

# LED in Action:

**“Wage Deserts:” An Exploration of Geographically Concentrated Working Poverty in Philadelphia, PA Using Census LEHD Data**

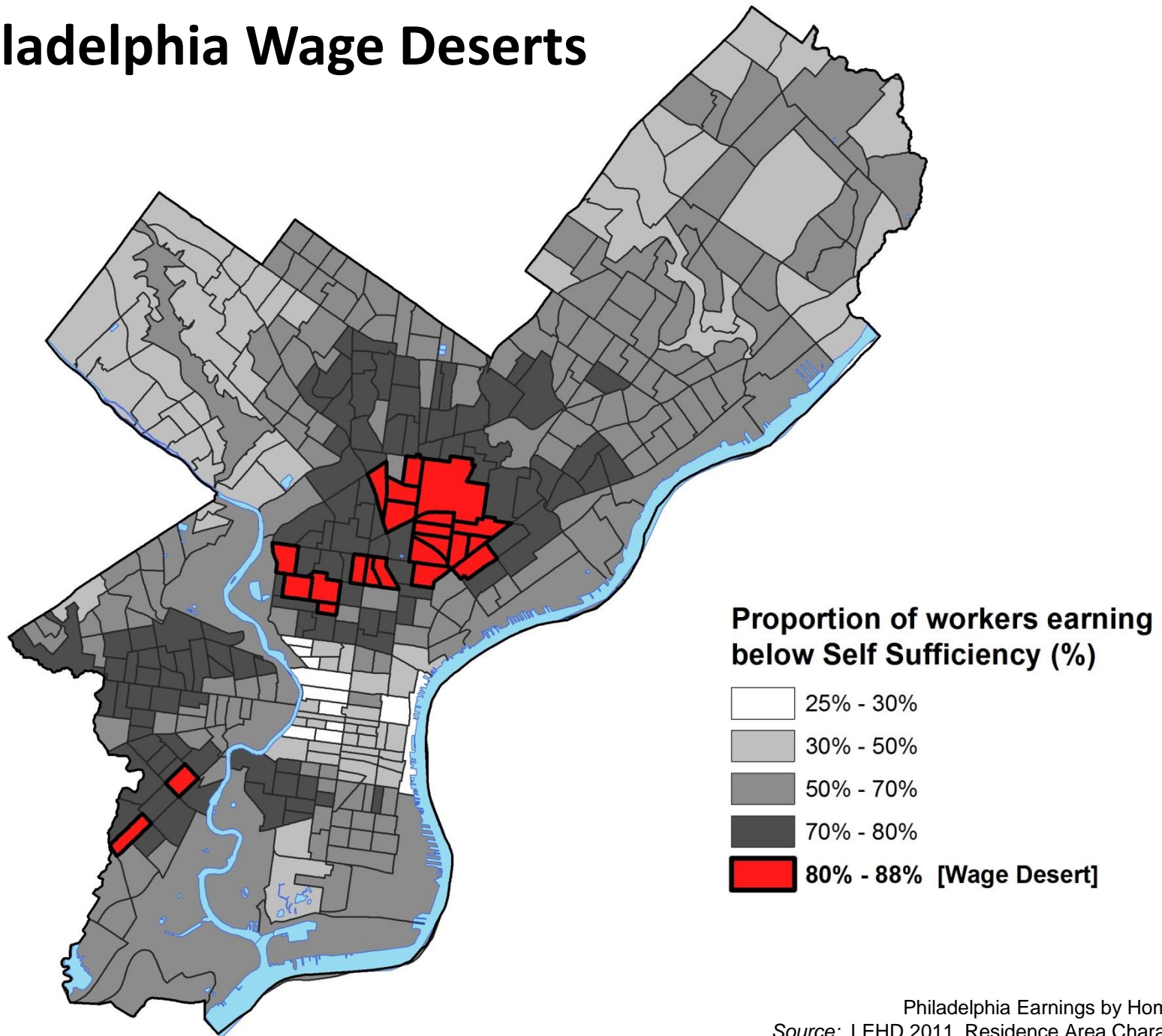
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# Philadelphia Wage Deserts



# Data Sources

- LODES data files
  - In this case, RAC
- GIS Data
  - Tracts (or for finer detail, block groups; blocks)
  - Any specific cartographic or analytical data you wish to compare to concentrations of low/high earnings

# Extraction and Mapping Process:

## Resident Area Characteristics (RAC) File

Objective: to apply and aggregate residents' job and earnings records to home census tracts

- Process steps:
  1. Aggregate LODES data from the Block Group to the Census Tract level
  2. Trim statewide RAC data to Philadelphia's 384 census tracts
  3. Characterize Wage Deserts at the city level
- Software: ArcGIS, *R* statistical package

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## Download LODES data\*:

Version:  State/Territory:

Type:

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[Metadata for VA](#) | [Geography crosswalk for VA](#) | [VA md5sum file](#)

|  |                   |      |
|--|-------------------|------|
| <a href="#">va_od_aux_JT01_2002.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT01_2003.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT01_2004.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT01_2005.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT01_2006.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT01_2007.csv.gz</a> | 14 Nov 2013 12:46 | 2 MB |
| <a href="#">va_od_aux_JT01_2008.csv.gz</a> | 14 Nov 2013 12:46 | 2 MB |
| <a href="#">va_od_aux_JT01_2009.csv.gz</a> | 14 Nov 2013 12:46 | 2 MB |
| <a href="#">va_od_aux_JT01_2010.csv.gz</a> | 14 Nov 2013 12:46 | 2 MB |
| <a href="#">va_od_aux_JT01_2011.csv.gz</a> | 14 Nov 2013 12:46 | 2 MB |
| <a href="#">va_od_aux_JT02_2002.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT02_2003.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT02_2004.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |
| <a href="#">va_od_aux_JT02_2005.csv.gz</a> | 14 Nov 2013 12:46 | 1 MB |

Microsoft Excel - dc\_rac\_S000\_JT01\_2011.csv

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Type a question for help

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|    | A               | B    | C    | D    | E    | F    | G    | H    | I     | J     | K     | L     |   |
|----|-----------------|------|------|------|------|------|------|------|-------|-------|-------|-------|---|
| 1  | h_geocode       | C000 | CA01 | CA02 | CA03 | CE01 | CE02 | CE03 | CNS01 | CNS02 | CNS03 | CNS04 | C |
| 2  | 110010001001000 | 598  | 177  | 291  | 130  | 120  | 170  | 308  | 0     | 1     | 1     | 9     |   |
| 3  | 110010001001001 | 6    | 2    | 2    | 2    | 0    | 1    | 5    | 0     | 0     | 0     | 0     |   |
| 4  | 110010001001002 | 45   | 9    | 26   | 10   | 4    | 5    | 36   | 0     | 0     | 0     | 1     |   |
| 5  | 110010001001003 | 45   | 14   | 23   | 8    | 6    | 6    | 33   | 0     | 0     | 0     | 0     |   |
| 6  | 110010001001004 | 31   | 8    | 15   | 8    | 2    | 8    | 21   | 0     | 0     | 0     | 3     |   |
| 7  | 110010001001005 | 12   | 3    | 9    | 0    | 2    | 1    | 9    | 0     | 0     | 0     | 2     |   |
| 8  | 110010001001006 | 36   | 13   | 18   | 5    | 5    | 6    | 25   | 0     | 0     | 0     | 2     |   |
| 9  | 110010001001007 | 10   | 3    | 3    | 4    | 0    | 0    | 10   | 0     | 0     | 0     | 1     |   |
| 10 | 110010001001008 | 14   | 4    | 7    | 3    | 1    | 3    | 10   | 0     | 0     | 0     | 0     |   |
| 11 | 110010001001009 | 45   | 12   | 23   | 10   | 3    | 9    | 33   | 0     | 0     | 0     | 1     |   |
| 12 | 110010001001010 | 44   | 13   | 25   | 6    | 2    | 4    | 38   | 0     | 0     | 0     | 3     |   |
| 13 | 110010001001011 | 64   | 25   | 33   | 6    | 3    | 11   | 50   | 0     | 0     | 0     | 3     |   |
| 14 | 110010001002000 | 200  | 45   | 108  | 47   | 18   | 29   | 153  | 0     | 1     | 0     | 7     |   |
| 15 | 110010001002001 | 94   | 24   | 51   | 19   | 6    | 12   | 76   | 0     | 0     | 0     | 2     |   |
| 16 | 110010001002002 | 39   | 12   | 22   | 5    | 6    | 3    | 30   | 0     | 0     | 0     | 2     |   |
| 17 | 110010001002003 | 17   | 3    | 9    | 5    | 2    | 2    | 13   | 0     | 0     | 0     | 0     |   |
| 18 | 110010001002004 | 31   | 8    | 14   | 9    | 3    | 5    | 23   | 0     | 0     | 0     | 1     |   |
| 19 | 110010001002006 | 32   | 10   | 13   | 9    | 6    | 2    | 24   | 0     | 0     | 0     | 2     |   |
| 20 | 110010001002007 | 25   | 6    | 9    | 10   | 1    | 3    | 21   | 0     | 0     | 1     | 0     |   |
| 21 | 110010001002008 | 43   | 10   | 19   | 14   | 4    | 9    | 30   | 0     | 0     | 0     | 0     |   |
| 22 | 110010001002009 | 16   | 4    | 7    | 5    | 0    | 1    | 15   | 0     | 0     | 0     | 1     |   |
| 23 | 110010001003000 | 17   | 5    | 9    | 3    | 1    | 2    | 14   | 0     | 0     | 0     | 0     |   |
| 24 | 110010001003001 | 46   | 13   | 26   | 7    | 2    | 8    | 36   | 0     | 0     | 0     | 4     |   |
| 25 | 110010001003002 | 91   | 19   | 49   | 23   | 5    | 13   | 73   | 0     | 0     | 0     | 2     |   |
| 26 | 110010001003003 | 25   | 8    | 11   | 6    | 2    | 3    | 20   | 0     | 0     | 0     | 1     |   |

dc\_rac\_S000\_JT01\_2011

Ready

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# Resident Area Characteristics (RAC) File [1]

Aggregate LODES data from the Block Group to the Census Tract level

- Can be done in ArcGIS, or a statistical package like *R*



# Resident Area Characteristics (RAC) File [1]

Aggregate LODES data from the Block Group to the Census Tract level

- Can be done in ArcGIS, or a statistical package like *R*
- In GIS, adding a new field and use a trimming function to aggregate to the tract level:
  - HomeTract = left([h\_geocode],11)

# Resident Area Characteristics (RAC) File [2]

Aggregate LODES data from the Block Group to the Census Tract level

- Taking multiple records that exist for each tract and aggregating values into one record
- In GIS, do this through the creation of *summary tables*
- In *R*, use the **aggregate()** command

| B           | C         | D         | E           | F         | G                | H               | I           | J                       | K                  | L              | M                 |
|-------------|-----------|-----------|-------------|-----------|------------------|-----------------|-------------|-------------------------|--------------------|----------------|-------------------|
|             | TOTAL     | Age       |             |           | Monthly Earnings |                 |             |                         |                    |                |                   |
| tract       | JOBS      | <= 29yrs  | 30 - 54     | 55+       | <= \$1250        | \$1251 - \$3333 | >= \$3333   | 11 (Ag, Frst, Fish, Hur | 21 (Mine, Oil&Gas) | 22 (Utilities) | 23 (Construction) |
| GEOID10     | C000      | CA01      | CA02        | CA03      | CE01             | CE02            | CE03        | CNS01                   | CNS02              | CNS03          | CNS04             |
| GEOID10     | TotalJobs | Jobs_A29u | Jobs_A30_54 | Jobs_A55o | Jobs_E1250u      | Jobs_E1251_3333 | Jobs_E3333o | NAICS11                 | NAICS21            | NAICS22        | NAICS23           |
| 42101000100 | 1592      | 531       | 878         | 183       | 142              | 237             | 1213        | 0                       | 0                  | 4              | 16                |
| 42101000200 | 840       | 241       | 488         | 111       | 239              | 224             | 377         | 0                       | 0                  | 6              | 13                |
| 42101000300 | 1361      | 381       | 775         | 205       | 141              | 198             | 1022        | 0                       | 1                  | 1              | 11                |
| 42101000401 | 725       | 213       | 400         | 112       | 68               | 160             | 497         | 2                       | 0                  | 4              | 4                 |
| 42101000402 | 1164      | 301       | 540         | 323       | 132              | 217             | 815         | 1                       | 0                  | 0              | 22                |
| 42101000500 | 631       | 260       | 300         | 71        | 104              | 176             | 351         | 1                       | 1                  | 2              | 6                 |
| 42101000600 | 780       | 290       | 393         | 97        | 95               | 188             | 497         | 2                       | 0                  | 4              | 9                 |
| 42101000700 | 1447      | 491       | 709         | 247       | 182              | 319             | 946         | 1                       | 1                  | 3              | 19                |
| 42101000801 | 776       | 234       | 420         | 122       | 91               | 149             | 536         | 1                       | 0                  | 3              | 13                |
| 42101000803 | 1691      | 526       | 800         | 365       | 185              | 363             | 1143        | 0                       | 0                  | 6              | 20                |
| 42101000804 | 1754      | 565       | 890         | 299       | 210              | 286             | 1258        | 0                       | 3                  | 4              | 21                |
| 42101000901 | 1078      | 402       | 526         | 150       | 162              | 262             | 654         | 1                       | 0                  | 5              | 14                |
| 42101000902 | 1078      | 304       | 577         | 197       | 142              | 186             | 750         | 0                       | 1                  | 3              | 6                 |
| 42101001001 | 1249      | 304       | 603         | 342       | 170              | 230             | 849         | 1                       | 0                  | 4              | 10                |
| 42101001002 | 1690      | 386       | 886         | 418       | 196              | 325             | 1169        | 1                       | 1                  | 5              | 25                |
| 42101001101 | 1668      | 506       | 909         | 253       | 209              | 350             | 1109        | 0                       | 1                  | 5              | 13                |
| 42101001102 | 1393      | 444       | 747         | 202       | 161              | 291             | 941         | 0                       | 0                  | 4              | 20                |
| 42101001201 | 1869      | 484       | 986         | 399       | 205              | 319             | 1345        | 3                       | 1                  | 8              | 32                |
| 42101001202 | 2521      | 848       | 1322        | 351       | 276              | 479             | 1766        | 1                       | 0                  | 9              | 29                |
| 42101001300 | 2494      | 676       | 1477        | 341       | 323              | 585             | 1586        | 0                       | 0                  | 10             | 34                |
| 42101001400 | 1955      | 579       | 1098        | 278       | 325              | 449             | 1181        | 1                       | 2                  | 2              | 26                |
| 42101001500 | 1888      | 588       | 788         | 512       | 188              | 318             | 882         | 0                       | 0                  | 0              | 21                |

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- Software: ArcGIS, R statistical package

## Perform calculations on Earnings columns

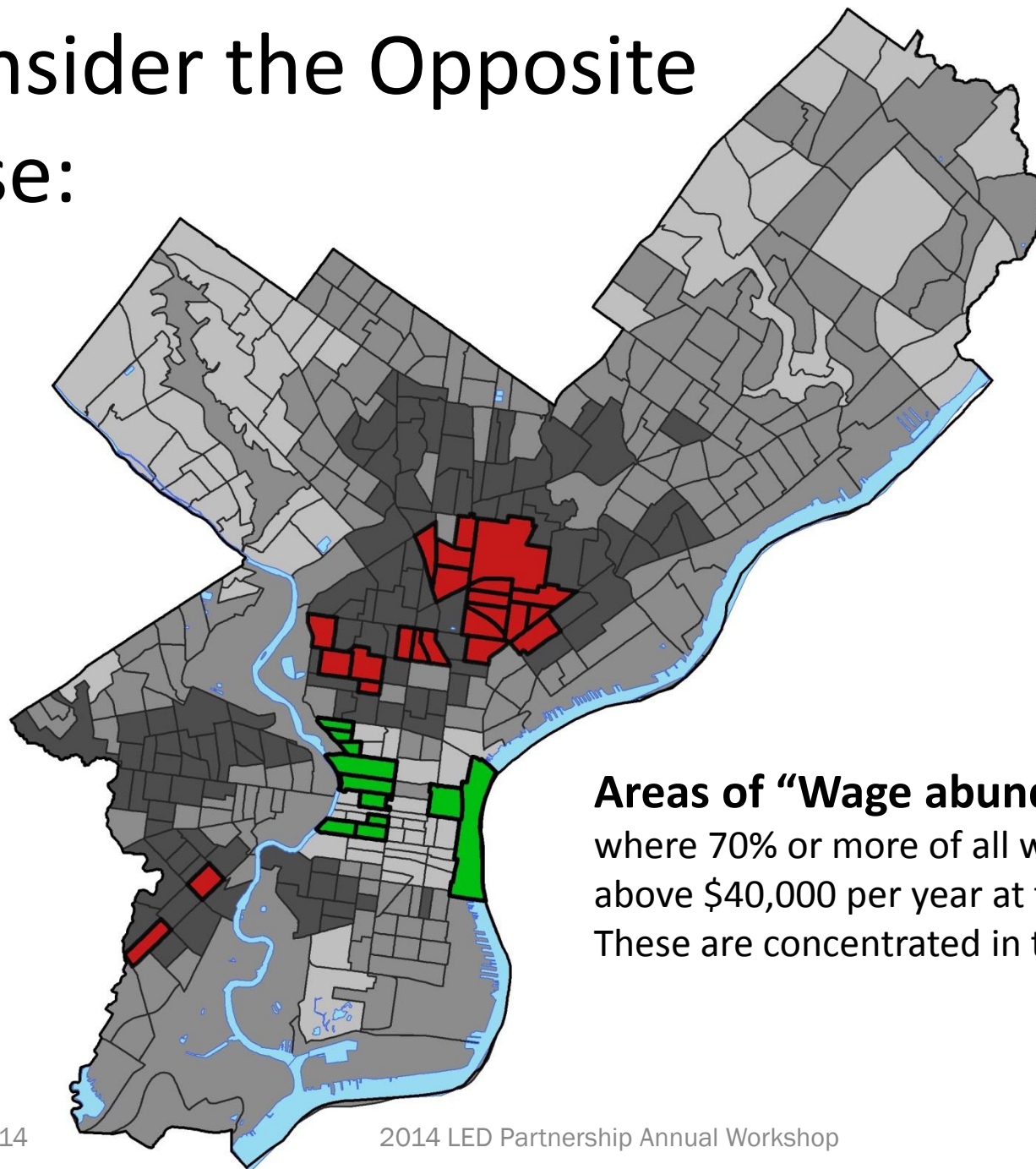
- $\text{Pct\_E01} = \text{Jobs\_E01} / \text{Total Jobs}$

- Etc. for E02, E03

- $\text{Pct\_E01+E02} = (\text{Jobs\_E01} + \text{Jobs\_E02}) / \text{Total Jobs}$

Wage Deserts are tracts where 80% or more of resident workers earn at the E01 or E02 level (i.e., make < \$39,996 / yr)

# Consider the Opposite Case:



**Areas of “Wage abundance,”**  
where 70% or more of all working residents earn  
above \$40,000 per year at their primary job.  
These are concentrated in tracts near the CBD.

## Perform (more) calculations on Earnings columns

$$\text{-- Pct\_E01+E02} = (\text{Jobs\_E01} + \text{Jobs\_E02}) / \text{Total Jobs}$$

Wage Abundance tracts have 70% or more of resident workers earn at the E03 level (i.e., make > \$40,000 / yr)

# Additional Analysis:

## Origin-Destination (OD) File

Objective: to trace wage desert or wage abundance originators to their place of work

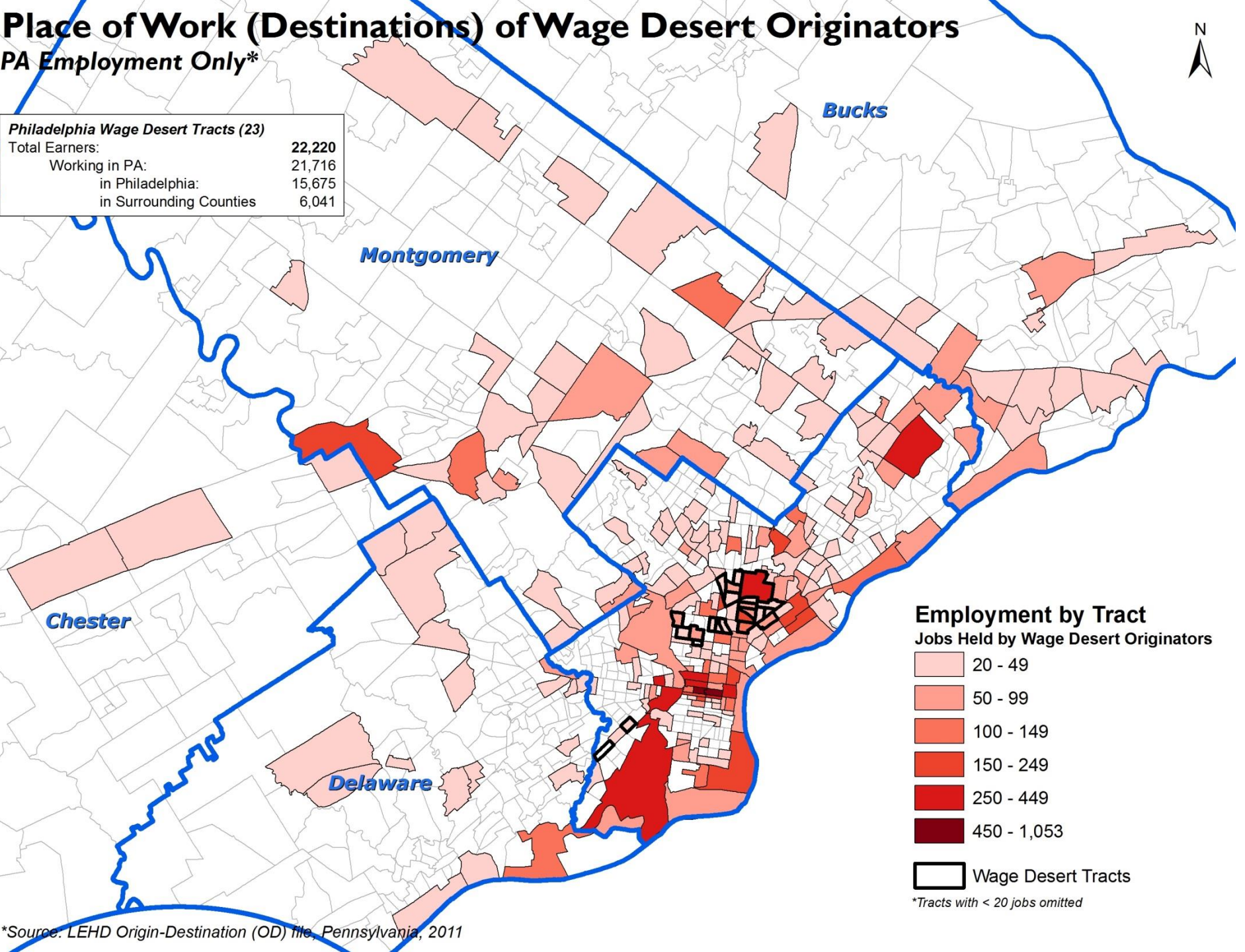
- Process steps:
  1. Aggregate LODES (OD) data from the Block Group to the Census Tract level
  2. Match workers' “home tracts” (originating in Wage Desert or Wage Abundance areas) to their respective “work tracts”
- Software: ArcGIS, *R* statistical package



# Place of Work (Destinations) of Wage Desert Originators

PA Employment Only\*

|   |        |
|---|--------|
| <b>Philadelphia Wage Desert Tracts (23)</b> |        |
| Total Earners:                              | 22,220 |
| Working in PA:                              | 21,716 |
| in Philadelphia:                            | 15,675 |
| in Surrounding Counties:                    | 6,041  |



\*Source: LEHD Origin-Destination (OD) file, Pennsylvania, 2011

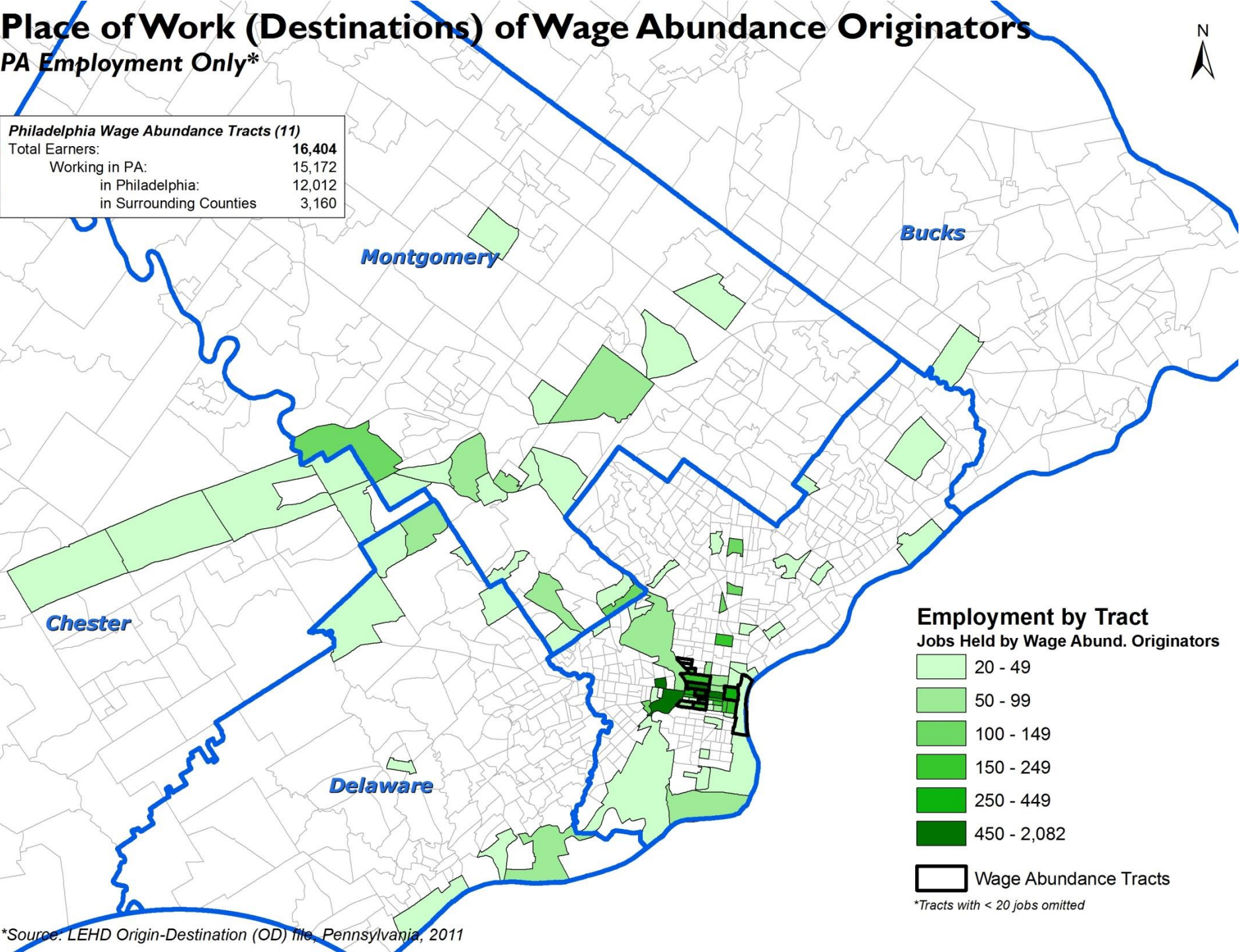


# Place of Work (Destinations) of Wage Abundance Originators

PA Employment Only\*



|  |               |
|--|---------------|
| <b>Philadelphia Wage Abundance Tracts (11)</b> |               |
| Total Earners:                                 | <b>16,404</b> |
| Working in PA:                                 | <b>15,172</b> |
| in Philadelphia:                               | <b>12,012</b> |
| in Surrounding Counties                        | <b>3,160</b>  |



**Employment by Tract**  
Jobs Held by Wage Abund. Originators

|  |             |
|--|-------------|
|  | 20 - 49     |
|  | 50 - 99     |
|  | 100 - 149   |
|  | 150 - 249   |
|  | 250 - 449   |
|  | 450 - 2,082 |

Wage Abundance Tracts

\*Tracts with < 20 jobs omitted

\*Source: LEHD Origin-Destination (OD) file, Pennsylvania, 2011

# Thank You!

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