TAZ, schools, etc.)
- Same collision query UI as Query & Map tool
- 1,000 collisions display limit
- Focused collision spatial selection tools
 - Drawing
 - Buffer (intersection or corridor)
 - Region (TAZ, census tract, zip code)

TIMS Mapping Applications

- DEMO

COUNTY: LOS ANGELES

Map interface showing collision data for Los Angeles County. The map displays major roads, cities, and collision points. The interface includes a sidebar with filters and controls, and a right-hand panel with map settings and results.

Collision Factors Query

Choose collisions to display.

City: LOS ANGELES

Show the city layer.

From: 01-01-2010

To: 12-31-2010

More Factors >>

Show All Collisions

Refresh Collisions

Symbolize Collisions

Involved with

- Pedestrian
- Bicycle
- Motorcycle

Severity

- Fatal
- Severe Inj.
- Other Vis. Inj.
- Complaint of Pain

Select Collisions

Other Functions

Locate Address

Basemap

Switch Basemap

Map Contents

- Census Tracts
- Institutions
- Landmarks
- Urban Areas
- School Districts
- Traffic Analysis Zones
- Zip Codes

Refresh Map Contents

Current Results

Collision Display Status

1000 records were mapped.

Summary Statistics

Measurement Distance

0 km. | 0 mi.

Message:

COUNTY: LOS ANGELES

The screenshot displays the TIMS Transportation Injury Mapping System interface. At the top, the county is set to "LOS ANGELES". The main map area shows a street grid in Los Angeles with numerous collision points marked by colored squares. The left sidebar contains several sections: "More Factors >>", "Show All Collisions", "Refresh Collisions", "Symbolize Collisions" (with checkboxes for "Involved with" and "Severity"), and "Select Collisions" (with options for "Drawing", "Buffer", and "Area"). The "Buffer Options" section shows a distance of 0.5 miles and a count of 1. The right sidebar includes "Map Contents" (listing Census Tracts, Institutions, Landmarks, Urban Areas, School Districts, Traffic Analysis Zones, and Zip Codes), "Current Results" (showing "Collision Display Status" with 98 records mapped and "Measurement Distance" of 0 km), and "Summary Statistics". A "Refresh Map Contents" button is also present. The bottom of the interface features a scale bar and a message: "Message: Buffer Process Prepared. Select drawing option and draw on map." The Esri logo is visible in the bottom right corner of the map area.

Message: Buffer Process Prepared. Select drawing option and draw on map.

Benefit-Cost Calculator

- Evaluate benefit-cost of potential safety countermeasures
 - Benefit = reduction in comprehensive collision costs
 - Cost = construction costs
- Required for agencies to use that are applying for Highway Safety Improvement Program (HSIP) funds in California
- Includes pedestrian and bicycle specific countermeasures

Benefit-Cost Calculator

- DEMO

Local Roadway Safety Manual

- Partnership of Caltrans, FHWA and SafeTREC
- Great resource for conceptual guidance
 - Identifying safety issues
 - Safety data analysis
 - Countermeasures selection and b/c analysis
- http://www.dot.ca.gov/hq/LocalPrograms/HSIP/apply_now.htm

Import into Benefit-Cost Calculator

Home
About
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Development

Benefit / Cost Calculator

1
2
Countermeasure(s) Selection
3
4

New Calculation
Load
Save
?

Crash Data Time Period: From To Years

▶ Countermeasure 1

▶ Countermeasure 2

▼ **Install pedestrian countdown signal heads**

A. Input Countermeasure

Select Countermeasure
Clear Countermeasure

CM Number	Project Type	Countermeasure	Crash Type	CRF	Life
S19	Ped and Bike	Install pedestrian countdown signal heads	Ped & Bike	25	20

B. Input Crash Data

Manual Entry
Import File
Clear Crash Data

Crash Type	Fatality (Death)	Severe Injury	Injury - Other Visible	Injury - Complaint of Pain	Property Damage Only	Total
Ped & Bike	0	0	5	3	0	8

Annual Benefit : Life Benefit :

Current Results

Application ID:
07-Pomona

From: 01/01/2001
To: 12/31/2009
Years: 9

3.Install pedestrian countd...
Type: Ped and Bike
Crf: 25
Life: 20
Annual Benefit: \$14,714
Life Benefit: \$294,278
Total Cost: \$1,000,000 (100%)

Select Countermeasure ✕

Signalized

NonSignalized

Roadway

CM Number	Project Type	Countermeasure	Crash Type	CRF	Life
R29	Operation / Warning	Install curve advance warning signs (flashing beacon)	All	30	10
R30	Operation / Warning	Install dynamic / variable speed warning signs	All	30	10
R31	Operation / Warning	Install delineators, reflectors and/or object markers	All	15	10
R32	Operation / Warning	Install edge-lines and centerlines	All	25	10
R33	Operation / Warning	Install no-passing line	All	45	10
R34	Operation / Warning	Install centerline rumble strips / stripes	All	20	10
R35	Operation / Warning	Install edgeline rumble strips / stripes	All	15	10
R36	Ped and Bike	Install bike lanes	Ped & Bike	35	20
R37	Ped and Bike	Install sidewalk / pathway (to avoid walking along roadway)	Ped & Bike	80	20
R38	Ped and Bike	Install pedestrian crossing (with enhanced safety features)	Ped & Bike	30	10
R39	Ped and Bike	Install raised pedestrian crossing	Ped & Bike	35	10
R40	Animal	Install animal fencing	Animal	80	20
R41	Truck	Install truck escape ramp	All	20	20

Selected Countermeasure ⊙

CM Number	Project Type	Countermeasure	Crash Type	CRF	Life
R37	Ped and Bike	Install sidewalk / pathway (to avoid walking along roadway)	Ped & Bike	80	20

Yes

Cancel

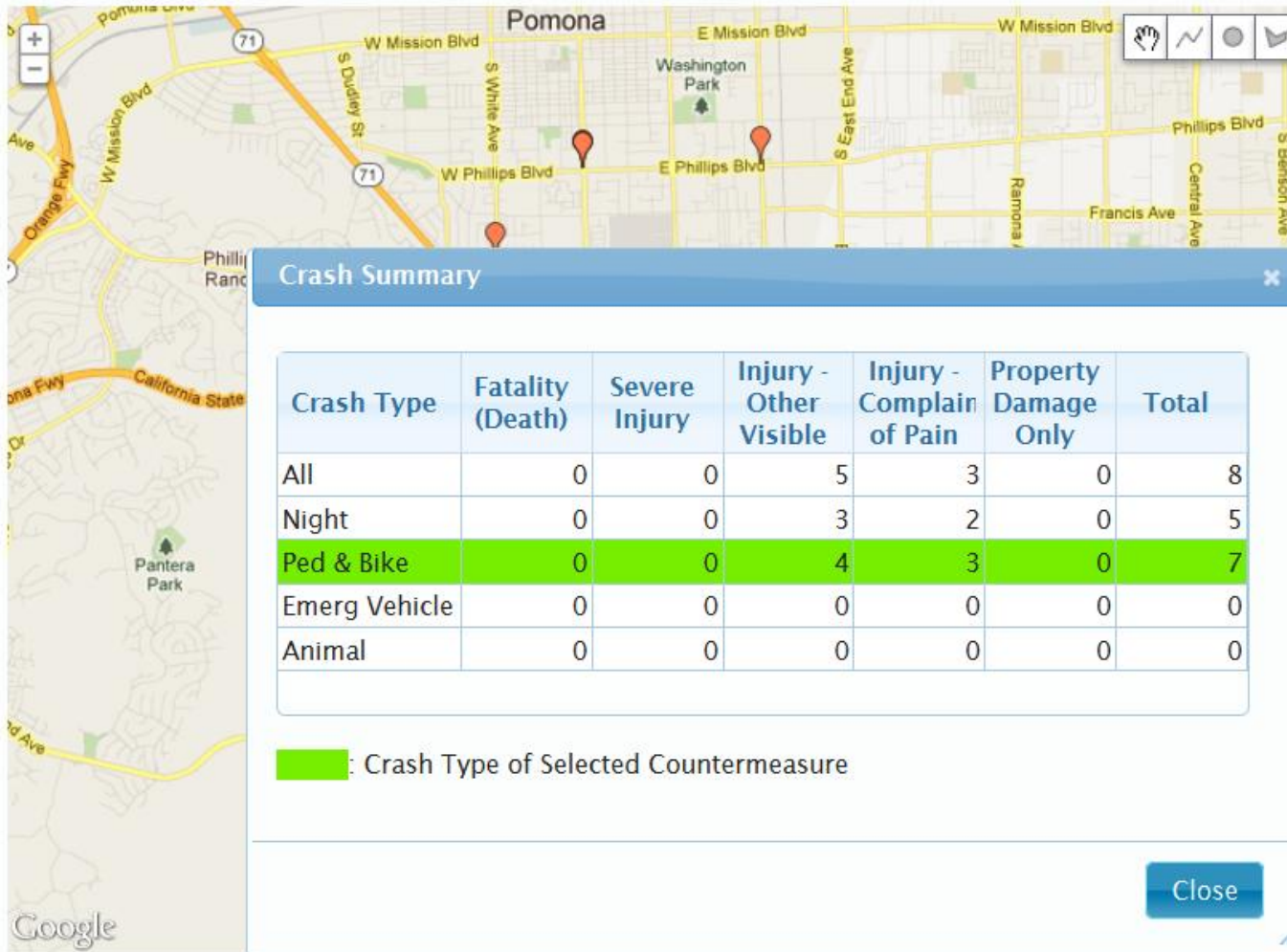
Import Crash Data file

This map will not be saved within the project. Please print the map after displaying the crash locations.

Choose File

?

7 of 7 (100%) crash(es) mapped. (Crash Type: Ped & Bike)



Project Information

Application ID:
07-Pomona
Crash Data: 9 years
From 01/01/2001
To 12/31/2009

Countermeasure 3

CM Number: S19
Mod: Ped and Bike
Name: Install pedestrian
countdown signal heads
Crash Type: **Ped & Bike**
CRF: 25
Life: 20

- [Red Pin] Fatality - from File
- [Orange Pin] Other - from File
- [Blue Pin] Fatality - User Input
- [Light Blue Pin] Other - User Input

Crash Summary

Close

Print Map

Ok

Cancel

Benefit / Cost Calculator



Result Summary

Print Summary New Calculation Load Save ?

1. Project Information



Application ID: 07-Pomona Version: 2

2. Countermeasures and Crash Data

- Install pedestrian countdown signal heads

CM Number	Project Type	Crash Type	CRF	Life
S19	Ped and Bike	Ped & Bike	25	20

Crash Type	Fatality (Death)	Severe Injury	Injury - Other Visible	Injury - Complaint of Pain	Property Damage Only	Total
Ped & Bike	0	0	5	3	0	8

Annual Benefit	\$14,714
Life Benefit	\$294,278
Cost	\$ 1,000,000
B/C Ratio	0.29

3. Benefit Cost Result

Total Benefit	\$294,278
Total Cost	\$1,000,000
B/C Ratio	0.29

Save as a Final Version Print Summary

Funding Support

- Funding for TIMS was provided by a grant from the California Office of Traffic Safety, through the National Highway Traffic Safety Administration.
- Funding for the B/C Calculator provided by the Caltrans Division of Local Assistance

Questions?

- Thank you!

Pedestrian & Bicycle Volume Modeling for Crash Risk Analysis



Robert Schneider, Ph.D.

UC Berkeley Safe Transportation Research & Education Center

PBIC Webinar—June 2012

How Many People are Walking & Bicycling?



Where are People Walking & Bicycling?



What Types of Locations have the Greatest Risk of Pedestrian or Bicycle Crashes?



Pedestrian Crash Analysis

Mainline Roadway	Intersecting Roadway				Reported Pedestrian Crashes (1996-2005)	
Mission Boulevard	Torrano Avenue				5	
Davis Street	Pierce Avenue				4	
Foothill Boulevard	D Street				1	
Mission Boulevard	Jefferson Street				5	
University Avenue	Bonar Street				7	
International Boulevard	107th Avenue				2	
San Pablo Avenue	Harrison Street				2	
East 14th Street	Hasperian Boulevard				1	
International Boulevard	46th Avenue				3	
Solano Avenue	Masonic Avenue				2	
Broadway	12 th Street				5	

Pedestrian RISK Analysis

Mainline Roadway	Intersecting Roadway	Estimated Total Weekly Pedestrian Crossings	Annual Pedestrian Volume Estimate	Ten-Year Pedestrian Volume Estimate	Reported Pedestrian Crashes (1996-2005)	Pedestrian Risk (Crashes per 10,000,000 crossings)
Mission Boulevard	Torrano Avenue	1,169	60,796	607,964	5	82.24
Davis Street	Pierce Avenue	1,570	81,619	816,187	4	49.01
Foothill Boulevard	D Street	632	32,862	328,624	1	30.43
Mission Boulevard	Jefferson Street	5,236	272,246	2,722,464	5	18.37
University Avenue	Bonar Street	11,175	581,113	5,811,127	7	12.05
International Boulevard	107th Avenue	3,985	207,243	2,072,429	2	9.65
San Pablo Avenue	Harrison Street	4,930	256,357	2,563,572	2	7.80
East 14th Street	Hasperian Boulevard	3,777	196,410	1,964,102	1	5.09
International Boulevard	46th Avenue	12,303	639,752	6,397,522	3	4.69
Solano Avenue	Masonic Avenue	22,203	1,154,559	11,545,589	2	1.73
Broadway	12 th Street	112,896	5,870,590	58,705,898	5	0.85

Which Intersection Features are Associated with Pedestrian Risk? *(Exploratory Research)*

Pedestrian Crossings (+)

While intersections with more pedestrian crossings have more pedestrian crashes, there may be a “safety in numbers” effect (i.e., lower crash risk per crossing).

(Expected Effect: 100% more pedestrian crossings, 49% more crashes)*



Motor Vehicle Volume (+)

There may be a “danger in numbers” effect with mainline motor vehicle volume, but need to explore the influence of congestion and speed.

(Expected Effect: 100% more mainline AADT, >100% more crashes)*



For more information on this study, see:

Schneider, R.J., M.C. Diogenes, L.S. Arnold, V. Attaset, J. Griswold, and D.R. Ragland. “Association between Roadway Intersection Characteristics and Pedestrian Crash Risk in Alameda County, California,” Transportation Research Record: Journal of the Transportation Research Board, Volume 2198, pp. 41-51, 2010.

Which Intersection Features are Associated with Pedestrian Risk?

Number of Right-Turn-Only Lanes (+)

Intersections with more right-turn-only lanes may have longer crossing distances and more complex interactions between drivers and pedestrians.

(Expected Effect: 1 more right-turn-only lane, 53% more crashes)*



Number of Driveway Crossings (+)

Intersections with more non-residential driveway crossings within 50 ft. may have more conflict points; drivers may focus on entering or exiting motor vehicle lanes.

(Expected Effect: 1 more driveway crossing, 33% more crashes)*



Medians (-)

Mainline and cross-street legs with medians have a refuge that allows pedestrians to cross one direction of traffic at a time, which may make crossing safer.

(Expected Effect: Medians on mainline roadway crossings, 75% fewer crashes)*



Which Intersection Features are Associated with Pedestrian Risk?

Number of Commercial Properties (+)

Intersections with more commercial properties within 0.1 miles may have more drivers looking at signs and for parking; more pedestrians may cross between cars.

(Expected Effect: 10 more commercial properties: 45% more crashes)*



Percentage of Residents Under 18 (+)

A greater percentage of young pedestrians within 0.25 miles may indicate that more of the people crossing are less experienced and have higher risk crossing busy streets.

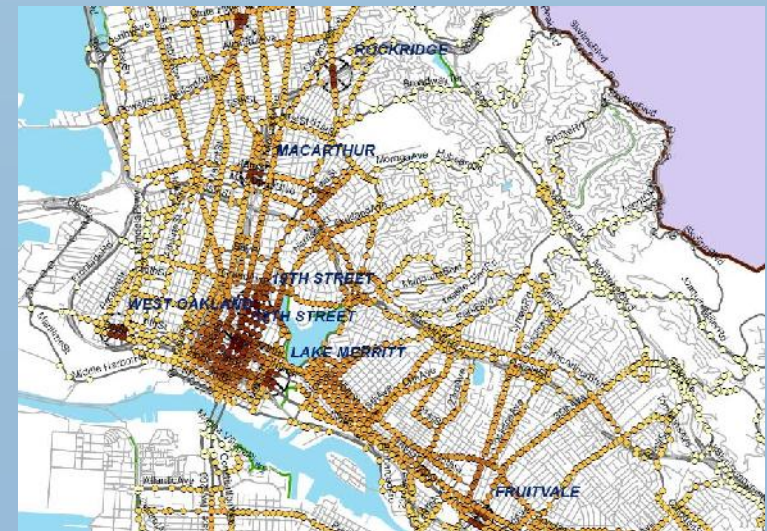
(Expected Effect: 1% more residents under 18: 7% more crashes)*



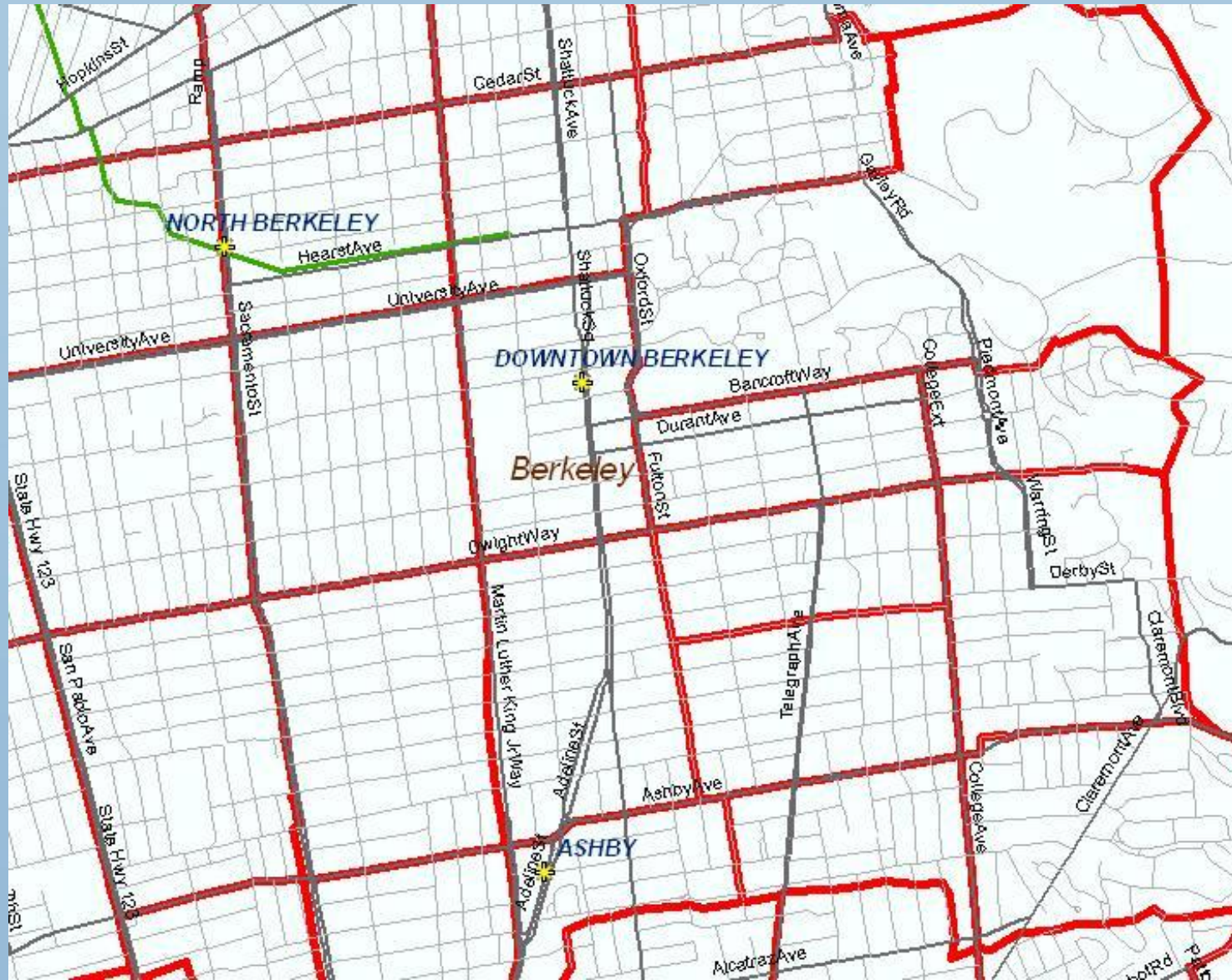
**Italics show the change in the expected number of pedestrian crashes at intersections with different features, in order to provide a frame of reference. These numbers are based on the model, which reflects the 81 Alameda County study intersections as a whole. The effect of any particular treatment is highly context specific.*

Many Demand Analysis Methods

- Traditional 4-step models
- Direct counts & surveys
- Sketch plan with expert-defined weights
- Network-based models
- Location-based models

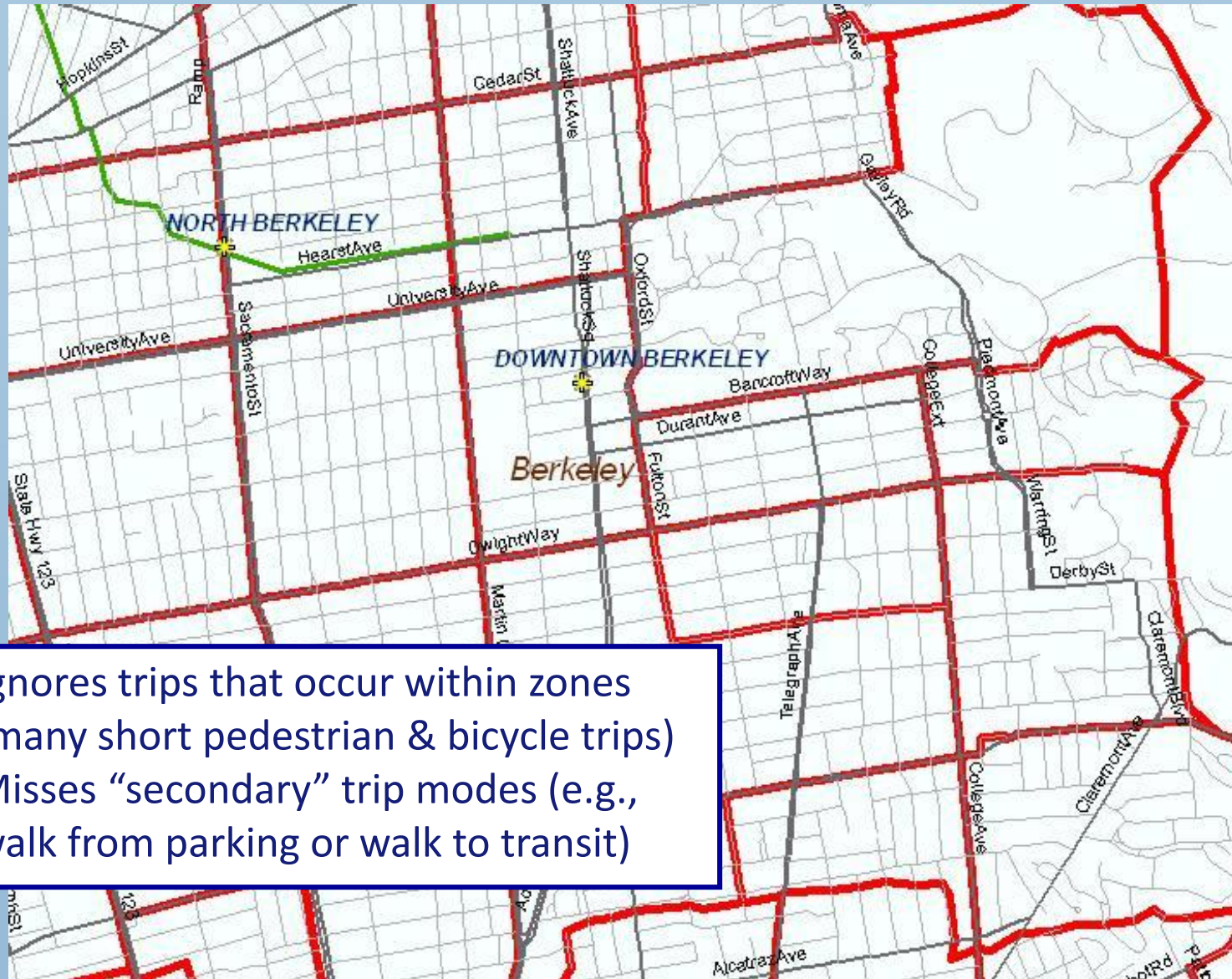


The Traditional Four Step Model



Berkeley, CA Traffic Analysis Zones

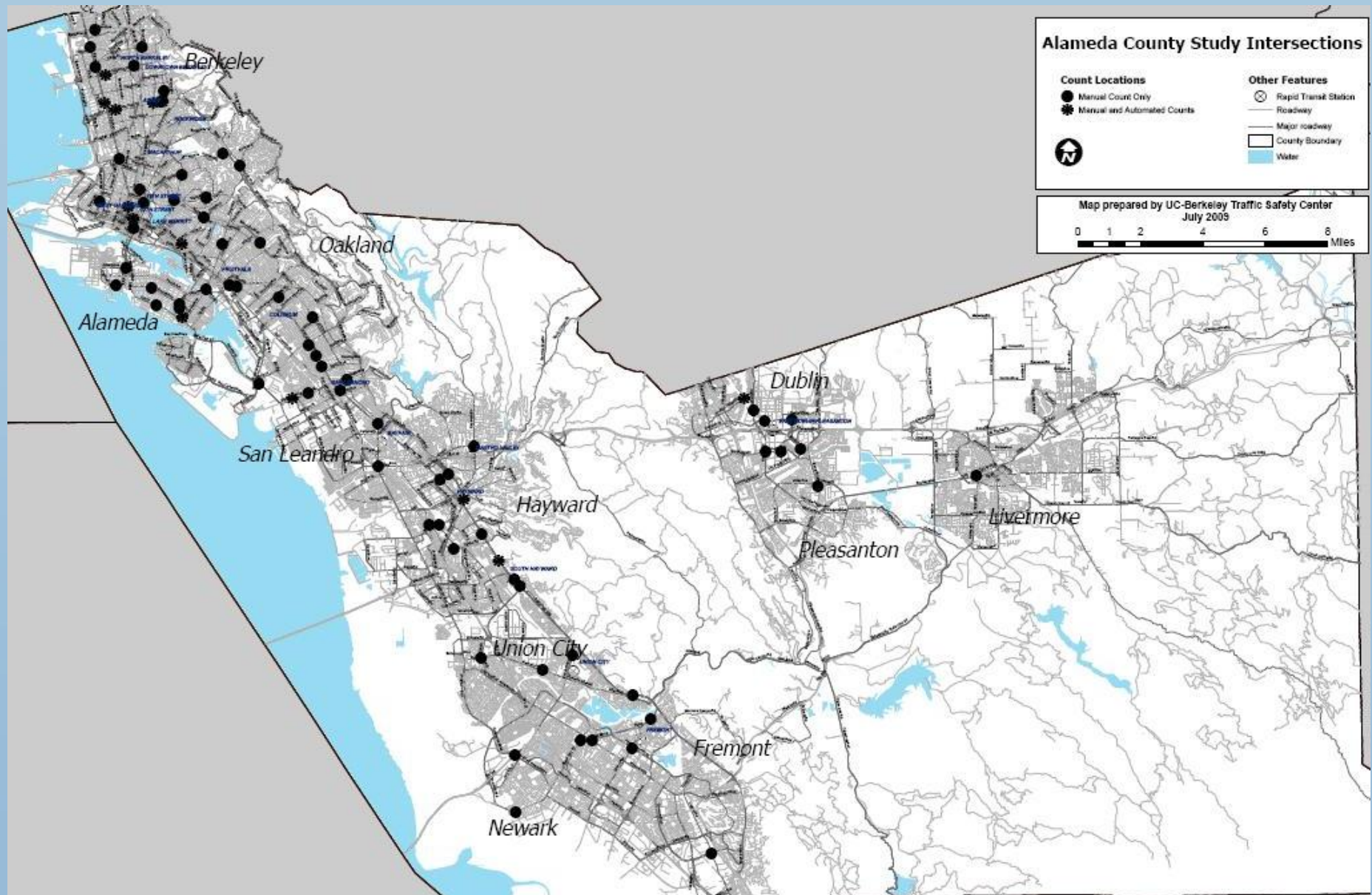
The Traditional Four Step Model



- Ignores trips that occur within zones (many short pedestrian & bicycle trips)
- Misses “secondary” trip modes (e.g., walk from parking or walk to transit)

Berkeley, CA Traffic Analysis Zones

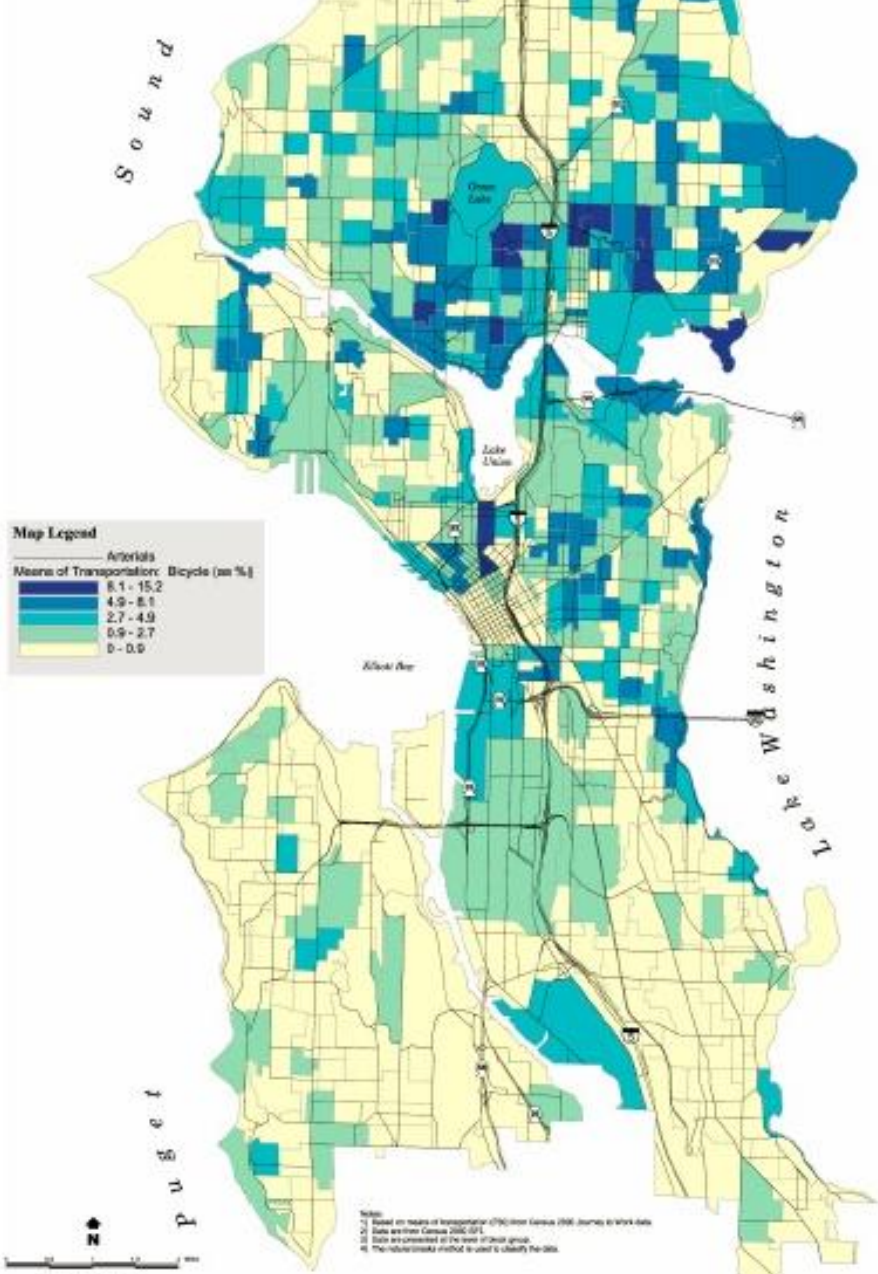
Pedestrian & Bicycle Counts



81 Pedestrian & Bicycle Count Intersections

**Percentage of Workers
Commuting by Bicycle
Journey to Work
Census 2000**

Source: U.S. Census Bureau, Census 2000, Table B08001, "Mode of Transportation to Work by Sex, Race, and Hispanic or Latino Ethnicity."

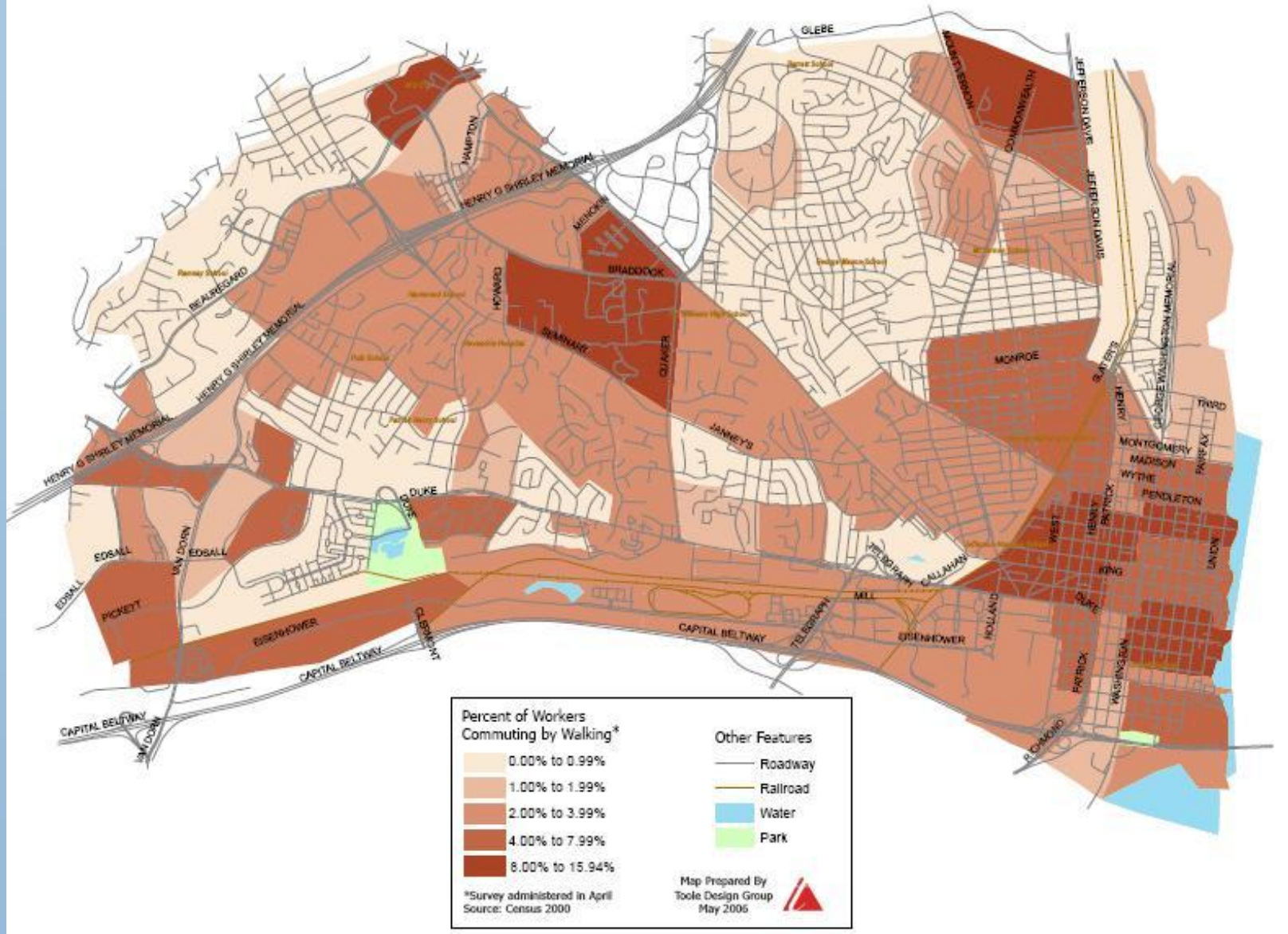


Census/ACS Data

Source: City of Seattle Bicycle Master Plan, 2007

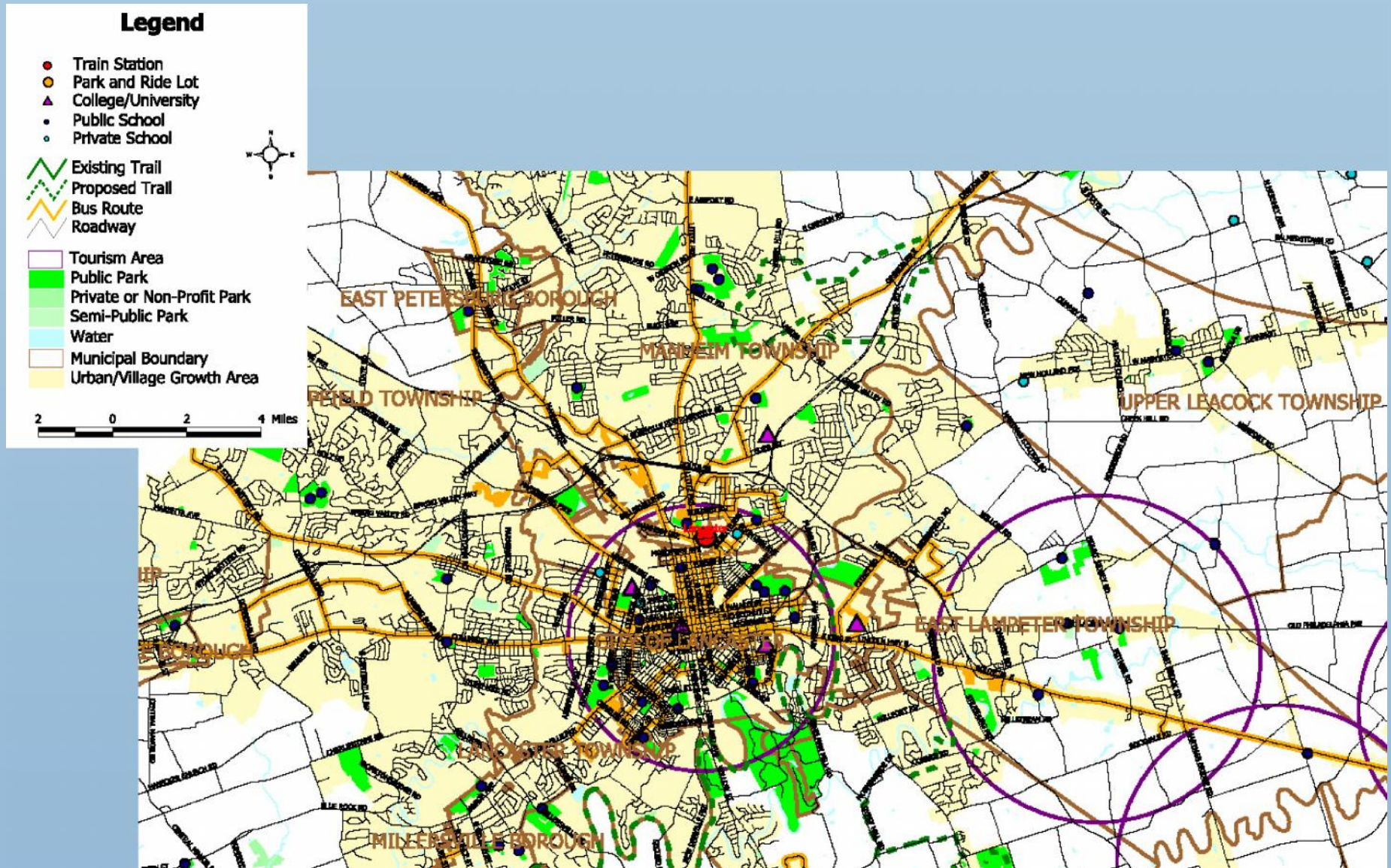
Census/ACS Data

City of Alexandria--Pedestrian Commuting



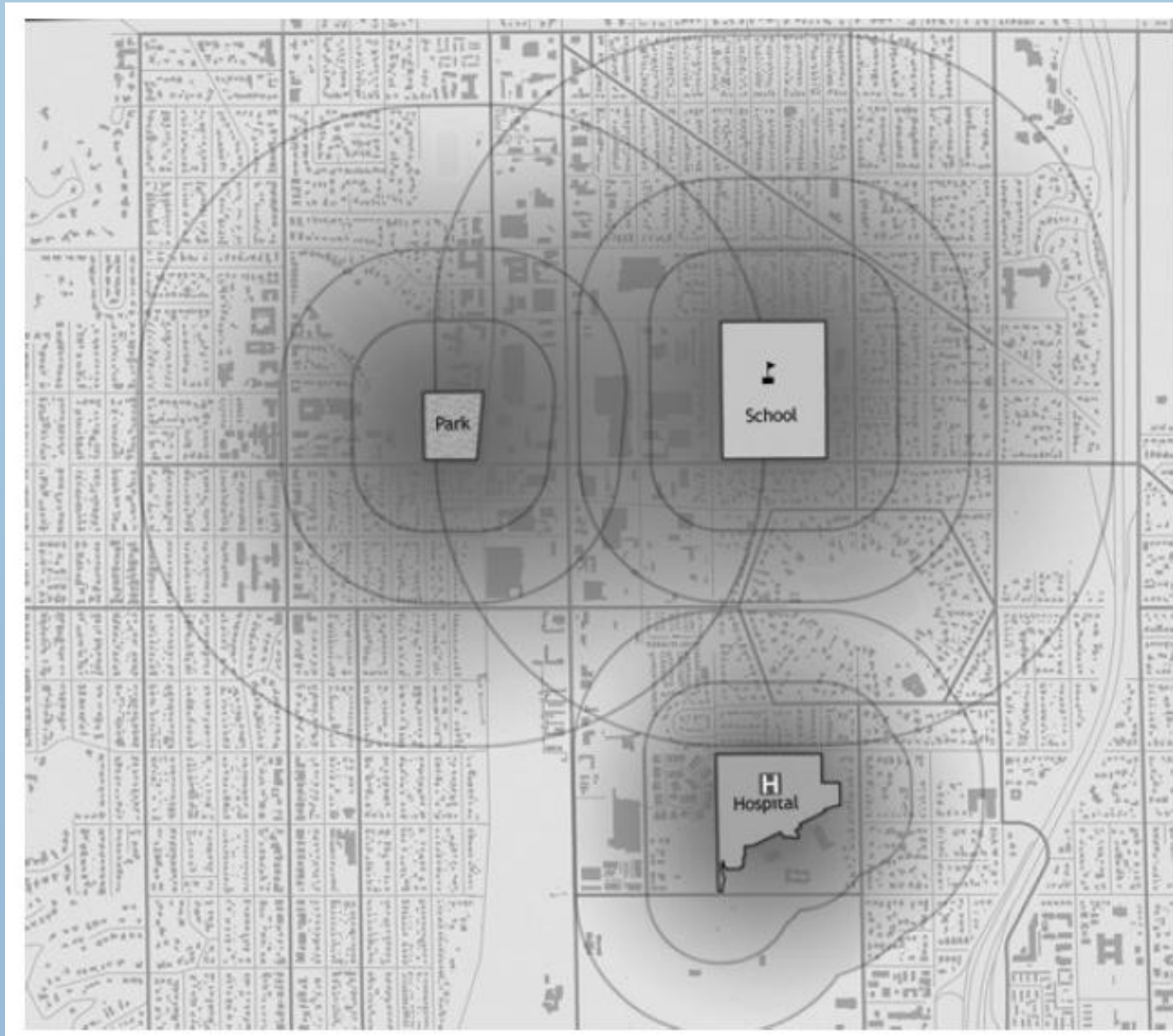
Source: City of Alexandria, VA Pedestrian and Bicycle Mobility Plan, 2008

Sketch Plan Methods



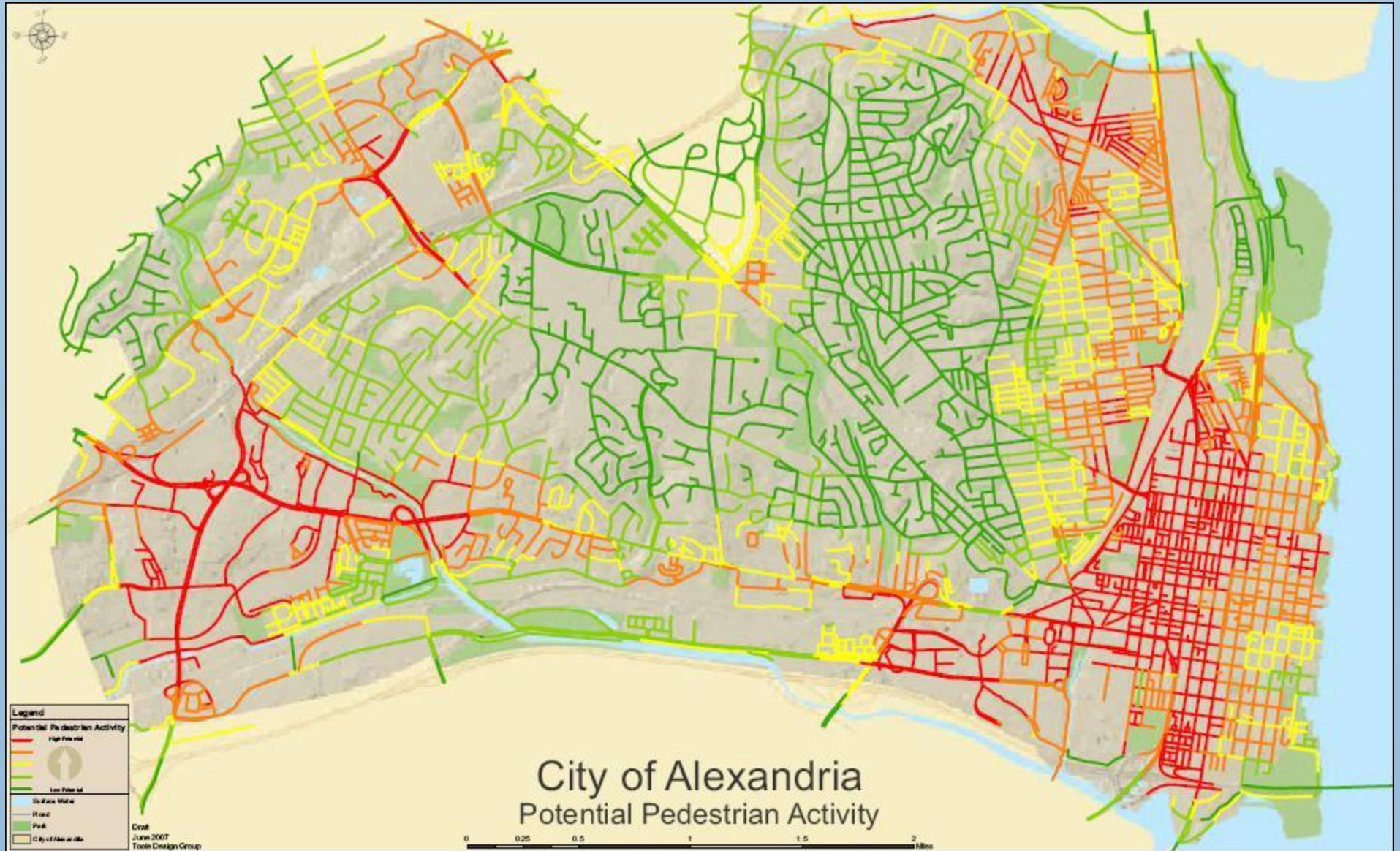
Source: Lancaster County Pedestrian and Bicycle Transportation Plan, Phase II, 2004

Sketch Plan Methods



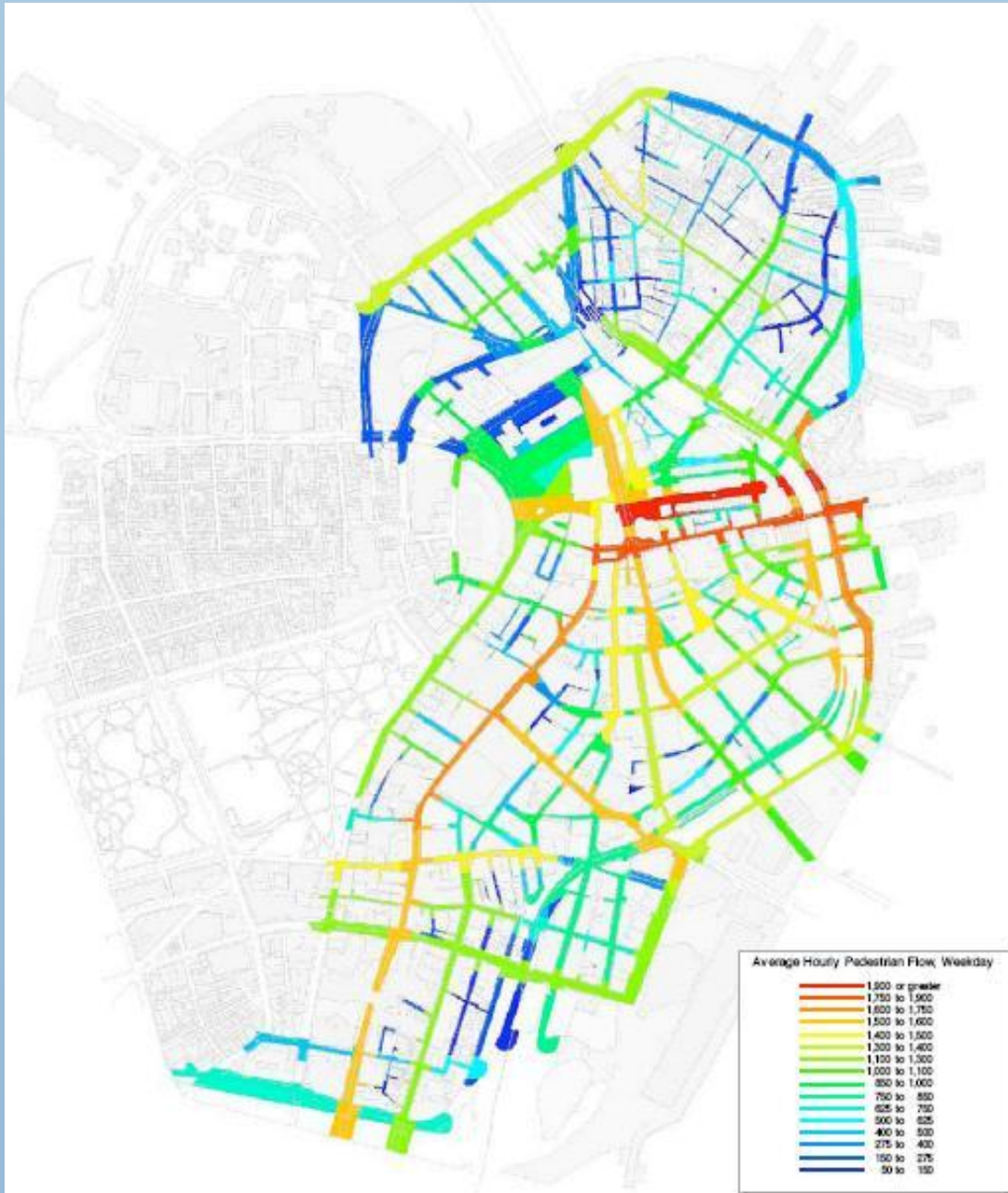
Source: Goodman, D., R. Schneider, and T. Griffiths. "Put Your Money where the People Are," *Planning*, June 2009.

Sketch Plan Methods



Source: City of Alexandria, VA Pedestrian and Bicycle Mobility Plan, 2008

Network-Based Model: Space Syntax

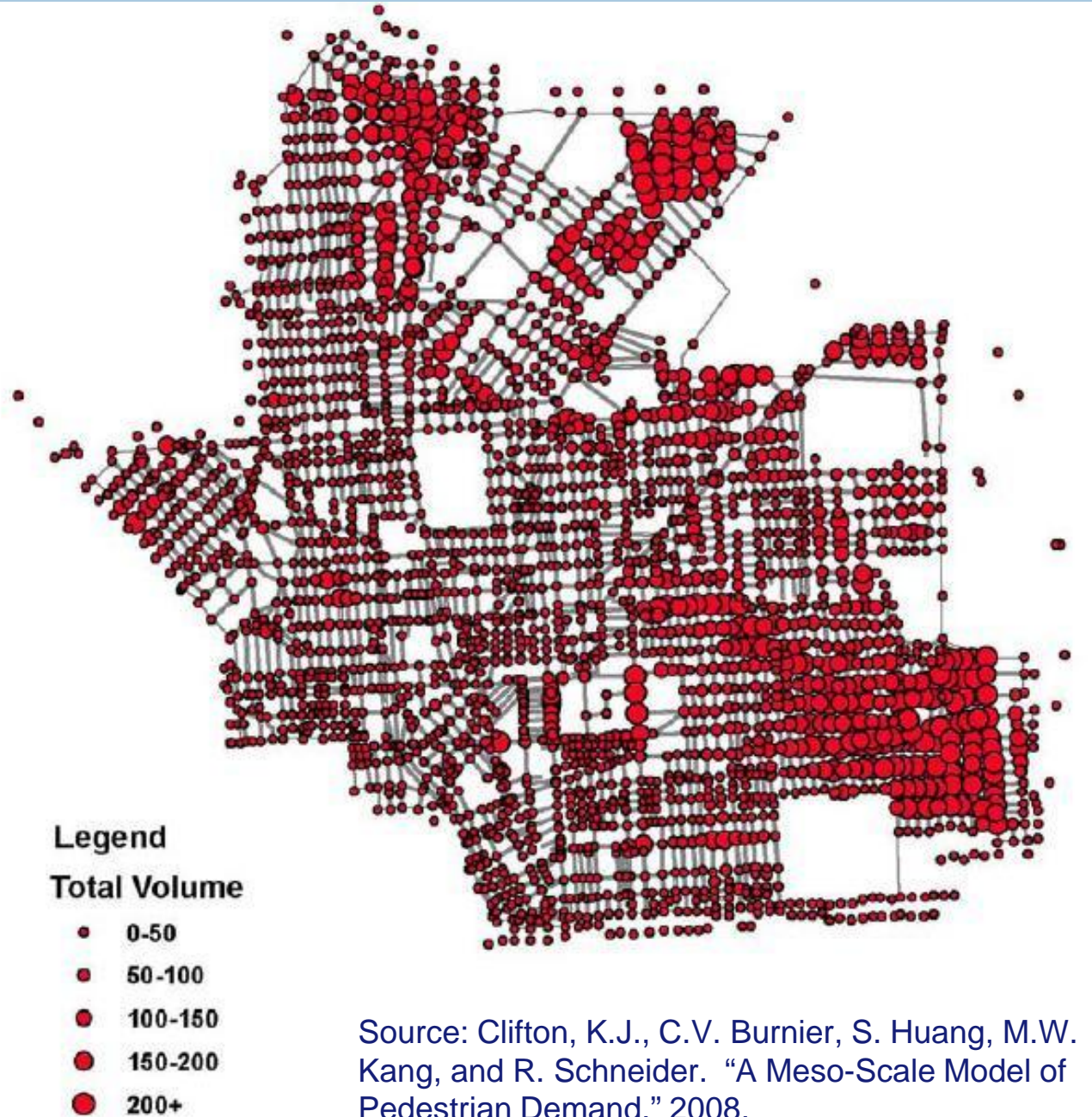


- Street and path networks (potential movement patterns)
- Viewsheds
- Fathom Visibility Graph Analysis Software

Downtown Boston

Source: Rafter and Ragland.
*Pedestrian Volume Modeling For
Traffic Safety & Exposure
Analysis*, 2005.

Network-Based Model: Clifton Maryland Ped Model



Source: Clifton, K.J., C.V. Burnier, S. Huang, M.W. Kang, and R. Schneider. "A Meso-Scale Model of Pedestrian Demand," 2008.

Location-Based Model

Alameda County Estimated Weekly Pedestrian Volumes Crossing Main Roadway Intersections

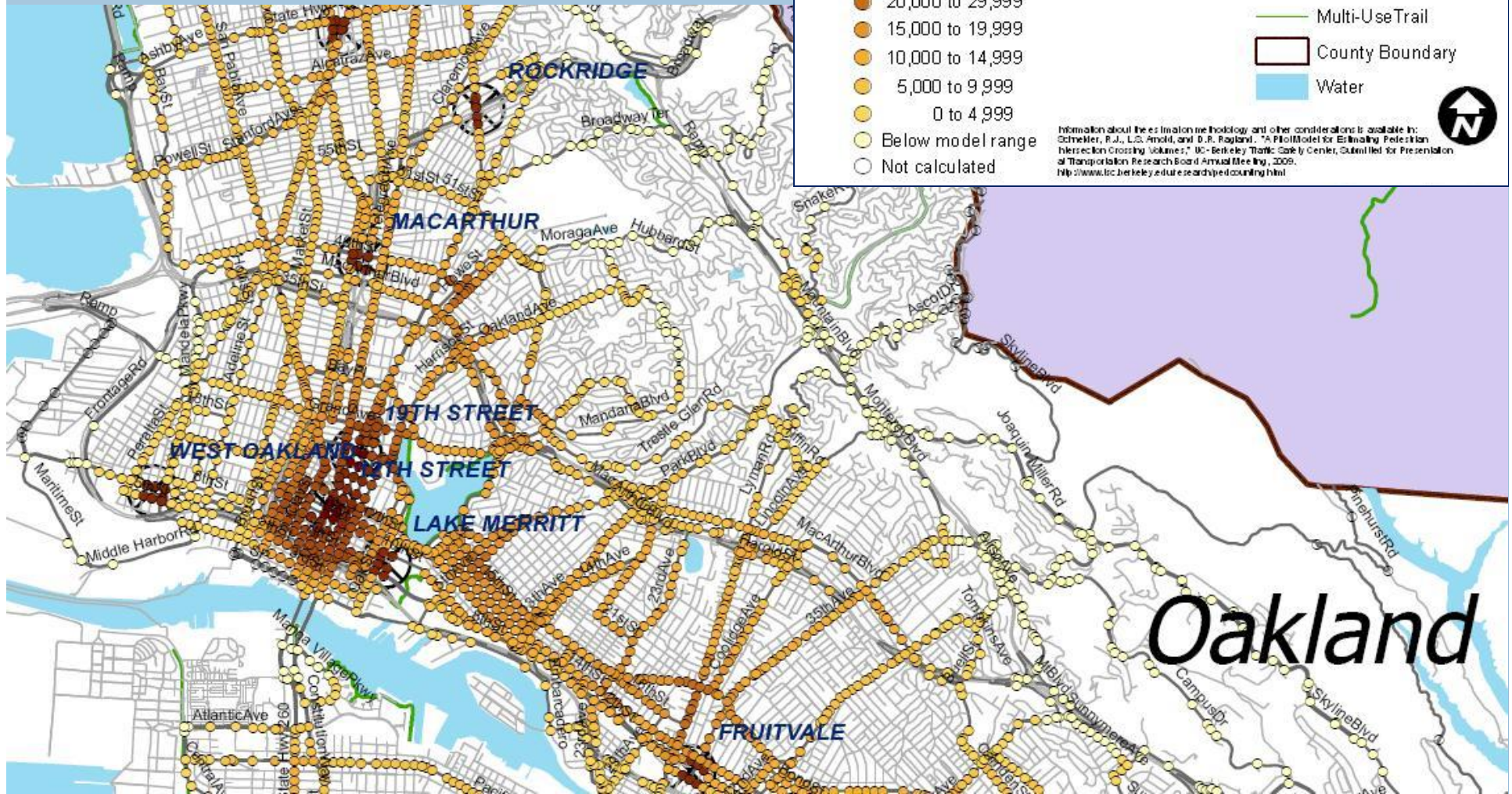
Estimated Weekly Volume

- 100,000 to 150,000
- 50,000 to 99,999
- 30,000 to 49,999
- 20,000 to 29,999
- 15,000 to 19,999
- 10,000 to 14,999
- 5,000 to 9,999
- 0 to 4,999
- Below model range
- Not calculated

Other Features

- ⊗ Rapid Transit Station
- Roadway
- Major roadway
- Multi-Use Trail
- ▭ County Boundary
- Water

Information about the estimation methodology and other considerations is available in: Schneider, R.J., L.S. Arnold, and D.R. Ragland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," UC-Berkeley Traffic Safety Center, Submitted for Presentation at Transportation Research Board Annual Meeting, 2009. <http://www.tlc.berkeley.edu/research/pedcounting.html>



Source: Schneider R.J., L.S. Arnold, and D.R. Ragland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," Transportation Research Record 2140, pp. 13-26, 2009.

Approach: Develop a model to estimate pedestrian intersection crossing volumes at different locations



Location-Based Models

- Schneider, *et al.* San Francisco pedestrian (2012)
- Miranda-Moreno, *et al.* Montreal pedestrian (2011)
- Griswold, Medury, & Schneider, Alameda County bicycle (2011)
- Fehr & Peers, Santa Monica pedestrian & bicycle (2010)
- Alta Planning + Design, San Diego pedestrian & bicycle (2010)
- Schneider, Arnold & Ragland, Alameda County pedestrian (2009)
- Liu & Griswold, San Francisco pedestrian (2009)
- Pulugurtha & Repaka, Charlotte pedestrian (2008)

Intersection-Based Pedestrian Models

TABLE 1 Examples of Previous Pedestrian Intersection Volume Models

General information		Pedestrian count information					Statistically-significant predictive variables					Model information	
Model Location	Developed by	Intersections Used for Model	Pedestrian Count Description	Type of Count Sites	Count Period(s) Used for Model	Weather During Counts	Land Use	Transportation System	Socioeconomic Characteristics	Other	Model Output	Model Type	Validation Testing
Charlotte, NC	UNC Charlotte (Pulugartha & Repaka 2008)	176	Pedestrians counted each time they arrived at the intersection from any direction	Signalized intersections	7 am-7 pm	Clear weather conditions	<ul style="list-style-type: none"> • Pop. within 0.25 mi. • Jobs within 0.25 mi. • Mixed land use within 0.25 mi. • Urban residential area within 0.25 mi. 	<ul style="list-style-type: none"> • Number of bus stops within 0.25 mi. 			Total pedestrians approaching intersections from 7 am to 7 pm (shorter periods also modeled)	Linear	None reported
Alameda County, CA	UC Berkeley SafeTREC (Schneider, Arnold, & Ragland 2009)	50	Pedestrians counted every time they crossed a leg of the intersection (pedestrians within 50 feet of the crosswalk were counted)	Signalized and unsignalized intersections	Tu, W, or Th: 12-2 pm or 3-5 pm; Sa: 9-11 am, 12-2 pm, or 3-5 pm	All weather conditions; weather adjustment factors were calculated from automated counters	<ul style="list-style-type: none"> • Population within 0.5 mi. • Employment within 0.25 mi. • Commercial properties within 0.25 mi. 	<ul style="list-style-type: none"> • BART (regional transit) station within 0.1 mi. 			Total pedestrian crossings at intersections during a typical week	Linear	46 historic counts used for validation (30 additional intersections were counted for validation in 2009)
San Francisco, CA	San Francisco State (Liu & Griswold 2009)	63	Pedestrians counted each time they crossed a leg of the intersection (no distance to crosswalk specified)	Signalized and unsignalized intersections	Weekdays 2:30-6:30 pm	Not reported	<ul style="list-style-type: none"> • Population density (net) within 0.5 mi. • Employment density (net) within 0.25 mi. • Patch richness density within 0.063 mi. • Residential land use within 0.063 mi. 	<ul style="list-style-type: none"> • MUNI (light-rail transit) stop density within 0.38 mi. • Presence of bike lane at intersection 		• Mean slope within 0.063 mi.	Total pedestrian crossings at intersections from 2:30-6:30 pm on typical weekday	Linear	None reported
Santa Monica, CA	Fehr & Peers (Haynes et al. 2010)	92	Pedestrians counted each time they crossed a leg of the intersection (no distance to crosswalk specified)	Signalized and unsignalized intersections	Weekdays 5-6 pm	Not reported	<ul style="list-style-type: none"> • Employment density within 0.33 mi. • Within a commercially-zoned area 	<ul style="list-style-type: none"> • Afternoon bus frequency • Average speed limit on the intersection approaches 		• Distance from Ocean	Total pedestrian crossings at intersections from 5-6 pm on typical weekday	Linear	Approximately 107 additional intersections were counted for validation
San Diego, CA	Alta Planning + Design (Jones et al. 2010)	80	Pedestrians counted each time they arrived at the intersection from any direction	Signalized and unsignalized intersections (includes some trail/roadway intersections)	Weekdays 7-9 am	Nice weather	<ul style="list-style-type: none"> • Population density within 0.25 mi. • Employment density within 0.5 mi. • Presence of retail within 0.5 mi. 	<ul style="list-style-type: none"> • Greater than 6,000 transit ridership at bus stops within 0.25 mi. • 4 or more Class I bike paths within 0.25 mi. 		• More than 100 households without vehicles within 0.5 mi.	Total pedestrians approaching intersections from 7 am to 9 am	Log-linear	None reported
Montreal, Quebec	McGill University (Miranda-Moreno & Fernandes 2011)	1018	Pedestrians counted each time they crossed a leg of the intersection (no distance to crosswalk specified)	Signalized intersections	Weekdays 6-9 am, 11 am-1 pm, and 3:30-6:30 pm	Most counts during nice weather; weather variables were analyzed	<ul style="list-style-type: none"> • Population within 400 m • Commercial space within 50 m • Open space within 150 m • Schools within 400 m 	<ul style="list-style-type: none"> • Subway within 150 m • Bus station within 150 m • % Major arterials within 400 m • Street segments within 400 m • 4-way intersection 		• Distance to downtown • % Daily high temperature >32°C	Total pedestrian crossings at intersections over 8 count hours (shorter periods also modeled)	Log-linear (also used Negative binomial)	Counts at 20% of the intersections were compared to a model based on 80% of the intersections for validation

Intersection-Based Pedestrian Models

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Example: Development of the Alameda County Pedestrian Volume Model



Source: Schneider R.J., L.S. Arnold, and D.R. Ragland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," *Transportation Research Record* 2140, pp. 13-26, 2009.

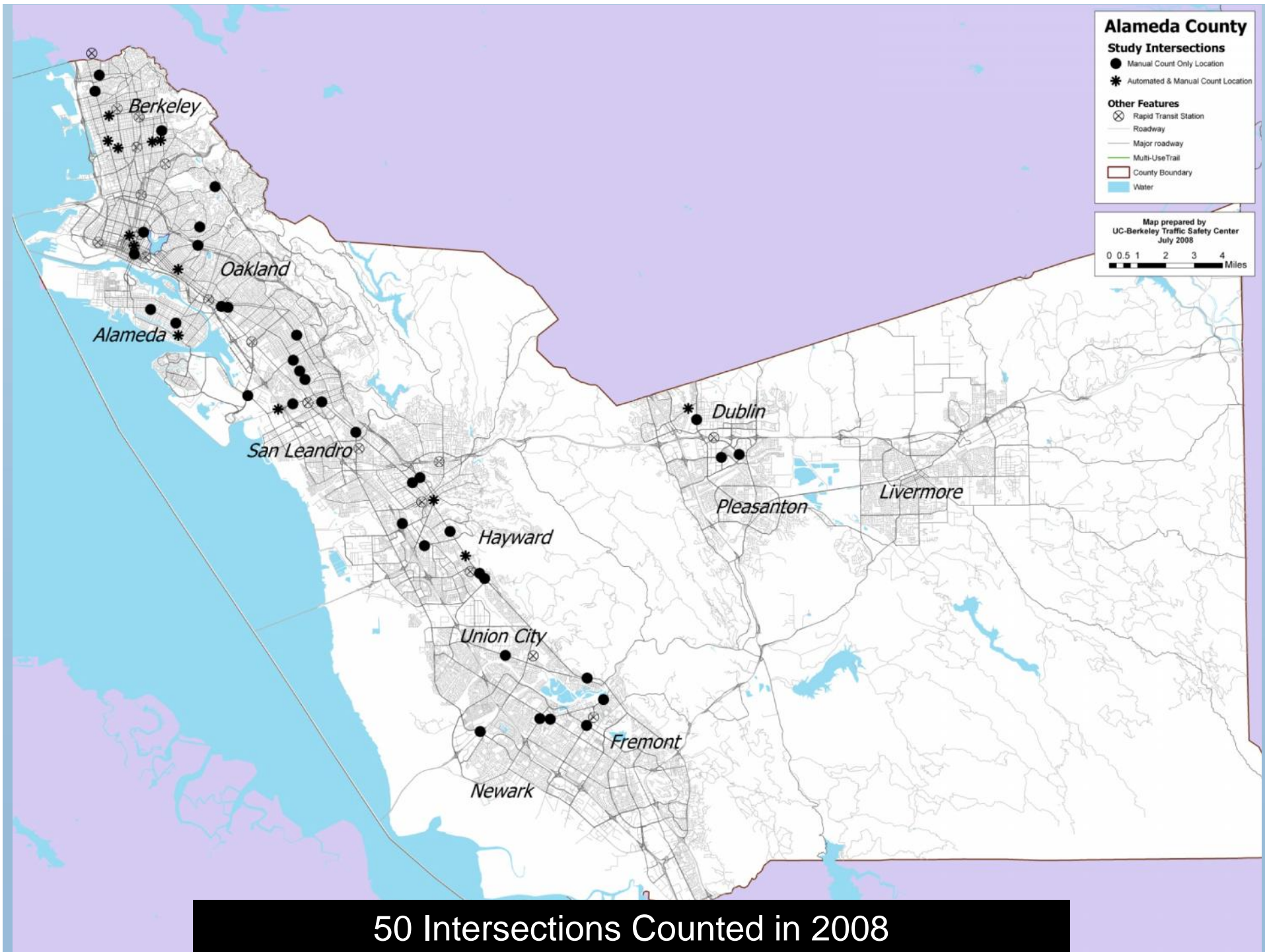
Pedestrian Model Development

- Sample of intersections along arterial and collector roadways
- Pilot Model: April to June 2008 (N=50)
- Validation: April to June 2009 (N=30)



2008 Location Selection Process

- All Possible Intersections = 7,466
- Choose 50 Intersections
 - Ensure a wide variety of characteristics are represented
 - Ensure a wide geographic distribution
- Restrictions
 - No intersections with low pop. density, no grade separated crossings, no intersections within ¼-mile of county line
 - Include at least 2 trail/roadway crossings & 3 CBD intersections



Pilot Model Pedestrian Volume Data

- Pedestrian crossings within 50 feet of each study intersection
- 2-hour manual counts (Weekday & Saturday)
- April to June 2008
- Counts extrapolated and adjusted for land use & weather





Investigation of the Effects of Temperature on the Rate of Diffusion

Time (min)	Distance (cm)	Temperature (°C)	Rate (cm/min)
0	0	25	0
10	1.5	25	0.15
20	3.0	25	0.15
30	4.5	25	0.15
40	6.0	25	0.15
50	7.5	25	0.15
60	9.0	25	0.15
70	10.5	25	0.15
80	12.0	25	0.15
90	13.5	25	0.15
100	15.0	25	0.15

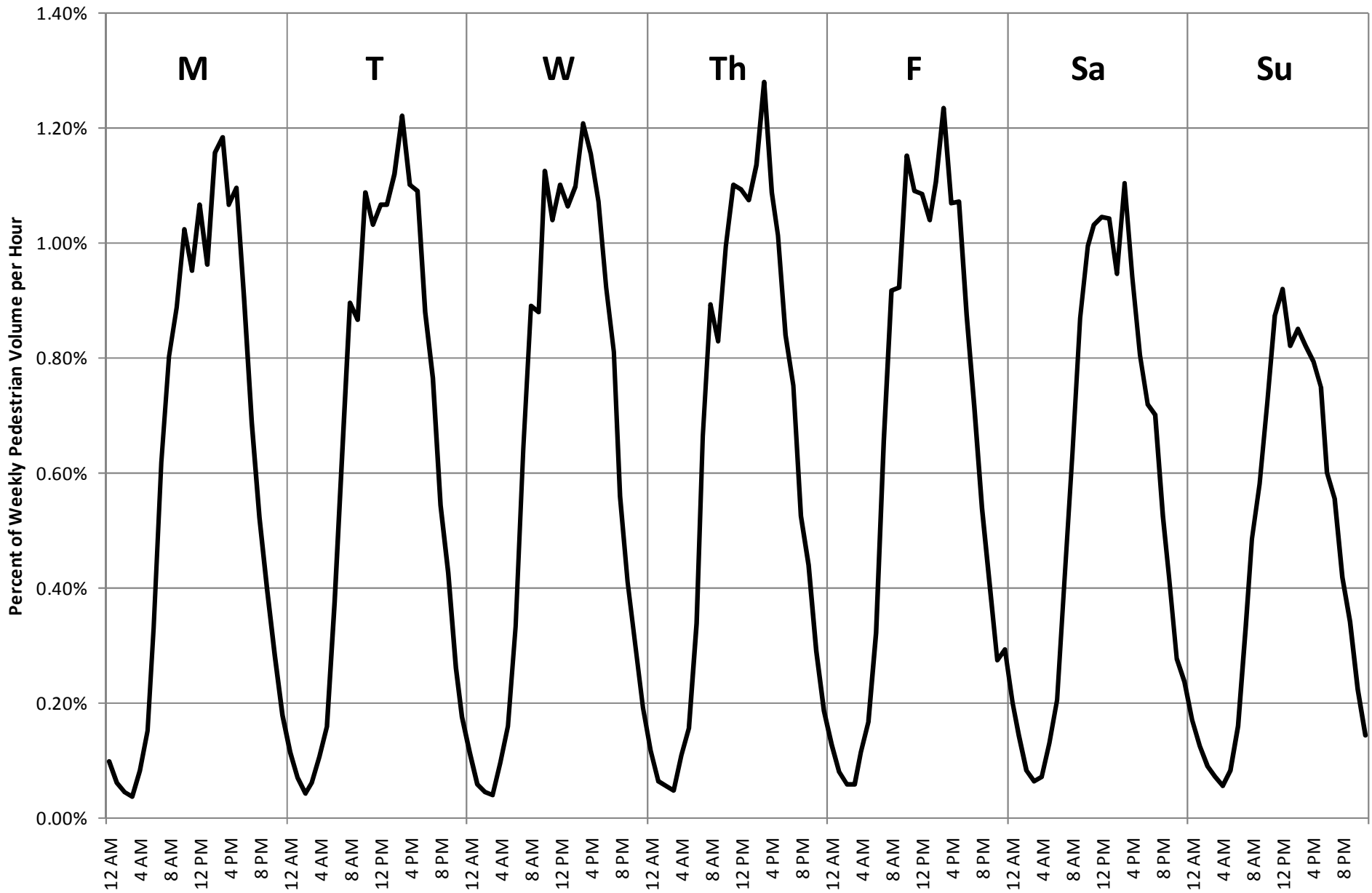
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100	15.0	25	0.15

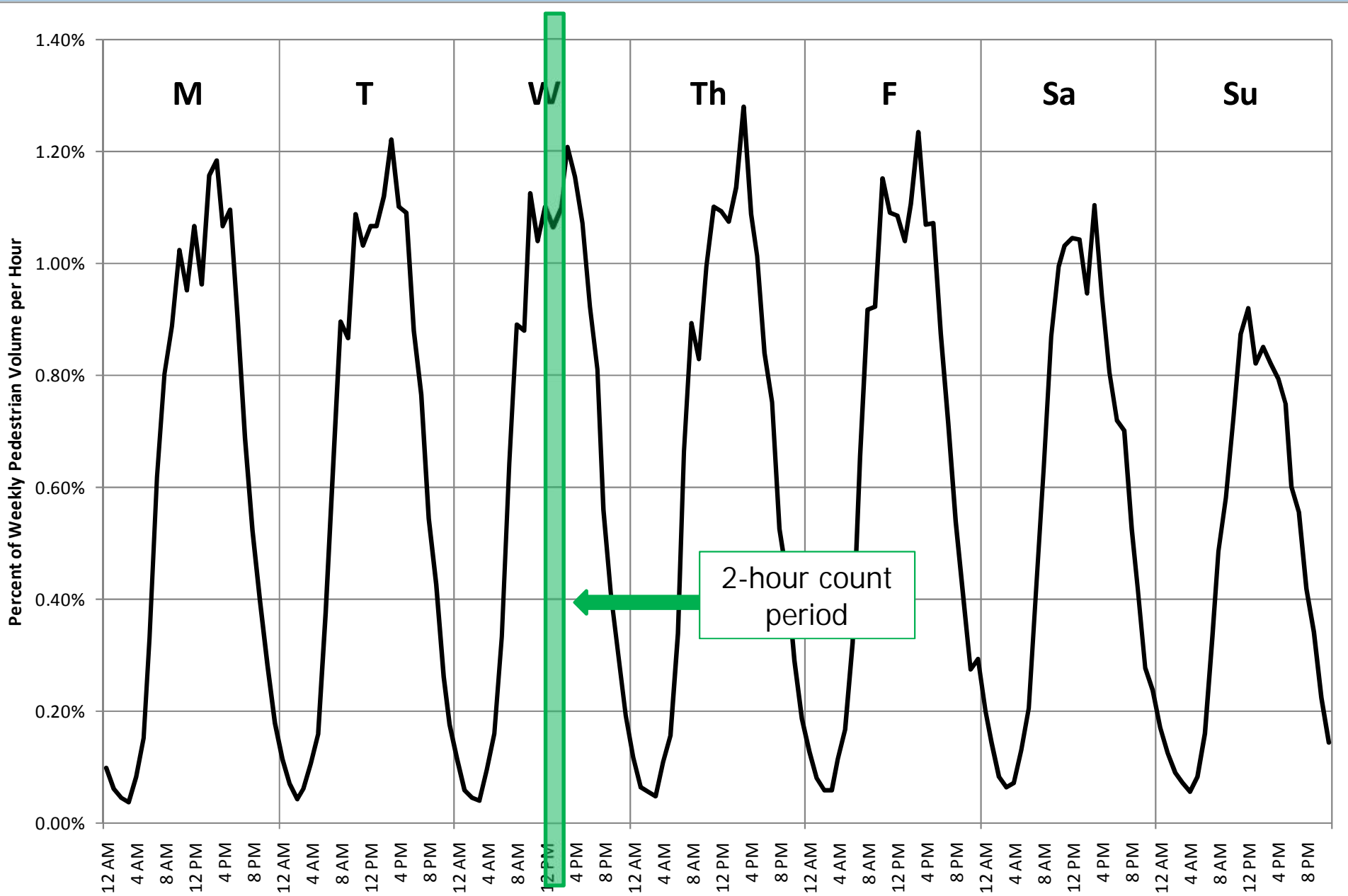


Example automated counter location: Broadway & 12th Street (Oakland)

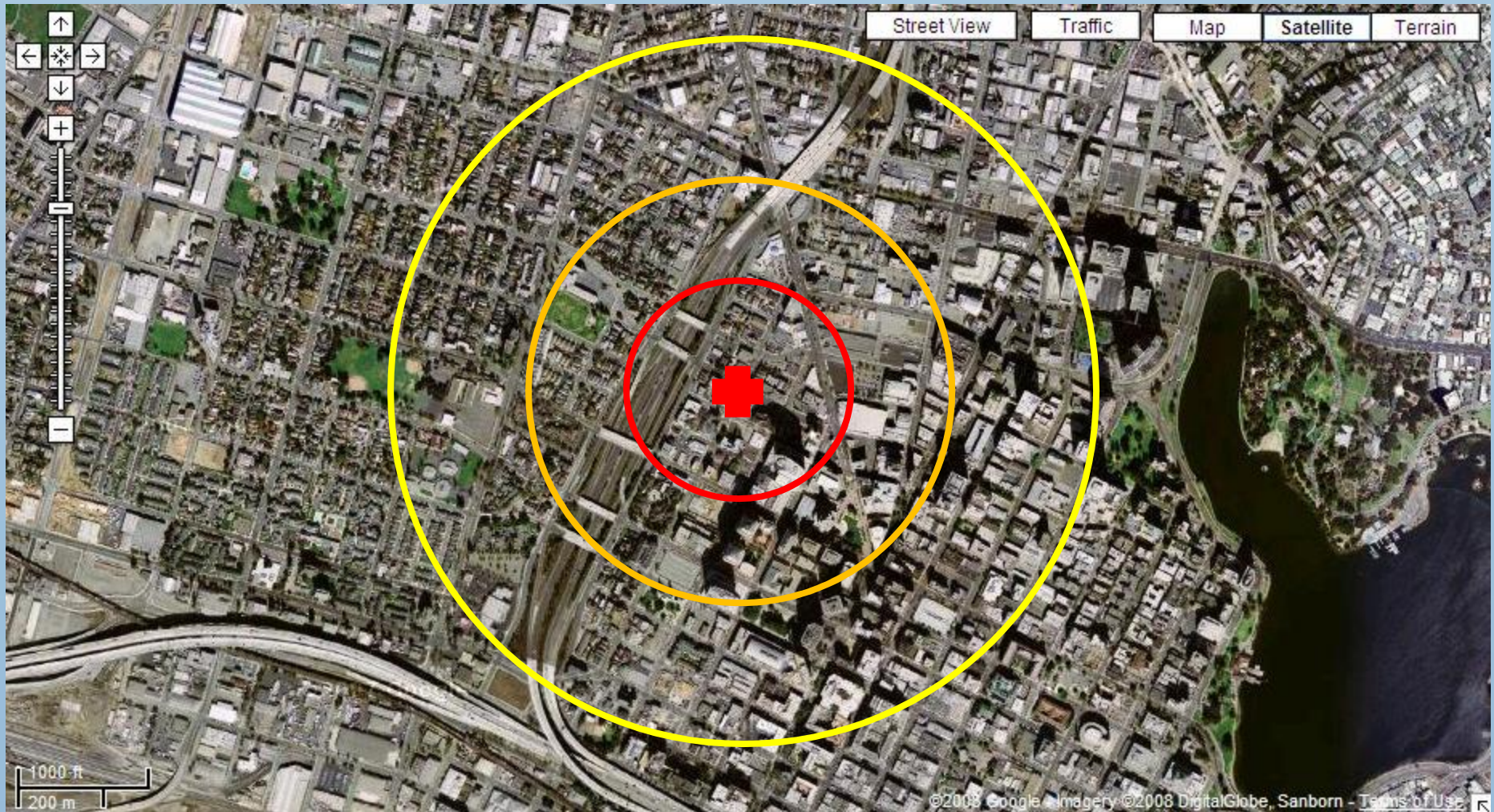
“Typical” Alameda County Pedestrian Activity Pattern



“Typical” Alameda County Pedestrian Activity Pattern



One study intersection: Martin Luther King Jr. Wy. & 17th St., Oakland



Approximately 5,600 pedestrian crossings per week (Spring 2008)

Alameda County Pilot Model

Estimated Weekly Pedestrian Crossings =

$$\begin{aligned} & 0.928 * \text{Total population within 0.5-miles of the} \\ & \text{intersection} \\ + & 2.19 * \text{Total employment within 0.25-miles of the} \\ & \text{intersection} \\ + & 98.4 * \text{Number of commercial properties within 0.25-} \\ & \text{miles of the intersection} \\ + & 54,600 * \text{Number of regional transit stations within 0.10-} \\ & \text{miles of the intersection} \\ - & 4910 \quad (\text{Constant}) \end{aligned}$$

Adjusted $R^2 = 0.897$

Root Mean Squared Error = 5760

Explanatory variables significant at 95% confidence interval

Pilot Pedestrian Volume Model Application

Alameda County Estimated Weekly Pedestrian Volumes Crossing Main Roadway Intersections

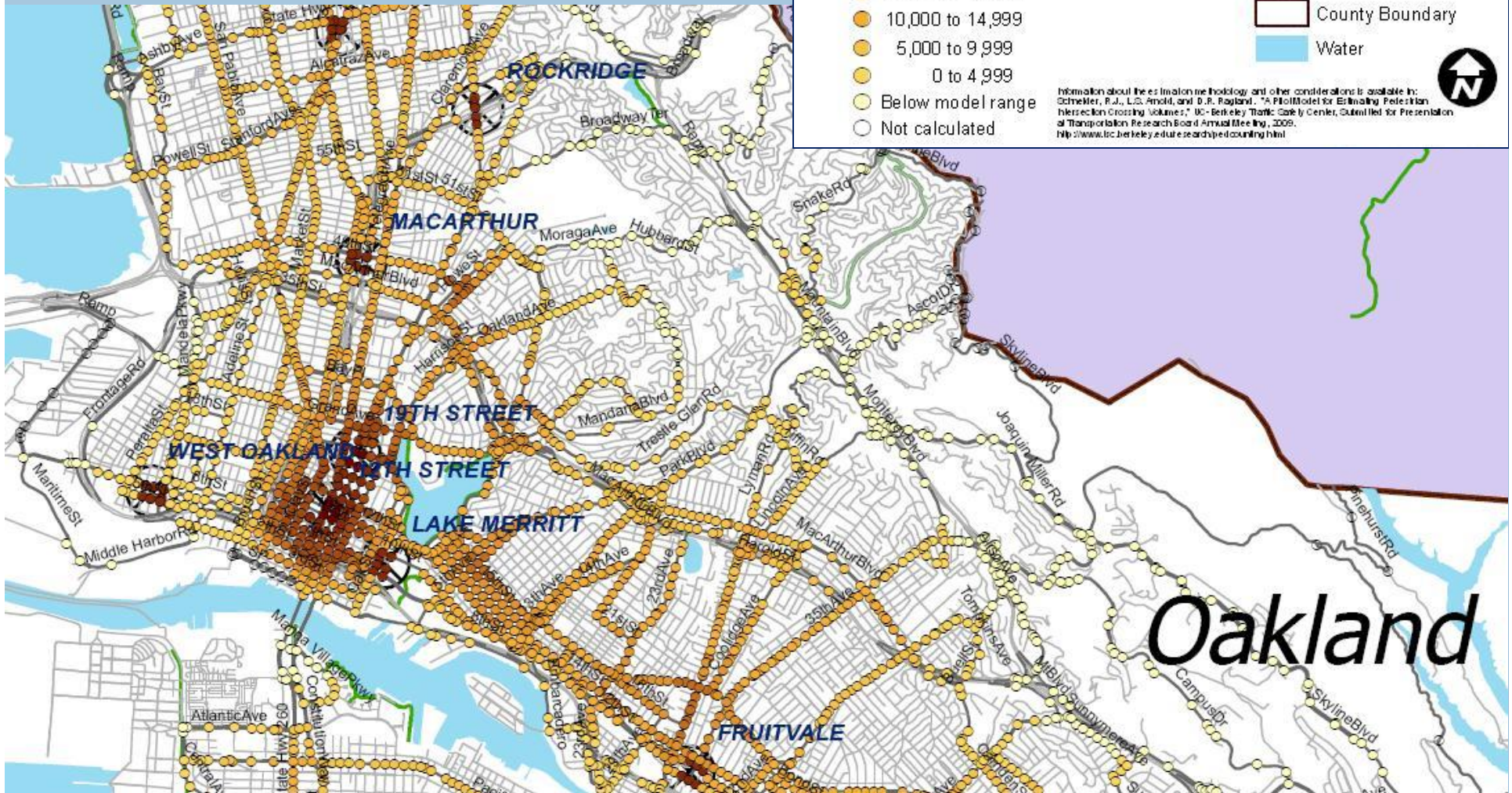
Estimated Weekly Volume

- 100,000 to 150,000
- 50,000 to 99,999
- 30,000 to 49,999
- 20,000 to 29,999
- 15,000 to 19,999
- 10,000 to 14,999
- 5,000 to 9,999
- 0 to 4,999
- Below model range
- Not calculated

Other Features

- ⊗ Rapid Transit Station
- Roadway
- Major roadway
- Multi-Use Trail
- ▭ County Boundary
- Water

Information about the estimation methodology and other considerations is available in: Schmitter, R.J., L.S. Arnold, and D.R. Rogland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," UC-Berkeley Traffic Safety Center, Submitted for Presentation of Transportation Research Board Annual Meeting, 2009. <http://www.ttc.berkeley.edu/research/pedcounting.html>



Oakland

Alameda County Pedestrian Volume Forecasting Spreadsheet

Pedestrian Intersection Crossing Volume Model

Pilot Model--January 2009^{1,2}

Developed by Robert Schneider, Lindsay Arnold, and David Ragland

University of California Berkeley Safe Transportation Research & Education Center

Intersection Identification			Model Inputs ⁴				Model Output
Mainline Roadway	Intersecting Roadway	City	Total population within 1/2-mile radius ³	Total employment within 1/4-mile radius	Total number of commercial properties within 1/4-mile radius	Presence of regional transit station within 1/10 mile (Yes = 1, No = 0)	Estimated Pedestrian Crossings in a Typical Week ^{5,6,7}
Telegraph Avenue	59th Street	Oakland	10270	610	27	0	8542

NOTES:

1. This is a revised version of the pilot model of weekly pedestrian volumes at 50 intersections in Alameda County, CA. The model has a good fit for the Alameda County study data (adjusted-R²=0.900). Since the analysis was conducted on 50 intersections in Alameda County, CA, more research is needed to refine the model equation and determine the applicability of the results for other communities. The model equation is: Estimated pedestrian intersection crossings per week = 0.987 * Total population within 0.5-miles of the intersection + 2.19 * Total employment within 0.25-miles of the intersection + 71.1 * Number of commercial retail properties within 0.25-miles of the intersection + 49,300 * Number of regional transit stations within 0.10-miles of the intersection - 4850. Details of the study are provided in two papers: 1) Schneider, R.J., L.S. Arnold, and D.R. Ragland. "Extrapolating Weekly Pedestrian Intersection Crossing Volumes from 2-Hour Manual Counts," UC-Berkeley Traffic Safety Center, Transportation Research Record, 2010, and 2) Schneider R.J., L.S. Arnold, and D.R. Ragland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," UC-Berkeley Traffic Safety Center, Transportation Research Record, 2010.
2. The pedestrian volume estimates produced by the model are intended for planning, prioritization, and safety analysis at the community, neighborhood, and corridor levels. Since the model provides rough estimates of pedestrian activity, actual pedestrian counts should be used for site-level safety, design, and engineering analyses.
3. The intersections selected for the study did not include intersections in areas with very low population densities (<50 people per square mile). Therefore, the model is not appropriate for intersections below this density threshold (i.e., the model does not apply if there are fewer than 64 people within a 1/2-mile radius).
4. The study of Alameda County, CA found that land use characteristics are the most important factors for predicting pedestrian activity. Roadway design factors, such as the presence of sidewalks, median crossing islands, curb radii, or pedestrian crossing signals may have minor effects on pedestrian volumes, but they are not as significant for predicting pedestrian activity. However, roadway design factors are critical for pedestrian safety and comfort. Roadways must be designed to accommodate pedestrians of all abilities, regardless of volume.
5. The model output is an estimate of the number of pedestrian crossings during a typical 168-hour week (with an average seasonal volume). Pedestrian crossings are counted each time a pedestrian crosses any leg of the intersection (e.g., one person is counted twice if they cross the east leg and then the south leg of an intersection). Pedestrians do not need to cross completely inside the crosswalk; they are counted if they cross within 50 feet of the intersection.
6. The model may not perform well in locations close to special attractors, such as amusement parks, waterfronts, sports arenas, regional recreation areas, and major multi-use

Alameda County Pedestrian Volume Forecasting Spreadsheet

Pedestrian Intersection Crossing Volume Model

Pilot Model--January 2009^{1,2}

Developed by Robert Schneider, Lindsay Arnold, and David Ragland

University of California Berkeley Safe Transportation Research & Education Center

Intersection Identification			Model Inputs ⁴				Model Output
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Telegraph Avenue	59th Street	Oakland	20540	1220	27	0	20014

NOTES:

1. This is a revised version of the pilot model of weekly pedestrian volumes at 50 intersections in Alameda County, CA. The model has a good fit for the Alameda County study data (adjusted-R²=0.900). Since the analysis was conducted on 50 intersections in Alameda County, CA, more research is needed to refine the model equation and determine the applicability of the results for other communities. The model equation is: Estimated pedestrian intersection crossings per week = 0.987 * Total population within 0.5-miles of the intersection + 2.19 * Total employment within 0.25-miles of the intersection + 71.1 * Number of commercial retail properties within 0.25-miles of the intersection + 49,300 * Number of regional transit stations within 0.10-miles of the intersection - 4850. Details of the study are provided in two papers: 1) Schneider, R.J., L.S. Arnold, and D.R. Ragland. "Extrapolating Weekly Pedestrian Intersection Crossing Volumes from 2-Hour Manual Counts," UC-Berkeley Traffic Safety Center, Transportation Research Record, 2010, and 2) Schneider R.J., L.S. Arnold, and D.R. Ragland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," UC-Berkeley Traffic Safety Center, Transportation Research Record, 2010.
2. The pedestrian volume estimates produced by the model are intended for planning, prioritization, and safety analysis at the community, neighborhood, and corridor levels. Since the model provides rough estimates of pedestrian activity, actual pedestrian counts should be used for site-level safety, design, and engineering analyses.
3. The intersections selected for the study did not include intersections in areas with very low population densities (<50 people per square mile). Therefore, the model is not appropriate for intersections below this density threshold (i.e., the model does not apply if there are fewer than 64 people within a 1/2-mile radius).
4. The study of Alameda County, CA found that land use characteristics are the most important factors for predicting pedestrian activity. Roadway design factors, such as the presence of sidewalks, median crossing islands, curb radii, or pedestrian crossing signals may have minor effects on pedestrian volumes, but they are not as significant for predicting pedestrian activity. However, roadway design factors are critical for pedestrian safety and comfort. Roadways must be designed to accommodate pedestrians of all abilities, regardless of volume.
5. The model output is an estimate of the number of pedestrian crossings during a typical 168-hour week (with an average seasonal volume). Pedestrian crossings are counted each time a pedestrian crosses any leg of the intersection (e.g., one person is counted twice if they cross the east leg and then the south leg of an intersection). Pedestrians do not need to cross completely inside the crosswalk; they are counted if they cross within 50 feet of the intersection.
6. The model may not perform well in locations close to special attractors, such as amusement parks, waterfronts, sports arenas, regional recreation areas, and major multi-use

Alameda County Pedestrian Volume Forecasting Spreadsheet

Pedestrian Intersection Crossing Volume Model

Pilot Model--January 2009^{1,2}

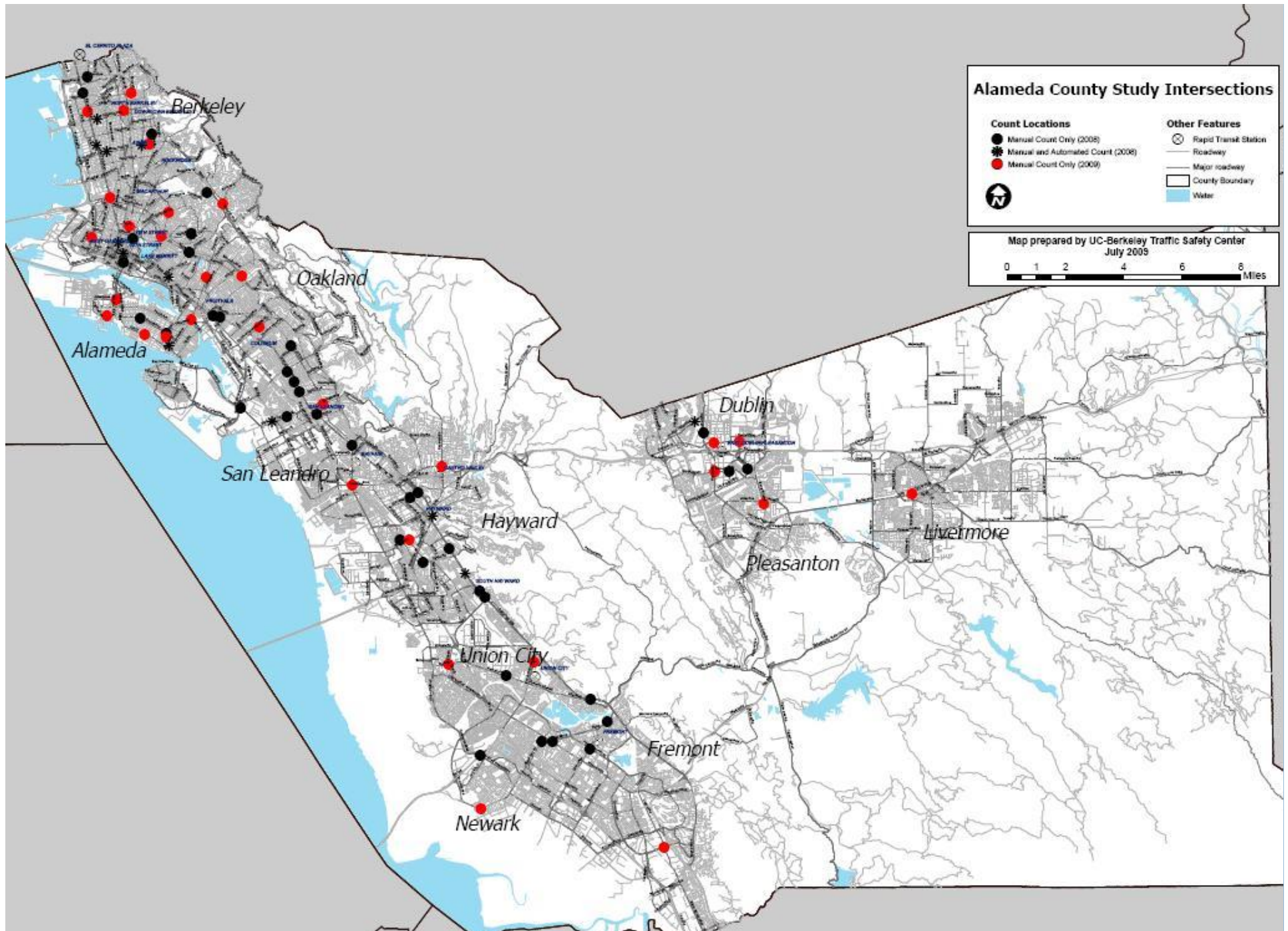
Developed by Robert Schneider, Lindsay Arnold, and David Ragland

University of California Berkeley Safe Transportation Research & Education Center

Intersection Identification			Model Inputs ⁴				Model Output
Mainline Roadway	Intersecting Roadway	City	Total population within 1/2-mile radius ³	Total employment within 1/4-mile radius	Total number of commercial properties within 1/4-mile radius	Presence of regional transit station within 1/10 mile (Yes = 1, No = 0)	Estimated Pedestrian Crossings in a Typical Week ^{5,6,7}
Telegraph Avenue	59th Street	Oakland	10270	610	27	0	8542
Telegraph Avenue	59th Street	Oakland	20540	1220	27	0	20014
Telegraph Avenue	59th Street	Oakland	20540	1220	100	0	25205

NOTES:

1. This is a revised version of the pilot model of weekly pedestrian volumes at 50 intersections in Alameda County, CA. The model has a good fit for the Alameda County study data (adjusted-R²=0.900). Since the analysis was conducted on 50 intersections in Alameda County, CA, more research is needed to refine the model equation and determine the applicability of the results for other communities. The model equation is: Estimated pedestrian intersection crossings per week = 0.987 * Total population within 0.5-miles of the intersection + 2.19 * Total employment within 0.25-miles of the intersection + 71.1 * Number of commercial retail properties within 0.25-miles of the intersection + 49,300 * Number of regional transit stations within 0.10-miles of the intersection - 4850. Details of the study are provided in two papers: 1) Schneider, R.J., L.S. Arnold, and D.R. Ragland. "Extrapolating Weekly Pedestrian Intersection Crossing Volumes from 2-Hour Manual Counts," UC-Berkeley Traffic Safety Center, Transportation Research Record, 2010, and 2) Schneider R.J., L.S. Arnold, and D.R. Ragland. "A Pilot Model for Estimating Pedestrian Intersection Crossing Volumes," UC-Berkeley Traffic Safety Center, Transportation Research Record, 2010.
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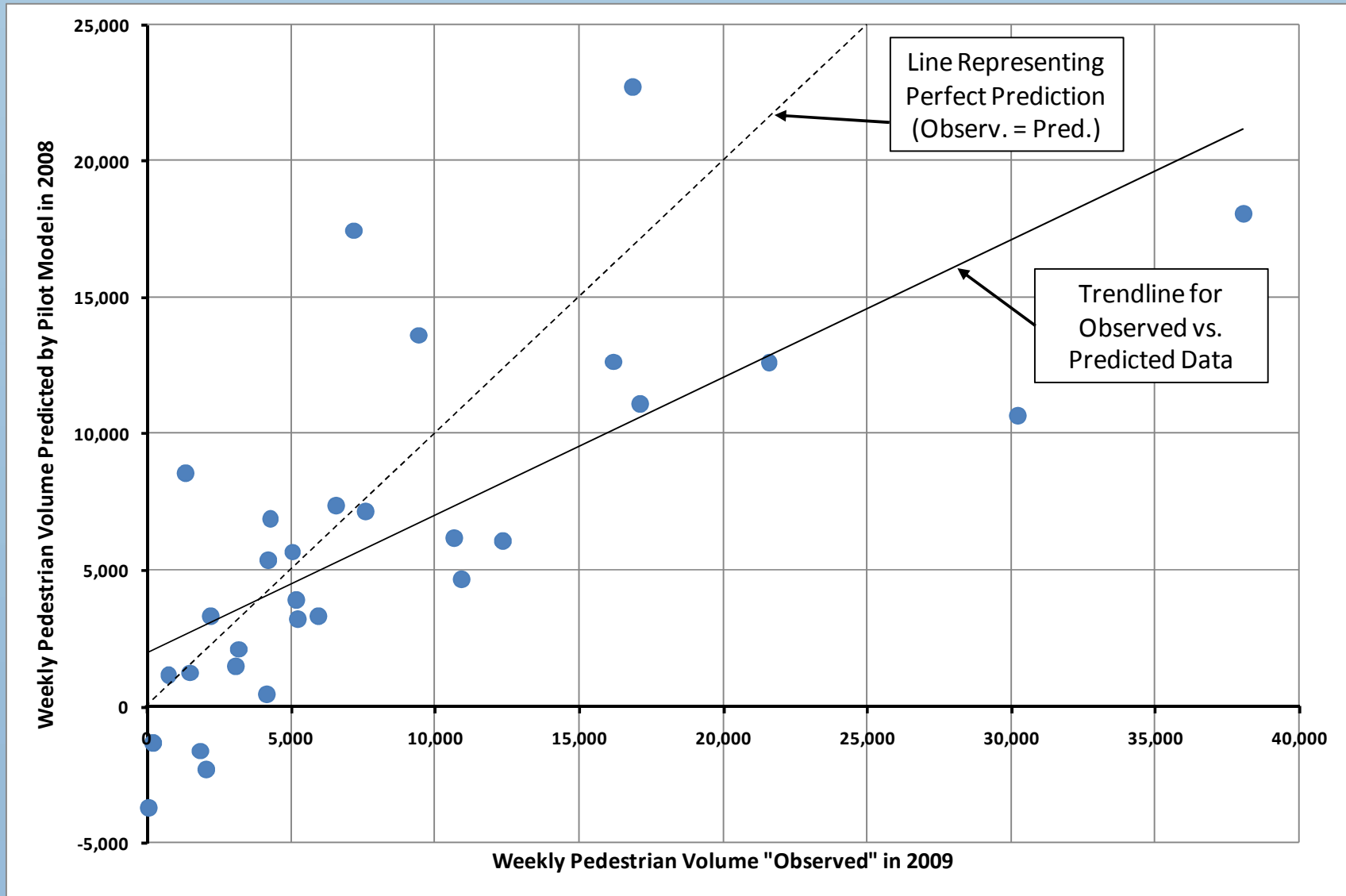


36 Intersections Counted in 2009 (Red)

Validation Analysis

- Compared pilot model estimated volume with “actual” volume at 30 intersections in 2009
 - Where did the Pilot model work well?
 - Where did the Pilot model overestimate volumes?
 - Where did the Pilot model underestimate volumes?
- Model tended to underestimate
- Issue with some negative predictions at low-volume intersections

2009 Observed Volumes vs. Pilot Model Predictions



Variation in Pedestrian Volumes



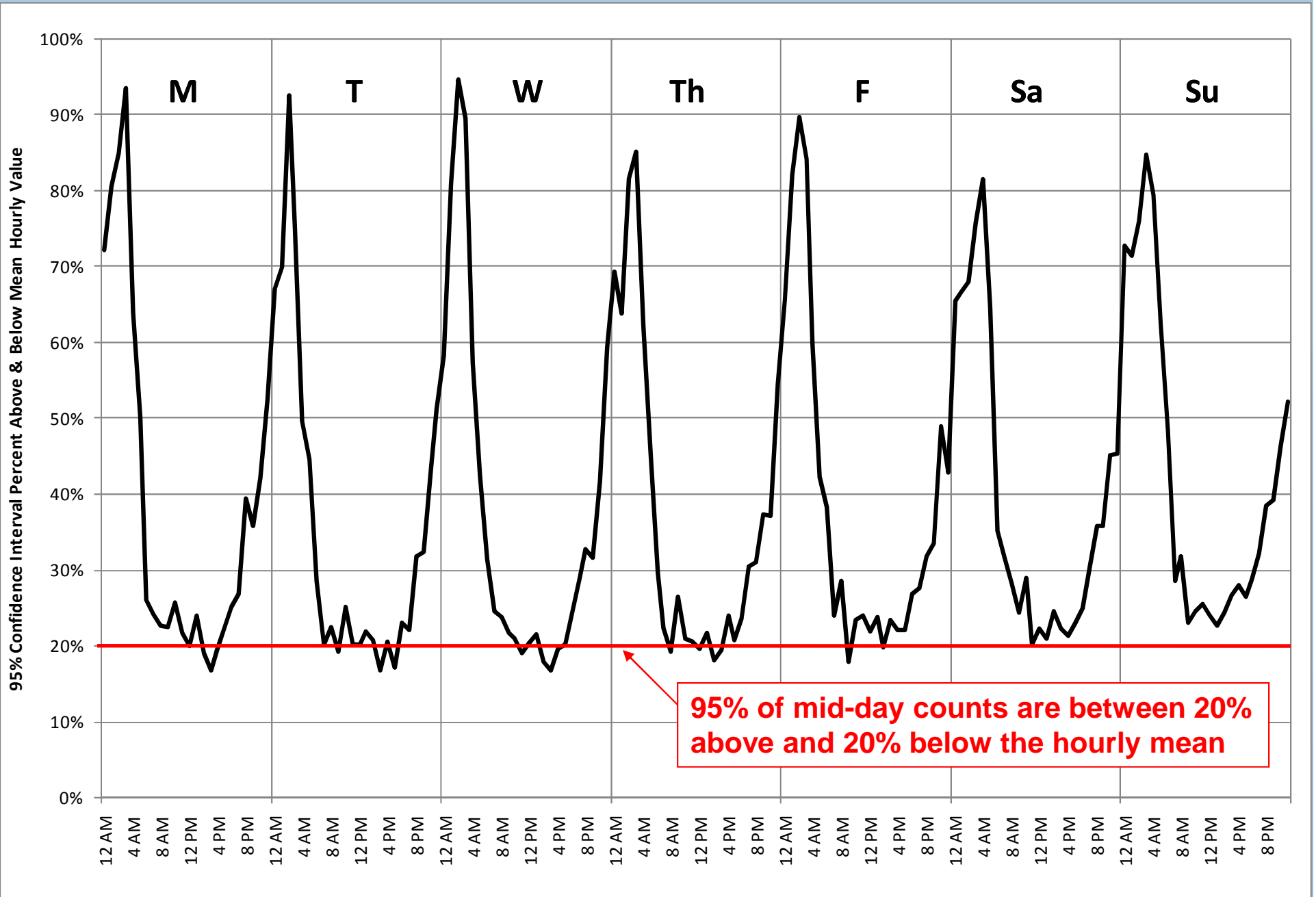
Variation in Pedestrian Volumes

- 5 Control Intersections

ID #	2008 Weekly Pedestrian Volume based on Counts	2009 Weekly Pedestrian Volume based on Counts	Absolute Difference (2009 - 2008)	Percent Difference ¹
50	315	310	-5	1.6%
2650	15691	16113	422	2.7%
9179	8342	7429	-913	12.3%
9436	105297	88118	-17179	19.5%
499	5186	3448	-1738	50.4%

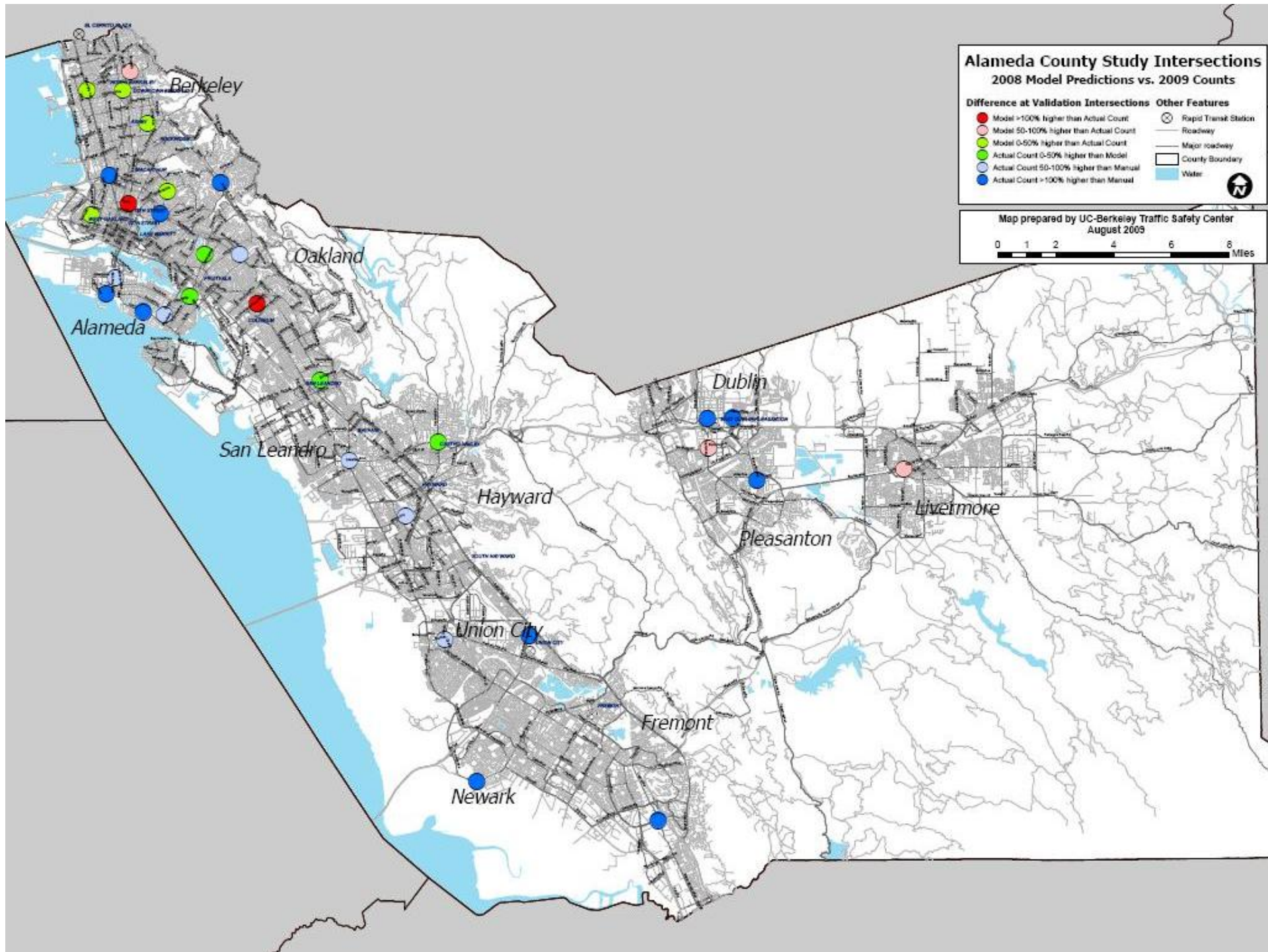
1) Percent difference is calculated using the smaller number as the base value. If the model value is greater than the actual value, the percent difference is calculated as $(2009 - 2008)/2008$. If the actual value is greater than the model value, the percent difference is calculated as $(2008 - 2009)/2009$.

Variation in "Typical" Alameda County Pedestrian Activity Pattern



Variation in Pedestrian Volumes

- Time of day, weather, etc. (accounted for)
- Measurement error
- “Unexplainable” variation
 - Individual sickness, people walking for scenery, store sales, etc.
 - Not feasible to predict in a planning-level model
 - Require additional data and cost for small benefit



Alameda County Revised Model

Estimated Weekly Pedestrian Crossings =

$$\begin{aligned} & 0.987 * \text{Total population within 0.5-miles of the} \\ & \quad \text{intersection} \\ + & 2.19 * \text{Total employment within 0.25-miles of the} \\ & \quad \text{intersection} \\ + & 71.1 * \text{Number of commercial properties within 0.25-} \\ & \quad \text{miles of the intersection} \\ + & 49,300 * \text{Number of regional transit stations within 0.10-} \\ & \quad \text{miles of the intersection} \\ - & 4850 \quad (\text{Constant}) \end{aligned}$$

Adjusted $R^2 = 0.900$

Root Mean Squared Error = 5310

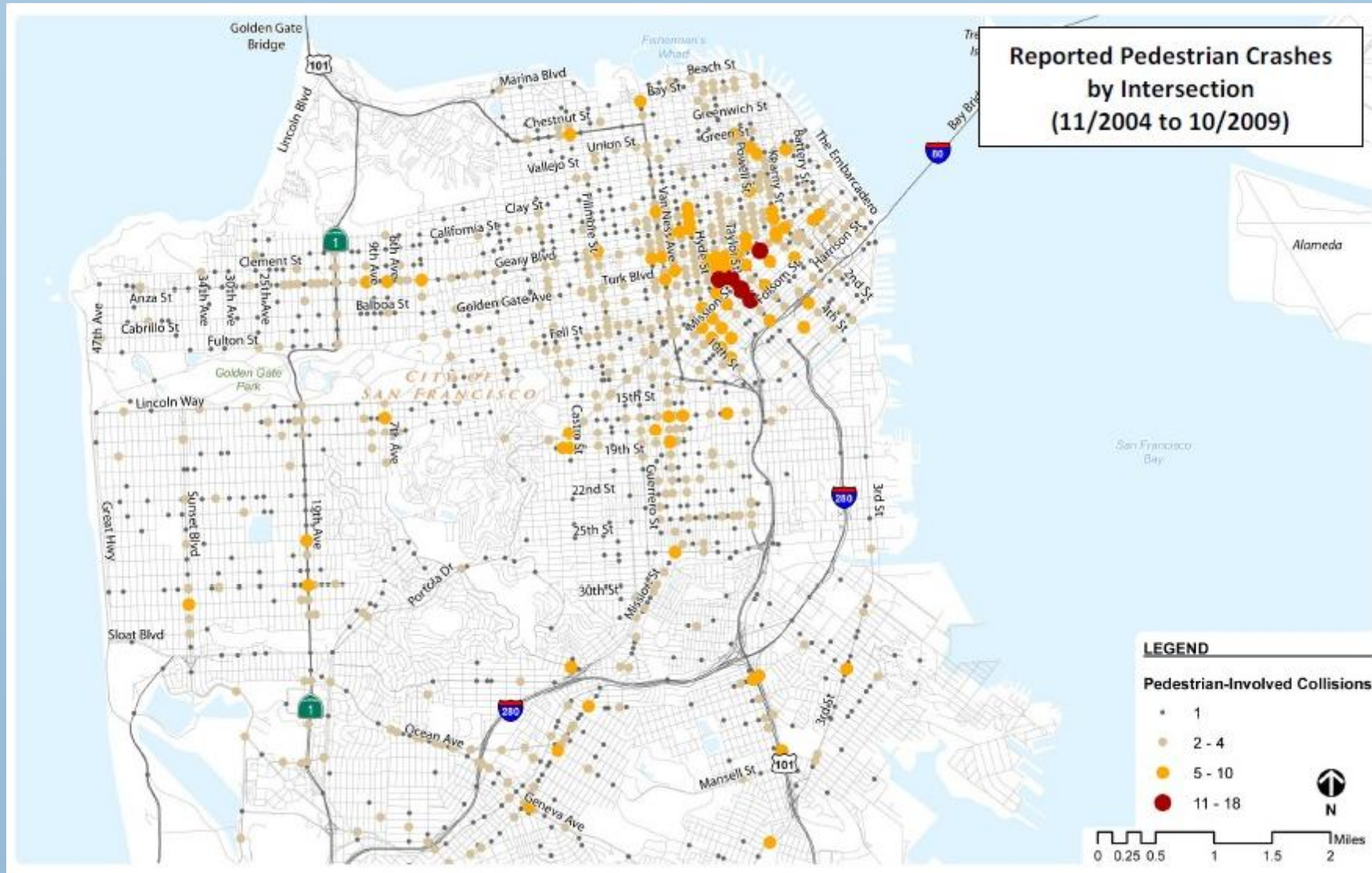
Explanatory variables significant at 93% confidence interval

Key Consideration for Applying Existing Pedestrian & Bicycle Volume Models

- Designed for estimating volumes at neighborhood, corridor, and community levels. Actual pedestrian counts should be used for site-level safety, design, and engineering analyses.



Application for Pedestrian Safety Analysis: San Francisco Pedestrian Volume Model



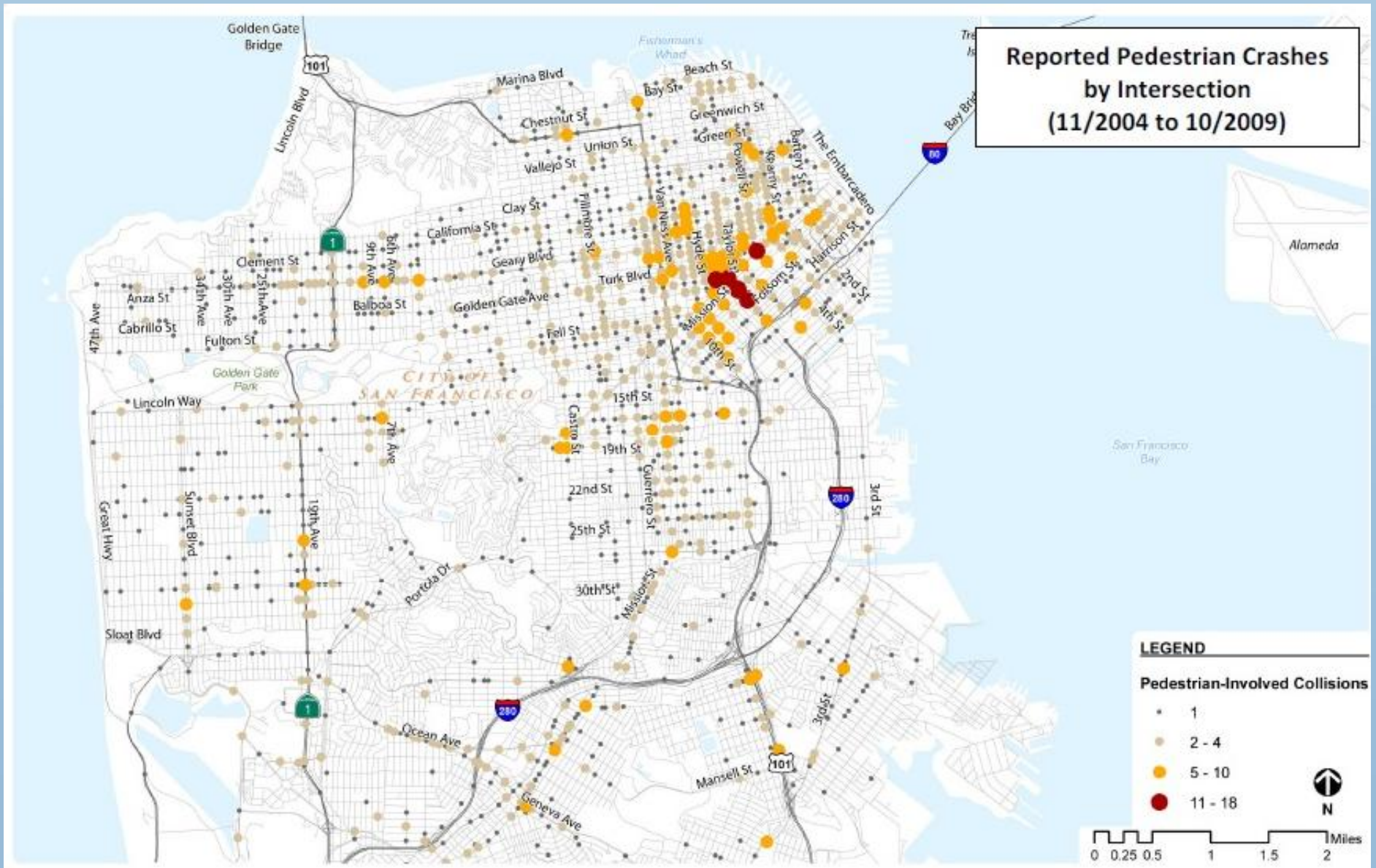
Schneider, R.J., et al. "Development and Application of the San Francisco Pedestrian Intersection Volume Model" (2012).
Map prepared by Fehr & Peers Transportation Consultants

San Francisco Pedestrian Volume Model

Dependent Variable = Natural Logarithm of Total Annual Pedestrian Intersection Crossings ¹			
	Recommended Model		
Model Variables ²	Coefficient	t-value	p-value
Total households within 1/4 mile (10,000s)	1.81	2.12	0.040
Total employment within 1/4 mile (100,000s)	2.43	2.22	0.032
Intersection is in a high-activity zone	1.27	3.79	0.000
Maximum slope on any intersection approach leg (100s)	-9.40	-3.07	0.004
Intersection is within 1/4 mile of a university campus	0.635	1.45	0.154
Intersection is controlled by a traffic signal	1.16	4.03	0.000
Constant	12.9	33.29	0.000
Overall Model			
Sample Size (N)	50		
Adjusted R ² -Value	0.804		
F-Value (Test value)	34.4 ($p < 0.001$)		

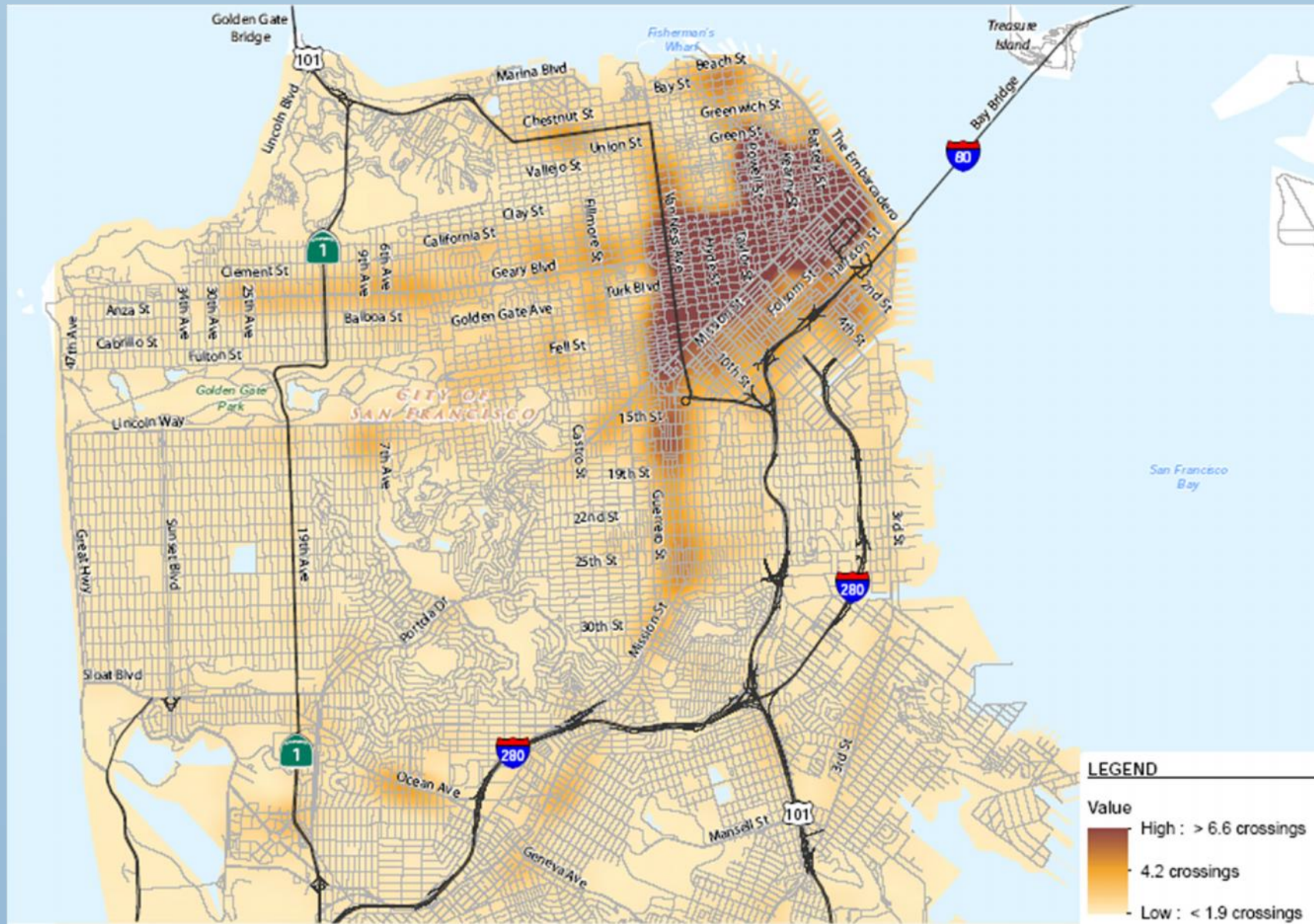
- 1) The dependent variable is the natural logarithm of the annual pedestrian intersection crossing volume at each of the 50 study intersections. This represents the sum of all crossings on each approach leg within 50 feet of intersection. The annual volume estimate is extrapolated from a two-hour manual count taken in September 2009 or July-August 2010. The extrapolation method accounts for variations in pedestrian activity by time of day, day of week, weather, and land use.
- 2) All distances used to calculate the model variables are straight-line distances rather than roadway network distances.

Reported pedestrian crashes



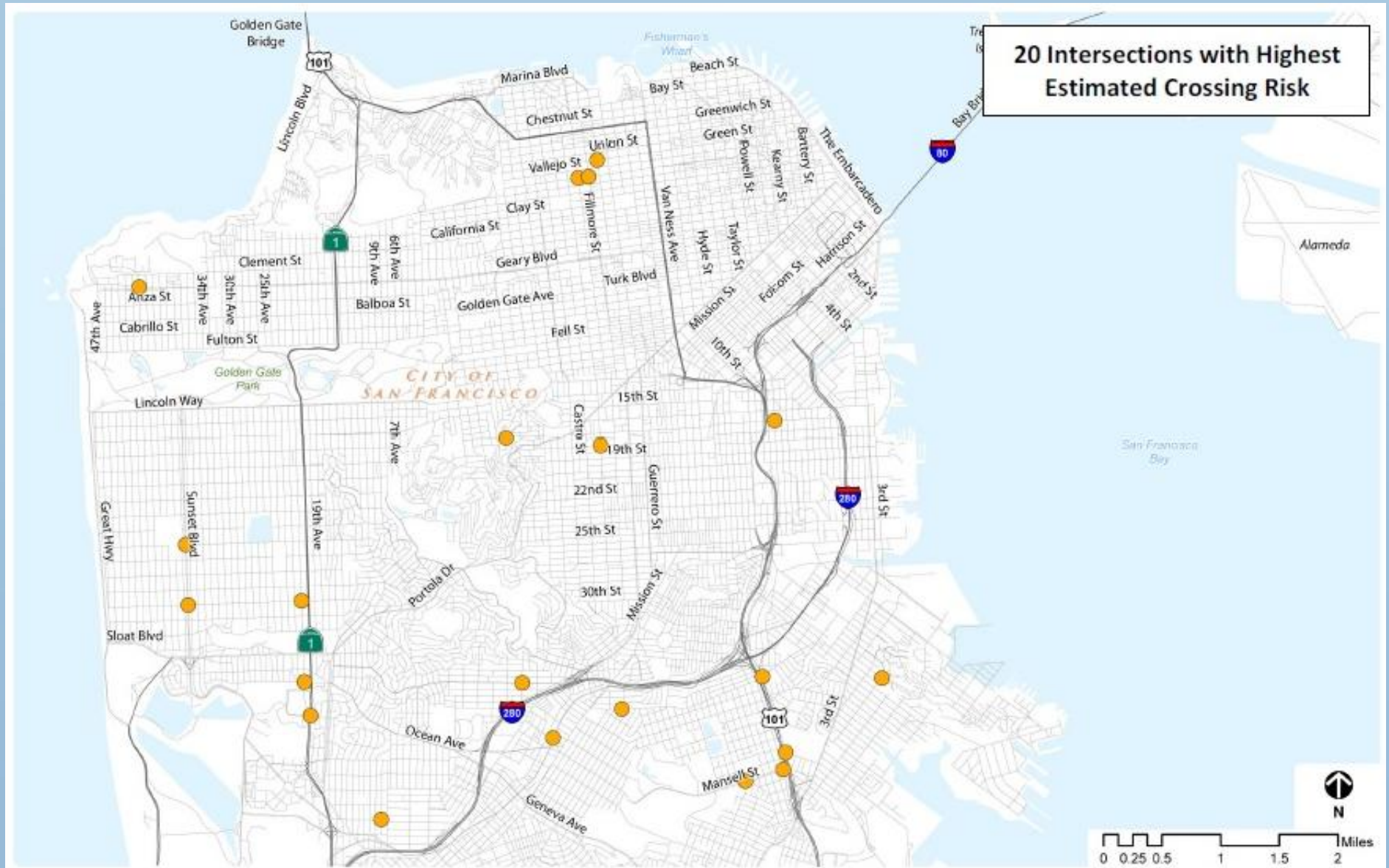
Schneider, R.J., et al. "Development and Application of the San Francisco Pedestrian Intersection Volume Model" (2012). Map prepared by Fehr & Peers Transportation Consultants

Model-estimated pedestrian crossings



Schneider, R.J., et al. "Development and Application of the San Francisco Pedestrian Intersection Volume Model" (2012).
Map prepared by Fehr & Peers Transportation Consultants

Highest Estimated Pedestrian Crash Risk



Schneider, R.J., et al. "Development and Application of the San Francisco Pedestrian Intersection Volume Model" (2012).
Map prepared by Fehr & Peers Transportation Consultants

General Characteristics of Intersections with Highest Pedestrian Risk in SF

- Most were unsignalized intersections.
- Many were along multilane arterial roadways.
- Several were located near schools.
- Several were in areas with steep slopes.



Bicycle Intersection Volume Models



San Diego County Bicycle Volume Model

PM Peak Hour Intersection Volume =

$$\text{BAM} = -4.279 + 0.718 * C + 0.438 * \text{ED}$$

Where:

BAM = Morning peak bicycle count

C = Footage of Class I bicycle path within a quarter-mile

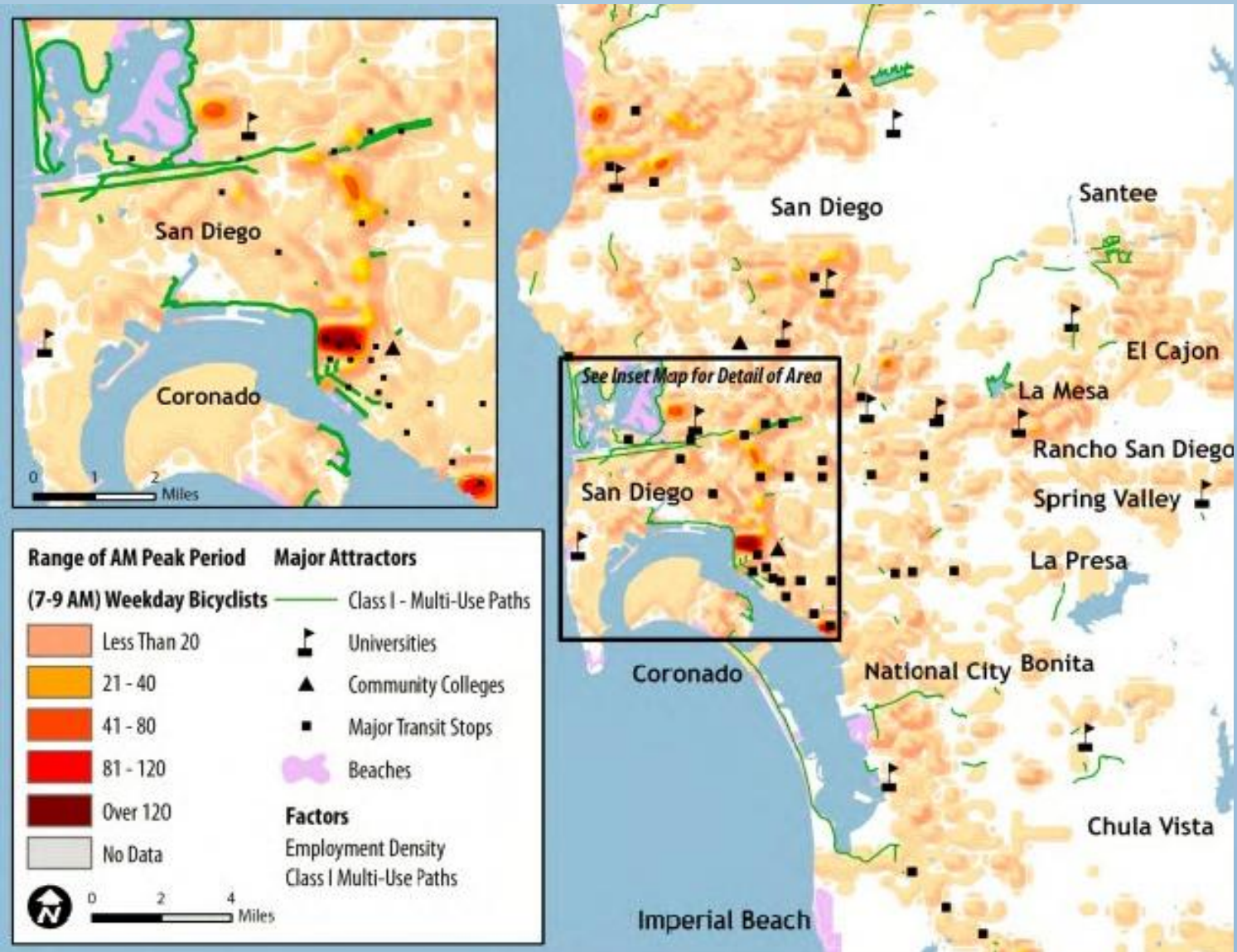
ED = Employment density within a quarter-mile

$$R^2 = 0.474$$

Explanatory variables significant at 95% confidence interval

Source: Jones, M.G., S. Ryan, J. Donlan, L. Ledbetter, L. Arnold, and D. Ragland. Seamless Travel: Measuring Bicycle and Pedestrian Activity in San Diego County and its Relationship to Land Use, Transportation, Safety, and Facility Type, Prepared by Alta Planning & Design and UC Berkeley SafeTREC, California Department of Transportation Task Order 6117, 2010.

San Diego County Bicycle Volume Model



Source: Jones, M.G. et al. Seamless Travel: Measuring Bicycle and Pedestrian Activity in San Diego County and its Relationship to Land Use, Transportation, Safety, and Facility Type, 2010.

Santa Monica Bicycle Volume Model

PM Peak Hour Bicycle Intersection Volume =

$$\begin{aligned} &+ 10.97 && * \text{Land Use Mix} \\ &+ 0.342 && * \text{PM Bus Frequency} \\ &- 5.809 \times 10^{-3} && * \text{Population Density Under Age 18} \\ &+ 5.581 && * \text{Bike Network Score} \\ &+ 14.89 && (\text{Constant}) \end{aligned}$$

$$R^2 = 0.471$$

Explanatory variables significant at 95% confidence interval

Alameda County Bicycle Volume Models

Table 4. Alternative Bicycle Model Specifications

Model Variable	Model A: All Counts		Model B: Weekday		Model C: Weekend		Model D: Weekday Alt.	
	Coeff.	St. Err.	Coeff.	St. Err.	Coeff.	St. Err.	Coeff.	St. Err.
Dependent Variable = 2-hr Intersection Bicycle Count								
Constant	3.776	0.185***	3.899	0.262***	3.652	0.255***	-1.127	0.855
NComPropT	0.024	0.007***	0.030	0.010***	0.017	0.010*		
BikeSym	0.477	0.163***	0.437	0.230*	0.517	0.225***	0.459	0.269*
lnUCBDist	-0.458	0.059***	-0.546	0.083***	-0.369	0.081***		
SlopeH	-0.517	0.073***	-0.659	0.103***	-0.375	0.100***	-0.470	0.117***
CNRH							4.634	0.989***
Count09	0.811	0.127***	1.002	0.180***	0.620	0.176***	1.036	0.211***
Overall Model								
Sample size (N)	162		81		81		81	
Adjusted R ²	0.505		0.600		0.386		0.450	
F-test	33.87***		24***		11.08***		17.38***	

NOTE: Coeff. = coefficient and Std. Err. = standard error. *** = significant at 99% (p < .01); ** = significant at 95% (p < .05); * = significant at 90% (p < .10). Model variables are defined in Table 3.

Source: Griswold, J.B., A. Medury, and R.J. Schneider. "Pilot Models for Estimating Bicycle Intersection Volumes," Transportation Research Record, Transportation Research Board, 2011.

Alameda County Bicycle Volume Models

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Overall Model								
Sample size (N)	162							
Adjusted R ²	0.505							
F-test	33.87***							

NOTE: Coeff. = coefficient and Std. Err. = standard error (t-statistic in parentheses); * = significant at 90% (p < .10). Model variables are

- Commercial properties within 0.1 miles
- Bicycle facility on intersection approach
- **Distance to UC Berkeley**
- **Slope**
- Roadway network connectivity

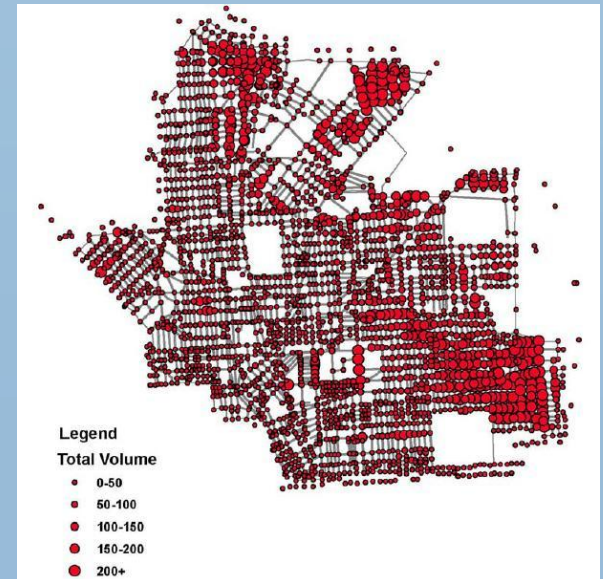
Source: Griswold, J.B., A. Medury, and R.J. Schneider. "Pilot Models for Estimating Bicycle Intersection Volumes," Transportation Research Record, Transportation Research Board, 2011.

Common Bicycle Volume Model Variables

- Presence of bicycle facilities (e.g., multi-use trails, bicycle lanes)
- Employment or population density
- Proximity to commercial areas



Future Research



Conclusions

- Volume model uses: Planning, general risk analysis
- Location-based models have been developed recently
 - Simple regression equations with spreadsheet applications
 - Other methods are being explored (Portland, NCHRP, others)
- Community-specific models (No universal model yet)
- Planning-level accuracy
- Pedestrian models more common than bicycle



Questions & Discussion



UC Berkeley Safe Transportation Research & Education Center
(SafeTREC)

www.safetrec.berkeley.edu

Thank You!

⇒ **Archive at** <http://www.walkinginfo.org/webinars>

- Downloadable and streaming recording, transcript, presentation slides

⇒ **Questions?**

- E-mail **David Ragland** at davidr@berkeley.edu
- E-mail **John Bigham** at jbigham@berkeley.edu
- E-mail **Robert Schneider** at rjschneider@berkeley.edu



Pedestrian and Bicycle Information Center