# Improving the Accuracy and Reliability <br> of ACS Estimates for Non-Standard <br> Geographies Used in Local Decision Making 

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## Outline

- Goal - Accurate and Reliable Estimates
- Urban Neighborhoods and Rural Areas
- Problem 1: Standard Errors Too Large
- Problem 2: Spatial Mismatch
- No Perfect Solutions - Best Approximation and Proceed With Caution


## Quality Data for Local Decisions



Urban


Forever Affordable
ADIRONDACK COMMUNITY HOUSING TRUST

Rural

## Urban Neighborhoods

City of Syracuse and "Tomorrow's Neighborhoods Today" (TNT)


## Rural Areas

## Adirondack Park in New York State



## Problem \#1 Unreliable Estimates

Small Samples $+$
Small Areas
=
Large Standard error


## Example Areas Illustrating Problems

Syracuse: Southside TNT


Adirondack Park: Essex County


## Measures of Reliability

- Standard Error (SE) = Std Dev / Vn
- Margin of Error $(90 \% \mathrm{CI})=1.645 \times \mathrm{SE}$
- Coefficient of Variation (\%) $=100 \times$ (SE/Estimate)


## Coefficient of Variation

## Expresses Standard Error as a Percentage of the Estimate

No hard and fast rules, but the lower the better

- CV < 15\% Good
- CV 15\%-29\% Fair
- CV > 30\% Poor

This is the measure we are using to assess reliability of the ACS estimates.

## ACS 2008-2012 Estimates: Ratio of Income to Poverty Level (Table C17002)

CV's for 28 BG's in Syracuse's Southside TNT Neighborhood

| Block Group | Under . 50 | . 50 to . 99 | 1.00 to 1.24 | 1.25 to 1.49 | 1.50 to 1.84 | 1.85 to 1.99 | 2.00 and over |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 50002 | n/a | 62 | n/a | 96 | 94 | n/a | 13 |
| 53001 | n/a | 53 | 61 | 52 | 54 | 106 | 31 |
| 48002 | 365 | 47 | n/a | 67 | 69 | n/a | 14 |
| 48001 | 152 | 91 | 94 | n/a | 86 | n/a | 15 |
| 59002 | 74 | 51 | 87 | 65 | 62 | 91 | 28 |
| 54003 | 57 | 56 | 182 | 87 | 92 | n/a | 52 |
| 49002 | 73 | 95 | 122 | 96 | 69 | 77 | 28 |
| 51003 | 54 | 52 | 60 | 59 | 74 | n/a | 37 |
| 52001 | 49 | 41 | 80 | 61 | 94 | n/a | 47 |
| 52003 | 81 | 38 | 72 | 83 | 65 | 81 | 48 |
| 57001 | 78 | 53 | 102 | 95 | 66 | 111 | 20 |
| 57002 | 42 | 51 | 87 | 99 | 60 | 81 | 22 |
| 61011 | 53 | 46 | 53 | 45 | 85 | n/a | 26 |
| 52002 | 83 | 48 | 59 | 79 | 52 | n/a | 26 |
| 50001 | 52 | 69 | n/a | 64 | 62 | 102 | 19 |
| 51002 | 47 | 46 | 56 | n/a | 54 | 203 | 26 |
| 59001 | 40 | 111 | 91 | n/a | 72 | 90 | 41 |
| 54002 | 48 | 42 | 32 | 98 | 69 | $\mathrm{n} / \mathrm{a}$ | 33 |
| 51001 | 83 | 48 | 67 | n/a | n/a | 91 | 28 |
| 58002 | 41 | 45 | 63 | 102 | 88 | n/a | 42 |
| 58003 | 49 | 55 | 92 | 58 | 69 | $\mathrm{n} / \mathrm{a}$ | 28 |
| 54001 | 82 | 51 | 74 | 98 | 90 | 93 | 54 |
| 42002 | 45 | 22 | 67 | 48 | 77 | n/a | 37 |
| 49001 | 51 | 60 | 43 | 66 | 117 | n/a | 24 |
| 54004 | 59 | 42 | 50 | 59 | 54 | 91 | 66 |
| 42001 | 34 | 41 | 66 | 85 | 73 | 101 | 59 |
| 58001 | 47 | 42 | 89 | 97 | 75 | n/a | 18 |
| 53002 | 32 | 43 | 59 | 69 | 58 | 88 | 67 |

## ACS 2008-2012 Estimates: Ratio of Income to Poverty Level (Table C17002)

## CV's for 28 BG's in Syracuse's Southside TNT Neighborhood



## ACS 2008-2012 Estimates: Ratio of Income to Poverty Level (Table C17002)

## CV's for 38 BG's in Adirondack's's Essex County



## Simple Solution: Combine and Collapse

Increase the effective sample size by:

- Combining geographic areas
- Collapsing detailed categories

Formula to approximate combined/collapsed standard error:

$$
S E\left(\hat{X}_{1} \pm \hat{X}_{2}\right) \approx \sqrt{\left[S E\left(\hat{X}_{1}\right)\right]^{2}+\left[S E\left(\hat{X}_{2}\right)\right]^{2}}
$$

## Census Bureau References

## Compass Series



## ACS Methods Page

## Accuracy of the Data

A basic explanation of the sample design, estimation methodology, and accuracy of the data

```
2010-2012 & 2008-2012 Multiyear Accuracy (US)
[PDF 319KB]
2010-2012 & 2008-2012 Multiyear Accuracy (Puerto
Rico) [PDF 361KB]
2012 ACS 1-year Accuracy of the Data (US) [PDF
625KB]
2012 PRCS 1-year Accuracy of the Data (Puerto Rico)
[PDF 604KB]
```


## ACS Estimates Aggregator <br> http://www.psc.isr.umich.edu/dis/acs/estimates_aggregator/



## ACS Estimates Aggregator

## Instructions

This tool allows one to either (a)combine counts across several units of geography or to (b)collapse cells in a table to generate new estimates and margins of error. This is useful for creating robust statistics for health areas, neighborhoods, state economic areas, etc. Follow link for further discussion of ACS Data Quality issues.

Copy and paste the information from output from American FactFinder: Name, Estimates \& Margin of Error pairs. Replace the sample tab-delimited data below.


## Counts

Formulas are drawn from Appendix 11 from the U.S. Census Bureau, A Compass for Understanding and Using American Community Survey Data.

## Combine Block Groups

## CV's for 28 BG's and Combined in Syracuse's Southside



## Combine Block Groups

## CV's for 38 BG's and Combined in Adirondack's's Essex County



## Collapse Categories

CV's for 3 BG's in Syracuse's Southside


## Collapse Categories

CV's for 3 BG's in Essex County


## Problem Solved? - Not Really

- Simple solutions to sampling error render "approximate" solutions with no accurate means to assess quality of the new estimates.
- Not able to determine statistically significant differences between:
- Two or more areas
- Change over time for one area


## Bias Due to Missing Term

Bias in calculation of Standard Error due to the absence of a covariance term.

$$
S E\left(\hat{X}_{1} \pm \hat{X}_{2}\right)=\sqrt{\left[S E\left(\hat{X}_{1}\right)\right]^{2}+\left[S E\left(\hat{X}_{2}\right)\right]^{2} \pm 2 \operatorname{cov}\left(\hat{X}_{1}, \hat{X}_{2}\right)}
$$

Direction of bias may be positive or negative depending on the sign of the covariance.

## Assess how much error

CV's County Compared to Combined BG's Essex County, NY


## Proceed with Caution

- Use the largest type of census geography possible
- Use a collapsed version of a detailed table
- Create estimates and SEs using the Public Use Microdata Sample (PUMS)
- Request a custom tabulation, a fee-based service offered under certain conditions by the Census Bureau.


## Problem \#2 Square Peg in a Round Hole

Boundaries of planning areas don't match standard census geography


## Spatial Mismatch

A common problem faced by demographers dealing with local areas is that:

1. Geographies of interest (e.g. neighborhoods, watershed boundaries, protected land preserves, local labor markets) don't conform to Census Geographies like tracts or block groups.
2. Hence published tract or block group summary statistics for those geographies of interest aren't accurate.
3. This problem is present whether dealing with decennial census, ACS or annual estimates data.
Here we will be dealing with 2008-12 ACS data.

## Spatial Mismatch

If block group or tract ACS information, like housing units or population characteristics, are not allocated when the Block Group or tract is intersected by a boundary of interest then some proportion of those block group/tract data are assigned incorrectly to the wrong geography.
Four possible approaches that have been taken:

- Completely Ignore the mismatch; hope for best
- Pick some Block Groups to include
- Systematic Area proportional weighting
- Dasymetric mapping


## Case 1: Syracuse TNT Zones

## Miss-Match of TNT Zones and Block Groups



## Adirondack Park Boundary

## Park Boundary, the Blue Line, intersects Block Groups



## Ignore the Mismatch

May work if small amount of boundary mismatch but causes increasing amount of error in direct relationship to amount of mismatch.

Option A: Include if Crossed


Option B: Exclude if not Totally Inside


## Ignore the Mismatch

Southside TNT HUs for BG Totally within: 10032

Option A:
Include crossed BGs-3318
$40001 \rightarrow 767$ HUs 39003 $\rightarrow 903$ HUs $60003 \rightarrow 597$ HUs 60001 $\rightarrow 372$ HUs $61011 \rightarrow 679$ HUs
Southside TNT HUs: 13350 for 33.1\% increase

Option B:
Exclude BGs-3318
Southside TNT HUs: 10032


## Pick Some BGs to Include

## Researcher may

 select some but not all BGs to include.Southside TNT HUs for BG Totally within: 10032 Include BG 39003: 903 $10032+903=10935$ for $9 \%$ increase Or

Include BG 61011: 679 $10032+679=10711$
for 6.8\% increase


## Area Proportional Allocation

Area Proportional Weighted allocation" where the proportion of a block group's land area falling inside the boundary of the area of interest (e.g. TNT) is used to proportionally allocate the population.

However this procedure assumes that the land area in the block group is equally usable and used. Yet we know this not always the most accurate reflection of actual land usage in lots of block groups and tracts.


Valley TNT

## Area Proportional Allocation

To evaluate performance of area proportional allocation, compare the percentages of Census HUs in split block group with the percentage from ACS allocated via area proportional weighting.

| Block <br> Group |  | $\begin{aligned} & \text { ACS } \\ & \text { HU } \end{aligned}$ | Ground | Neighbor -hood |  | $\begin{aligned} & 2010 \\ & \text { HUs } \end{aligned}$ | $\begin{gathered} \text { Area } \\ \text { Weight } \\ \% \end{gathered}$ | Allocated <br> ACS HUs <br> Using <br> Area\% | Ground Verification | Ground \% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 39003 | 843 | 903 | 757 | Southside | 31\% | 260 | 38\% | 345 | 222 | 29\% |
|  |  |  |  | Westside | 69\% | 583 | 62\% | 558 | 535 | 71\% |
| 40001 | 729 | 767 | 619 | Southside | 7\% | 48 | 12\% | 93 | 43 | 7\% |
|  |  |  |  | Westside | 93\% | 681 | 88\% | 674 | 576 | 93\% |
| 60001 | 311 | 372 | 317 | Southside | 32\% | 99 | 19\% | 72 | 109 | 34\% |
|  |  |  |  | Valley | 68\% | 212 | 81\% | 300 | 208 | 66\% |
| 60003 | 592 | 597 |  | Southside | 20\% | 119 | 23\% | 140 | 127 |  |
|  |  |  |  | Valley | 80\% | 473 | 77\% | 457 | ? |  |
| 61011 | 677 | 679 | 572 | Southside | 51\% | 346 | 39\% | 268 | 310 | 54\% |
|  |  |  |  | Valley | 49\% | 331 | 61\% | 411 | 262 | 46\% |

## Dasymetric Mapping

Dasymetric mapping is generally a better solution. It uses administrative records like data on land use of property tax records in an urban setting. Knowing where in a block group residences are and are not allows dasymetric mapping to improve the decisions about inclusions /exclusions of HUs, and error of those decisions.


Valley TNT

## Dasymetric Mapping

As this tax parcel map shows, sometimes one can determine for each tax parcel not only whether it is residential (not gray) but type of residential unit.


## Dasymetric Mapping Allocation

To evaluate performance of the dasymetric mapping allocation, compare the percentages of Census HUs in split block group with the percentage from ACS allocated via dasymetric mapping procedures.

| Block <br> Group | $\begin{aligned} & 2010 \\ & \text { Census } \\ & \text { HUs } \end{aligned}$ | $\begin{aligned} & \text { ACS } \\ & \text { HU } \end{aligned}$ | Ground | Neighbor -hood |  | $\begin{gathered} 2010 \\ \text { HUs } \end{gathered}$ | Dasymetric \% | Allocated <br> ACS HUs <br> Using <br> Dasymetric \% | Ground Verification | Ground $\%$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 39003 | 843 | 903 | 757 | Southside | 31\% | 260 | 32\% | 291 | 222 | 29\% |
|  |  |  |  | Westside | 69\% | 583 | 68\% | 612 | 535 | 71\% |
| 40001 | 729 | 767 | 619 | Southside | 7\% | 48 | 7\% | 54 | 43 | 7\% |
|  |  |  |  | Westside | 93\% | 681 | 93\% | 713 | 576 | 93\% |
| 60001 | 311 | 372 | 317 | Southside | 32\% | 99 | 32\% | 119 | 109 | 34\% |
|  |  |  |  | Valley | 68\% | 212 | 68\% | 253 | 208 | 66\% |
| 60003 | 592 | 597 |  | Southside | 20\% | 119 | 22\% | 132 | 127 |  |
|  |  |  |  | Valley | 80\% | 473 | 78\% | 465 | ? |  |
| 61011 | 677 | 679 | 572 | Southside | 51\% | 346 | 49\% | 332 | 310 | 54\% |
|  |  |  |  | Valley | 49\% | 331 | 51\% | 347 | 262 | 46\% |

## Which Procedure is Better?

No perfect solution. However, several findings of note:

1. In every instance percentages from Dasymetric allocation are closer to percentage of 2010 Census HUs in each split BG.

| Block <br> Group |  | $\begin{gathered} \text { ACS } \\ \text { HU } \end{gathered}$ | Ground | Neighbor -hood |  | $\begin{aligned} & 2010 \\ & \text { HUs } \end{aligned}$ | $\begin{array}{\|c} \text { Dasymetri } \\ \text { c } \\ \% \end{array}$ | Allocated <br> ACS HUs <br> Using <br> Dasymetric\% | Area <br> \% | Allocated ACS HUs Using Area\% | Ground Verificati on | Ground \% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 39003 | 843 | 903 | 757 | Southside | 31\% | 260 | 32\% | 291 | 38\% | 345 | 222 | 29\% |
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## Which Procedure is Better?

No perfect solution. However, several findings of note:
2. In all BGs, the percentages of HUs assigned to each split BG via Dasymetric allocation is closer to \% via ground verification.

| Block <br> Group | $\begin{aligned} & 2010 \\ & \text { Census } \\ & \text { HUs } \end{aligned}$ | $\begin{aligned} & \text { ACS } \\ & \text { HU } \end{aligned}$ | Ground | Neighbor -hood | $\begin{gathered} 2010 \\ \text { Census } \\ \text { HU\% } \end{gathered}$ | $\begin{gathered} 2010 \\ \text { HUs } \end{gathered}$ | Dasymetric \% | Allocated ACS HUs Using Dasymetric \% | $\begin{gathered} \text { Area } \\ \% \end{gathered}$ | Allocated <br> ACS HUs <br> Using <br> Area\% | Ground <br> Verificati on | Ground \% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
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## Which Procedure is Better?

No perfect solution. However, several findings of note:
3. In all but one BG, the number of HUs allocated to each split BG via Dasymetric allocation is closer to 2010 Census HUs.

| Block <br> Group |  | $\begin{aligned} & \text { ACS } \\ & \text { HU } \end{aligned}$ | Ground | Neighbor -hood |  | $\begin{aligned} & 2010 \\ & \text { HUs } \end{aligned}$ | Dasymetri c $\%$ | Allocated ACS HUs Using Dasymetric\% | $\begin{gathered} \text { Area } \\ \% \end{gathered}$ | Allocated ACS HUs Using Area\% | Ground Verificati on | Ground \% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
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## Which Procedure is Better?

No perfect solution. However, several findings of note:
4. In all but two BG, the number of HUs assigned to each split BG via Dasymetric allocation is closer to ground verification.

| Block <br> Group | $\begin{aligned} & 2010 \\ & \text { Census } \\ & \text { HUs } \end{aligned}$ | $\begin{aligned} & \text { ACS } \\ & \text { HU } \end{aligned}$ | Ground | Neighbor -hood |  | $\begin{aligned} & 2010 \\ & \text { HUs } \end{aligned}$ | Dasymetri <br> $c$ <br> $\%$ | Allocated ACS HUs Using Dasymetric\% | Area <br> \% | Allocated ACS HUs Using Area\% | Ground Verificati on | Ground \% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 39003 | 843 | 903 | 757 | Southside | 31\% | 260 | 32\% | 291 | 38\% | 345 | 222 | 29\% |
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|  |  |  |  | Valley | 68\% | 212 | 68\% | 253 | 81\% | 300 | 208 | 66\% |
| 60003 | 592 | 597 |  | Southside | 20\% | 119 | 22\% | 132 | 23\% | 140 | 127 |  |
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|  |  |  |  | Valley | 49\% | 331 | 51\% | 347 | 61\% | 411 | 262 | 46\% |

## Westside TNT Neighborhood: Where Dasymetric Mapping Didn't Work



## Valley TNT Neighborhood: Where Dasymetric Mapping Worked Well



Stable, SemiSuburban Neighborhood Typical Streets


Newer
Construction


## Spatial Mismatch in Adirondack Park

Ignore the Mismatch Approach

BGs in the park only | BGs of > 50\% area in |
| :---: |
| the park |

## Future Work

1. Conduct dasymetric mapping analysis for Adirondack Park
2. Compare allocation methods results
3. Compare cadastral dasymetric mapping with environmental constraint dasymetric mapping.
4. Explore use of these techniques for more complex task of allocating population by characteristics such as income and poverty.
