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## UNDERSTANDING REGIONAL TRAVEL PATTERNS WITH BIG DATA <br> Hadi Sadrsadat, PhD <br> Vincent L. Bernardin, Jr, PhD <br> Dan Avery

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Introduction

## Introduction

- The Northeastern Indiana Regional Coordinating Council (NIRCC) invested in passively collected big data to better understand
> The movements of both people and truck freight into, out of, through, and within Northeastern Indiana
- No cost-constrained survey can provide a picture of the OD trip matrix at the level of zones or even moderately disaggregate districts
- Traditional surveys typically contain observations for $3 \%$ or less of the cells in the OD matrix
- Passive OD data typically provides observations for a quarter to a third of the cells in a regional OD matrix


## Raw Big Data

- Purchased StreetLight Data:
> CUEBIQ
- Location-based services (LBS) data
- Drawn from smartphone applications
- Reflects trips for all travelers/vehicle classes together
> INRIX
- Based on navigational global positioning systems (GPS) devices
- Trips by vehicle class (auto, single-unit trucks, and multi-unit trucks)


## HYBRID Data

- 2 Vehicle Classes
> Auto and Trucks (SUT + MUT)
- IE\EIVEE Trips are from INRIX
- I-I Trips:
> Auto: CUEBIQ minus INRIX Trucks
> Truck: INRIX


## Raw Big Data



- Higher percentage of short trips (shorter than 15 minutes) in the survey
- Higher share in trips between 20 and 55 minutes in passive OD data
- Passive OD data is biased by trip length/duration


## Big Data Expansion

- Passive OD data should be expanded to accurately represent all travel of interest
- If the passive OD data is properly expanded, the resulting trip table is a very reliable tool for analyzing the movements of travelers and trucks in the region

Big Data Expansion

## Expansion Methods

- Traffic Count Methods
> Simple Scaling
> Variable Scaling
* Matrix Partitioning
$\checkmark$ Iterative Screenline Fitting (ISF)
* Network Assignment-Based
$\checkmark$ Parametric Scaling
$\checkmark$ Nonparametric (ODME)
o Direct ODME
o Indirect ODME
- Other Sample Penetration Methods
> Market Penetration
> Trip Generation-Based

ISF

- 93 screenlines were built for the region:
> 66 polygons
$>27$ screenlines crossing the region and partitioning the entire region to 2 subareas
- Criteria to prepare screenlines:
$>$ Count station locations,
$>$ zone borders,
$>$ centroid connector locations, and
$>$ naturallphysical barriers such as rivers, freeways, and waterways
- 902 links out of 3,738 links with AADT cross the screenlines
- The majority portion of counts can be used for validation
$>$ Only 24 percent of counts will be used in the trip table adjustment


## 93 Screenlines



## 11 New Screenlines (Details in Allen County)



## Methodology

- Iterative trip table expansion process
- Dividing trip table to 4 quadrant for each screenline
> Diagonal quadrants are not changed
> Non-diagonal quadrants are factored
- Tagging links crossing each screenline
- Counting number of crossing for each link



## Methodology

- The factor for diagonal quadrants is 1
- The non-diagonal quadrants' factor for each screenline:
- Ratio of weighted total count to wighted total volume of all link crossing the screenline
- Weights:
- Number of screenline crossing
- Functional Class (2 for highways)
- Area Type (2 for Allen County)
- Saving the corresponding factor for each cell ( $i$ to $j$ ) in a separate matrix (one matrix for each screenline, totally 93 matrices)

- Taking the average of 93 factors for each cell (factors equal to 1 are excluded)


## Improving ISF with ODME

- Independent ODME
> To check and evaluate ISF performance
- Sequential ODME
> To obtain the best trip table from BIG Data
$>$ To limit over-fitting to counts by ODME
> Upper and lower bounds ( 3 and 0.5 ) were imposed on ODME expansion factors
> The number of ODME iterations was also limited to 15 to avoid extreme change in trips


## Summary

All Vehicle Classes and All Links with AADT > 0

| Data | Fratar RMSE (\%) | ISF RMSE (\%) | Sequential ODME (\%) |
| :--- | :---: | :---: | :---: |
| CUEBIQ | 64.79 | 52.85 | 42.51 |
| INRIX | 65.92 | 55.70 | 49.82 |
| HYBRID | 56.61 | 55.04 | 51.87 |

## Summary

- ISF improved CUEBIQ, INRIX, and HYBRID compared to fratar
- Sequential ODME significantly improved CUEBIQ, INRIX, and HYBRID compared to ISF
- Sequential ODME also yielded slightly better results compared to independent ODME
- Number of links with AADT affects the expansion method performance

Regional Interactions of Communities of Interest

## Community Analysis

- 20 Communities
> 12 Primary Communities
> 8 Secondary Communities
- Based on CUEBIQ Data after ISF and Sequential ODME


## Selected Communities



## Daily Flow between Communities

| Community | Ft. Wayne | Auburn | Angola | Decature | Bluffton | Huntington | Warsaw | Lagrange | Wabash | N Manchester | Columbia City | Kendallville | Secondary | Other | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Ft. Wayne | 1,202,846 | 4,544 | 470 | 1,334 | 2,863 | 1,980 | 2,143 | 360 | 791 | 281 | 3,082 | 1,055 | 50,118 | 70,339 | 1,342,205 |
| Auburn | 4,626 | 86,830 | 236 | 22 | 19 | 30 | 52 | 32 | 16 | 3 | 149 | 962 | 2,651 | 9,682 | 105,311 |
| Angola | 438 | 209 | 32,504 | 2 | 6 | 0 | 9 | 225 | 0 | 0 | 4 | 607 | 2,970 | 12,111 | 49,085 |
| Decature | 1,295 | 21 | 6 | 48,603 | 1,007 | 28 | 10 | 0 | 13 | 0 | 10 | 4 | 582 | 4,800 | 56,380 |
| Bluffton | 2,705 | 13 | 2 | 890 | 53,018 | 322 | 7 | 0 | 17 | 0 | 50 | 3 | 4,044 | 4,985 | 66,057 |
| Huntington | 1,811 | 22 | 1 | 46 | 383 | 73,057 | 45 | 6 | 359 | 36 | 212 | 6 | 376 | 7,321 | 83,680 |
| Warsaw | 1,951 | 49 | 11 | 4 | 4 | 52 | 127,113 | 2 | 92 | 128 | 572 | 12 | 350 | 14,495 | 144,835 |
| Lagrange | 316 | 47 | 278 | 2 | 0 | 0 | 6 | 8,279 | 0 | 0 | 33 | 558 | 81 | 7,318 | 16,917 |
| Wabash | 860 | 13 | 0 | 30 | 8 | 383 | 110 | 0 | 39,402 | 444 | 83 | 0 | 49 | 4,702 | 46,085 |
| N Manchester | 342 | 0 | 0 | 0 | 0 | 34 | 137 | 0 | 448 | 928 | 25 | 0 | 25 | 2,066 | 4,007 |
| Columbia City | 3,087 | 173 | 2 | 10 | 29 | 198 | 520 | 22 | 67 | 18 | 40,891 | 165 | 1,249 | 6,731 | 53,161 |
| Kendallville | 1,031 | 992 | 557 | 3 | 5 | 6 | 19 | 583 | 1 | 0 | 50 | 38,917 | 478 | 7,709 | 50,350 |
| Secondary | 50,192 | 2,583 | 3,035 | 590 | 3,986 | 409 | 497 | 68 | 49 | 25 | 1,156 | 548 | 66,070 | 21,049 | 150,257 |
| Other | 72,412 | 9,656 | 11,847 | 4,848 | 4,730 | 7,432 | 14,516 | 7,337 | 4,825 | 1,882 | 6,736 | 7,589 | 21,087 | 340,860 | 515,759 |
| Total | 1,343,914 | 105,153 | 48,948 | 56,384 | 66,056 | 83,932 | 145,184 | 16,914 | 46,081 | 3,745 | 53,054 | 50,427 | 150,129 | 514,169 | 2,684,090 |

## Daily Flow between Communities

- Travel within communities far outweighs travel between them within the region



## Daily Flow between Communities (No Intradistrict)

- Travel to/from communities is dominated by travel into / out of the region (Other)



## Desire Lines between Primary Communities

- Interactions with Ft. Wayne are dominant as expected
- Main partners are
- Auburn/Garrett
- Columbia City
- Warsaw
- Bluffton
- Huntington
- Bluffton - Ossian is strongest interaction not involving Ft. Wayne



## OD Bound to/from Ft. Wayne/New Haven



## Top 20 Daily Flows between Communities

| Rank | Daily Flow | Community 1 | Community 2 |
| ---: | ---: | :--- | :--- |
| 1 | 56,479 | Huntertown | Ft. Wayne/New Haven |
| 2 | 30,473 | Leo-Cedarville | Ft. Wayne/New Haven |
| 3 | 9,170 | Auburn/Garrett | Ft. Wayne/New Haven |
| 4 | 7,139 | Ossian | Bluffton |
| 5 | 6,169 | Columbia City | Ft. Wayne/New Haven |
| 6 | 5,798 | Fremont | Angola |
| 7 | 5,568 | Bluffton | Ft. Wayne/New Haven |
| 8 | 4,500 | Ossian | Ft. Wayne/New Haven |
| 9 | 4,104 | Churubusco | Ft. Wayne/New Haven |
| 10 | 4,094 | Warsaw/Winona Lake | Ft. Wayne/New Haven |
| 11 | 3,791 | Huntington | Ft. Wayne/New Haven |
| 12 | 2,629 | Decatur | Ft. Wayne/New Haven |
| 13 | 2,354 | Butler | Auburn/Garrett |
| 14 | 2,086 | Kendallville | Ft. Wayne/New Haven |
| 15 | 1,955 | Kendallville | Auburn/Garrett |
| 16 | 1,953 | Berne | Ft. Wayne/New Haven |
| 17 | 1,896 | Bluffton | Decatur |
| 18 | 1,651 | Wabash | Ft. Wayne/New Haven |
| 19 | 1,508 | S. Whitley | Ft. Wayne/New Haven |
| 20 | 1,340 | S. Whitley | Columbia City |

## Top 5 Communities for each Community

| Community | First | Second | Third | Forth | Fifth |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Ft. Wayne/New Haven | Huntertown | Leo-Cedarville | Auburn/Garrett | Columbia City | Bluffton |
| Auburn/Garrett | Ft. Wayne/New Haven | Butler | Kendallville | Huntertown | Leo-Cedarville |
| Angola | Fremont | Kendallville | Ft. Wayne/New Haven | Lagrange | Auburn/Garrett |
| Decatur | Ft. Wayne/New Haven | Bluffton | Berne | Ossian | Huntington |
| Bluffton | Ossian | Ft. Wayne/New Haven | Decatur | Berne | Huntington |
| Huntington | Ft. Wayne/New Haven | Wabash | Bluffton | Columbia City | Berne |
| Warsaw/Winona Lake | Ft. Wayne/New Haven | Columbia City | Churubusco | N. Manchester | Wabash |
| Lagrange | Kendallville | Ft. Wayne/New Haven | Angola | Fremont | Auburn/Garrett |
| Wabash | Ft. Wayne/New Haven | N. Manchester | Huntington | Warsaw/Winona Lake | Columbia City |
| N. Manchester | Wabash | Ft. Wayne/New Haven | Warsaw/Winona Lake | Huntington | Columbia City |
| Columbia City | Ft. Wayne/New Haven | S. Whitley | Warsaw/Winona Lake | Churubusco | Huntington |
| Kendallville | Ft. Wayne/New Haven | Auburn/Garrett | Angola | Lagrange | Fremont |
| Huntertown | Ft. Wayne/New Haven | Auburn/Garrett | Leo-Cedarville | Columbia City | Churubusco |
| Leo-Cedarville | Ft. Wayne/New Haven | Auburn/Garrett | Huntertown | Butler | Warsaw/Winona Lake |
| Butler | Auburn/Garrett | Ft. Wayne/New Haven | Kendallville | Leo-Cedarville | Angola |
| Fremont | Angola | Kendallville | Ft. Wayne/New Haven | Auburn/Garrett | Lagrange |
| Berne | Ft. Wayne/New Haven | Decatur | Bluffton | Ossian | Huntington |
| Ossian | Bluffton | Ft. Wayne/New Haven | Berne | Huntington | Decatur |
| Churubusco | Ft. Wayne/New Haven | Auburn/Garrett | Columbia City | Warsaw/Winona Lake | Huntertown |
| S. Whitley | Ft. Wayne/New Haven | Columbia City | Warsaw/Winona Lake | Huntington | N. Manchester |

## Origin and Destination for Key Facilities

## Key Facility Analysis

- 30 Primary Gates
- 30 Secondary Gates
- INRIX Trips after ISF and Sequential ODME


## Gates



## Primary Gates' Results

| Facility Name | Through Trips | To/From the Region | Inside Ft. Wayne/New Haven | To/From Ft. Wayne/New Haven | Inside the Region without Ft. Wayne/New Haven |
| :---: | :---: | :---: | :---: | :---: | :---: |
| I-69 N. of I-80/I-90 | 7,051 | 15,676 | 4 | 342 | 3,147 |
| 1-69 S. of US 6 | 3,706 | 11,520 | 65 | 7,552 | 8,919 |
| 1-69 S. of US 30 | 4,470 | 11,365 | 36,770 | 17,596 | 3,752 |
| I-69 S. of I-469S | 9,147 | 14,418 | 184 | 4,403 | 1,586 |
| I-69 N. of SR 18 | 9,229 | 17,891 | 18 | 45 | 68 |
| I-469 E. of I-69 N | 1,691 | 8,180 | 22,156 | 12,232 | 3,854 |
| I-469 between US 30 \& US 24 | 7,313 | 11,099 | 5,357 | 8,931 | 4,821 |
| I-469 E. of US 27 | 5,662 | 7,404 | 2,287 | 5,203 | 2,572 |
| I-469 E. of I-69S | 5,471 | 5,841 | 1,800 | 8,301 | 3,045 |
| I-80/I-90 E. SR 13 | 5,242 | 3,728 | 0 | 2 | 71 |
| I-80/I-90 W. of IN/OH State Line | 3,325 | 16,848 | 0 | 2 | 115 |
| US 20 E . of SR 13 | 355 | 5,160 | 4 | 5 | 293 |
| US 20 W . of I-69 | 619 | 2,212 | 5 | 395 | 4,464 |
| US 20 W . of IN/OH State Line | 341 | 2,869 | 2 | 1 | 38 |
| US 6 W . of SR 5 | 1,555 | 8,612 | 10 | 253 | 3,094 |
| US 6 E . of Kendallville | 714 | 1,952 | 4 | 736 | 6,002 |
| US 6 W . of IN/OH State Line | 229 | 2,930 | 0 | 5 | 96 |
| US 33 E . of SR 5 | 1,333 | 4,327 | 11 | 1,157 | 1,488 |
| US 33 W . of US 30 | 1,171 | 2,949 | 7,241 | 7,893 | 1,195 |
| US 33 W . of IN/OH State Line | 324 | 3,153 | 0 | 49 | 150 |
| US 30 W . of SR 19 | 1,446 | 8,572 | 6 | 10 | 52 |
| US 30 E . of Warsaw | 1,424 | 4,307 | 36 | 4,459 | 11,297 |
| US 30 E . of Columbia City | 1,299 | 4,175 | 138 | 13,270 | 16,966 |
| US 30 E . of US 27 (Lima Rd) | 3 | 868 | 36,126 | 7,265 | 403 |
| US 30 W . of IN/OH State Line | 1,754 | 11,566 | 24 | 87 | 129 |
| US 24 W . of Wabash | 1,057 | 6,285 | 6 | 17 | 272 |
| US 24 W . of Huntington | 758 | 3,175 | 13 | 2,300 | 5,517 |
| US 24 S. of CR E900N | 624 | 2,616 | 117 | 9,829 | 4,437 |
| US 24 W . of IN/OH State Line | 5,765 | 6,598 | 21 | 39 | 64 |
| US 27 S. of Geneva | 172 | 4,487 | 4 | 20 | 49 |

## Secondary Gates' Results

| Facility Name | Through Trips | To/From the Region | Inside Ft. Wayne/New Haven | To/From Ft. Wayne/New Haven | Inside the Region without Ft. Wayne/New Haven |
| :---: | :---: | :---: | :---: | :---: | :---: |
| I-69 S. of I-80/I-90 | 3,961 | 13,633 | 4 | 457 | 3,200 |
| I-69 N. of US 6 | 4,247 | 12,213 | 37 | 4,162 | 8,873 |
| I-69 between SR 1 \& I-469N | 3,666 | 10,567 | 25,215 | 21,885 | 4,914 |
| I-69 S. of I-469N | 4,559 | 11,345 | 29,482 | 22,205 | 3,595 |
| I-69 N. of US 24 | 4,389 | 11,349 | 22,862 | 14,658 | 3,716 |
| I-69 N. of I-469S | 4,362 | 12,094 | 5,902 | 10,598 | 2,533 |
| I-469 N. of US 24 | 2,025 | 8,608 | 6,627 | 9,771 | 4,761 |
| 1-469 S. of US 30 | 5,520 | 5,744 | 2,726 | 4,955 | 3,038 |
| I-469 W. of US 27 | 5,659 | 6,269 | 1,840 | 5,517 | 2,541 |
| I-80/I-90 E. SR 9 | 4,713 | 5,272 | 0 | 30 | 995 |
| I-80/I-90 W. SR 9 | 5,411 | 4,259 | 0 | 12 | 794 |
| US 20 E . of Lagrange | 557 | 1,891 | 5 | 237 | 6,690 |
| US 20 E . of I-69 | 195 | 1,972 | 7 | 769 | 5,541 |
| US 6 W . of Kendallville | 844 | 3,666 | 9 | 2,209 | 8,889 |
| US 6 W . of I-69 | 733 | 2,237 | 4 | 1,263 | 6,387 |
| US 6 E. of I-69 | 437 | 2,310 | 23 | 1,887 | 5,790 |
| US 33 W . of Churubusco | 1,218 | 3,191 | 37 | 3,394 | 3,420 |
| US 30 W . of Warsaw | 1,268 | 8,010 | 7 | 392 | 3,763 |
| US 30 W . of Columbia City | 1,203 | 3,850 | 48 | 6,259 | 10,390 |
| US 30 W . of US 33 | 1,413 | 4,549 | 10,409 | 18,313 | 3,526 |
| US 30 E . of US 33 | 2,393 | 7,346 | 17,140 | 22,810 | 4,246 |
| US 30 E . of I-69 | 92 | 4,206 | 25,353 | 19,373 | 683 |
| US 30 W . of I-469 | 35 | 2,495 | 4,982 | 8,957 | 267 |
| US 30 E . of I-469 | 1,580 | 10,308 | 80 | 4,204 | 1,802 |
| US 24 E . of Wabash | 758 | 3,306 | 9 | 1,794 | 4,315 |
| US 24 W . of I-69 | 286 | 2,187 | 26,655 | 11,484 | 1,338 |
| US 24 E . of I-469 | 5,755 | 5,819 | 200 | 6,128 | 1,890 |
| US 27 S . of SR 930 | 61 | 702 | 26,637 | 5,964 | 239 |
| US 27 N . of I-469 | 150 | 1,399 | 1,375 | 5,553 | 210 |
| US 27 S. of I-469 | 432 | 4,442 | 232 | 6,285 | 1,776 |

## Results by Corridor

| Corridor | Through Trips | To/From the Region | Inside Ft. Wayne/New Haven | To/From Ft. Wayne/New Haven | Inside the Region without Ft. Wayne/New Haven |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1-69 | 58,789 | 142,070 | 120,544 | 103,903 | 44,304 |
| 1-469 | 33,340 | 53,145 | 42,793 | 54,911 | 24,631 |
| 1-80/I-90 | 18,691 | 30,106 | 0 | 46 | 1,976 |
| US 20 | 2,065 | 14,104 | 23 | 1,407 | 17,026 |
| US 6 | 4,513 | 21,707 | 50 | 6,353 | 30,259 |
| US 33 | 4,045 | 13,620 | 7,289 | 12,494 | 6,254 |
| US 30 | 13,910 | 70,252 | 94,350 | 105,398 | 53,523 |
| US 24 | 15,004 | 29,986 | 27,021 | 31,592 | 17,834 |
| US 27 | 814 | 11,030 | 28,247 | 17,822 | 2,274 |

## Top 20 Gates Serving Trips within the Region



## Top 20 Gates Serving Trips to and from the Region



## Top 20 Gates Serving Trips through the Region







