Preliminary Research for Replacing or Supplementing the Acreage, Number of Rooms and Bedrooms, Tenure, Property Value, & Real Estate Taxes Questions on the American Community Survey with Administrative Records

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Disclaimer: The results and conclusions in this paper are the personal views of the author and do not necessarily reflect the views of the United States Census Bureau.





Introduction

- "Agility in Action: A Snapshot of Enhancements to the American Community Survey" (Census Bureau, 2015)
 - Census Bureau is investigating ways to reduce the difficulty and length of the American Community Survey (ACS) using administrative records.
 - Benefits of administrative records: sufficient coverage and quality; populate missing responses; enhance editing/imputation routines.
- CARRA investigates the use of administrative records to enhance data collection across several housing topics.
 - Measure coverage by linking commercial housing data to ACS records.
 - Assess the extent of agreement and limitations of the commercial data in relation to the ACS.
 - Present results summarizing performance of the external data across various household(er) characteristics.





Data & Methodology

- 2014 ACS unswapped and unweighted records.
- County and municipal property tax data compiled by a third-party commercial vendor from tax year 2014.
 - Data for over 112 million housing parcels in the United States.





Data & Methodology: Limitations

- Government property tax records often focus on aggregate measures of property structures rather than individual units within the structure.
- Local authorities collect information from the property owner, whereas the ACS surveys the occupant.
- The lack of standardization in the objectives and collection methods used by local authorities does not consistently reflect the same level of detail and context presented in the ACS questionnaire.





Data & Methodology: MAF-match

Table 1: Vendor data MAFID-match rate across ACS households

| | AC | S | Vendor data |
|----------------------------------|-------------|-----------|----------------------------------|
| | Full sample | Subsample | |
| Total Observations | 5,325,044 | (persons) | 112,620,085 (housing units) |
| # Households/Housing Units | 2,273,701 | 1,320918 | 112,620,085 |
| Households with MAFID | 2,273,701 | 1,320918 | 92,482,246 |
| # Unique MAFIDs | - | | 90,303,407 |
| Households with MAFID Match | 1,458,986 | 1,163,748 | 1,458,986 (1,163,748, subsample) |
| Match Rate Across ACS Households | 64.17% | 88.1% | |

Note: Subsample column refers to single family, owner-occupied housing units.

- We link each external data source record and ACS response by Master Address File Identification Number (MAFID) – a number associated with each record in the Master Address File (MAF).
 - The MAF is a database containing the address or location description of every building (residential or non-residential) known to the Census Bureau.
 - MAFID match rate across ACS households: 64.17% (88.1%, single family and owner-occupied subsample).





Results:

Linkage to non-missing Information

- Among linked data, some topics match to nonmissing vendor data at very high rates, 90+ percent.
 - Acreage, property value, property tax
- Total number of rooms and bedrooms have missing data issues.
 - Links to missing vendor data 56.09% and 38.85% of the time, respectively.
- Tenure links to missing vendor data 87.53% of the time.
 - Low-quality contextual agreement; not compatible with this particular administrative record source.





Relative Relationship between Linked Vendor and ACS Data Values, missing values removed







Acreage



Source: 2014 American Community Survey.

Table 4: ACS Acreage (2014, unedited) by Vendor Data

| | | Vendor Acreage | | | | | | |
|-----------------------------------|----------------------|------------------|-----------------|---------------------|--|--|--|--|
| ACS Acreage | Matched ACS Count | Less than 1 acre | 1 to 9.99 acres | 10 or more acres | Vendor data on acreage not available | | | |
| Less than 1 acre | 1,030,397 | 92.79 | 2.4 | 0.34 | 4.47 | | | |
| 1 to 9.99 acres | 259,438 | 20.41 | 74.82 | 2.02 | 2.75 | | | |
| 10 or more acres | 56,717 | 3.32 | 16.91 | 77.3 | 2.47 | | | |
| ACS data on acreage not available | 112,434 | 64.19 | 11.36 | 2.63 | 21.82 | | | |
| Column total | 1,458,986 | 1,083,088 | 241,241 | 55,573 | 79,084 | | | |

- ACS matches to nonmissing vendor data 94.58 percent of the time.
- Overall agreement rate is 83.52%.
 - Across responses, most frequent agreement occurs with acreage values less than one.





Number of Rooms

Table 6: ACS Number of Rooms (2014, unedited) by Vendor Data

ACS

8

10 +

ACS data

missing

Column

total

178,092

103,376

141,085

31,645

,458,986 1,039

0.06

0.05

0.06

0.14

0.06

0.05

0.04

0.25

1,924

0.16

0.15

0.13

0.5

8,832

0.92

0.71

0.52

3.06

48,722

Matched

a. How many separate rooms are in this house, apartment, or mobile home?
Rooms must be separated by built-in archways or walls that extend out at least 6 inches and go from floor to ceiling.

INCLUDE bedrooms, kitchens, etc.

EXCLUDE bathrooms, porches, balconies, foyers, halls, or unfinished basements.

Number of rooms

Source: 2014 American Community Survey.

- ACS matches to nonmissing vendor data 43.91 percent of the time.
- Overall agreement rate is 15.34%.
 - Across responses, most frequent agreement occurs with total room values equal to five, 18.73%; six rooms with a one room difference, 36.93%.

| mber looms | ACS Count | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10+ | data missing |
|---------------|--------------|------|------|-------|-------|-------|-------|-------|------|------|------|-----------------|
| 1 | 2,996 | 1.57 | 7.24 | 7.11 | 5.97 | 5.14 | 3.6 | 1.84 | 1.67 | 0.77 | 1.67 | 63.42 |
| 2 | 8,458 | 0.3 | 2.55 | 10.07 | 11.07 | 7.64 | 2.98 | 1.21 | 0.83 | 0.34 | 0.72 | 62.3 |
| 3 | 37,496 | 0.2 | 0.63 | 6.52 | 10.7 | 9.67 | 6.02 | 2.5 | 1.34 | 0.4 | 0.6 | 61.42 |
| 4 | 125,495 | 0.1 | 0.23 | 1.44 | 13.41 | 12.76 | 6.41 | 2.57 | 1.61 | 0.53 | 0.74 | 60.2 |
| 5 | 276,555 | 0.07 | 0.11 | 0.48 | 4.53 | 18.73 | 11.43 | 4.02 | 1.67 | 0.62 | 0.77 | 57.57 |
| 6 | 312,159 | 0.06 | 0.08 | 0.3 | 2.2 | 11.19 | 17.99 | 7.76 | 3.06 | 1.01 | 0.9 | 55.47 |
| 7 | 241,629 | 0.05 | 0.06 | 0.2 | 1.36 | 7.17 | 13.24 | 12.94 | 6.53 | 2.21 | 1.6 | 54.63 |

4.96

3.88

2.83

9.15

Vendor Number of Rooms

9.56

7.85

5.62

10.14

144,209 166,684 110,699

10.36

8.85

7.1

6.74

11.82

10.88

9.8

4.98

80,302

4.44

7.59

7.45

2.33

38,081

3.18

5.69

12.32

3.34

54.48

54.29

54.13

59.37

40,080 818,414

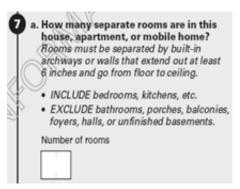
Source: 2014 American Community Survey and government property tax data from commercial vendor.





Vendor

Number of Rooms



Source: 2014 American Community Survey.

- ACS matches to nonmissing vendor data 43.91 percent of the time.
- Overall agreement rate is 15.34%.
 - Across responses, most frequent agreement occurs with total room values equal to five; six rooms with a one room difference, 36.93%.

| | | | | , | , | Vendor | Number o | f Rooms | | | | |
|---------------------------|-------------------------|-------|-------|-------|--------|---------|----------|---------|--------|--------|--------|---------------------------|
| ACS Number of Rooms | Matched ACS Count | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10+ | Vendor data missing |
| 1 | 2,996 | 1.57 | 7.24 | 7.11 | 5.97 | 5.14 | 3.6 | 1.84 | 1.67 | 0.77 | 1.67 | 63.42 |
| 2 | 8,458 | 0.3 | 2.55 | 10.07 | 11.07 | 7.64 | 2.98 | 1.21 | 0.83 | 0.34 | 0.72 | 62.3 |
| 3 | 37,496 | 0.2 | 0.63 | 6.52 | 10.7 | 9.67 | 6.02 | 2.5 | 1.34 | 0.4 | 0.6 | 61.42 |
| 4 | 125,495 | 0.1 | 0.23 | 1.44 | 13.41 | 12.76 | 6.41 | 2.57 | 1.61 | 0.53 | 0.74 | 60.2 |
| 5 | 276,555 | 0.07 | 0.11 | 0.48 | 4.53 | 18.73 | 11.43 | 4.02 | 1.67 | 0.62 | 0.77 | 57.57 |
| 6 | 312,159 | 0.06 | 0.08 | 0.3 | 2.2 | 11.19 | 17.99 | 7.76 | 3.06 | 1.01 | 0.9 | 55.47 |
| 7 | 241,629 | 0.05 | 0.06 | 0.2 | 1.36 | 7.17 | 13.24 | 12.94 | 6.53 | 2.21 | 1.6 | 54.63 |
| 8 | 178,092 | 0.06 | 0.06 | 0.16 | 0.92 | 4.96 | 9.56 | 10.36 | 11.82 | 4.44 | 3.18 | 54.48 |
| 9 | 103,376 | 0.05 | 0.05 | 0.15 | 0.71 | 3.88 | 7.85 | 8.85 | 10.88 | 7.59 | 5.69 | 54.29 |
| 10+ | 141,085 | 0.06 | 0.04 | 0.13 | 0.52 | 2.83 | 5.62 | 7.1 | 9.8 | 7.45 | 12.32 | 54.13 |
| ACS data missing | 31,645 | 0.14 | 0.25 | 0.5 | 3.06 | 9.15 | 10.14 | 6.74 | 4.98 | 2.33 | 3.34 | 59.37 |
| Column total | 1,458,986 | 1,039 | 1,924 | 8,832 | 48,722 | 144,209 | 166,684 | 110,699 | 80,302 | 38,081 | 40,080 | 818,414 |





Number of Bedrooms

b. How many of these rooms are bedrooms? Count as bedrooms those rooms you would list if this house, apartment, or mobile home were for sale or rent. If this is an efficiency/studio apartment, print "0". Number of bedrooms

Source: 2014 American Community Survey.

- Instances of missing vendor data still significant, but not as prevalent as with total rooms.
- ACS matches to non-missing vendor data 61.15 percent of the time.
- Overall agreement rate is 43.67%.
 - Across responses, most frequent agreement occurs with total bedroom values equal to three, 49.1%; four bedrooms with a one room difference, 61.35%.

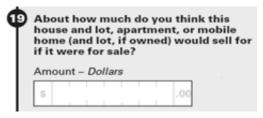
Table 9: ACS Number of Bedrooms (2014, unedited) by Vendor Data

| | | | Ve | ndor Numb | er of Bedroo | ms | |
|------------------------------|----------------------|--------|---------|-----------|--------------|--------|---------------------------|
| ACS Number of Bedrooms | Matched ACS Count | 1 | 2 | 3 | 4 | 5+ | Vendor data missing |
| 0 | 5,276 | 7.24 | 10.96 | 24.81 | 8.83 | 2.16 | 46 |
| 1 | 35,050 | 31.52 | 15.29 | 8.44 | 2.43 | 0.79 | 41.53 |
| 2 | 267,398 | 1.54 | 41.19 | 13.77 | 2.51 | 0.57 | 40.42 |
| 3 | 712,281 | 0.25 | 5.44 | 49.1 | 4.86 | 0.69 | 39.66 |
| 4 | 323,525 | 0.14 | 2.18 | 18.81 | 39.76 | 3.17 | 35.94 |
| 5+ | 86,166 | 0.16 | 1.47 | 12.15 | 21.8 | 29.06 | 35.36 |
| ACS data missing | 29,290 | 1.09 | 9.32 | 28.08 | 12.69 | 6.01 | 42.81 |
| Column total | 1,458,986 | 18,244 | 165,856 | 470,362 | 193,759 | 43,926 | 566,839 |





Property Value



Source: 2014 American Community Survey.

- ACS matches to nonmissing vendor data 99.61 percent of the time.
- Overall agreement rate <u>in</u> <u>decile range</u> is 28.72%.
- With up to 5% difference in values, most frequent agreement occurs with property values between \$85,000 to \$118,000, 16.61%.

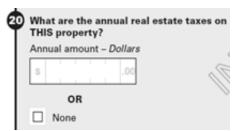
Table 13: ACS Property Value (2014, unedited) by Vendor Data

| | | Vendor Property Value | | | | | | | | | | |
|--------------------------|-------------------------|-----------------------|---------------|----------------|--------------------|--------------------|-----------------|-----------------|-----------------|-----------------|---------|---------------------------|
| ACS Property Value | Matched ACS Count | [0-50K) | [50K- 85K) | [85K- 118K) | [118K- 149,999) | [149,999- 175K) | [175K- 211K) | [211K- 270K) | [270K- 350K) | [350K- 500K) | [500K+] | Vendor data missing |
| [0-50K) | 117,710 | 59.76 | 14.6 | 6.35 | 4.87 | 2.92 | 2.98 | 3.16 | 2.22 | 1.57 | 0.97 | 0.61 |
| [50K- 85K) | 116,743 | 38.43 | 48.02 | 10.3 | 1.62 | 0.45 | 0.26 | 0.15 | 0.11 | 0.14 | 0.19 | 0.33 |
| [85K- 118K) | 107,617 | 20.5 | 29.9 | 38.83 | 7.36 | 1.42 | 0.77 | 0.4 | 0.2 | 0.11 | 0.19 | 0.31 |
| [118K- 149,999) | 112,415 | 13.47 | 15.97 | 32.14 | 31.29 | 4.6 | 1.41 | 0.49 | 0.16 | 0.07 | 0.09 | 0.31 |
| [149,999- 175K) | 117,195 | 10.62 | 11.69 | 17.37 | 30.21 | 20.79 | 6.68 | 1.72 | 0.33 | 0.15 | 0.14 | 0.29 |
| [175K- 211K) | 111,886 | 8.22 | 7.98 | 10.24 | 17.16 | 21.55 | 25.39 | 7.41 | 1.23 | 0.31 | 0.2 | 0.31 |
| [211K- 270K) | 114,727 | 6.81 | 5.33 | 5.96 | 9.12 | 11.58 | 25.11 | 30.66 | 4.41 | 0.57 | 0.17 | 0.28 |
| [270K- 350K) | 126,441 | 7.73 | 3.45 | 4.22 | 4.7 | 5.53 | 11.52 | 29.37 | 28.13 | 4.7 | 0.37 | 0.28 |
| [350K- 500K) | 107,783 | 8.7 | 2.81 | 2.49 | 2.87 | 2.44 | 4.61 | 11.6 | 26.3 | 34.32 | 3.61 | 0.25 |
| [500K+] | 106,697 | 6.64 | 3.41 | 2.5 | 2.03 | 1.49 | 2.03 | 3.69 | 6.9 | 21.12 | 49.92 | 0.27 |
| ACS data missing | 319,772 | 30.02 | 18.41 | 12.89 | 9.49 | 5.46 | 5.7 | 5.9 | 4.39 | 3.7 | 3.45 | 0.6 |
| Column total | 1,458,986 | 304,093 | 222,031 | 187,969 | 157,357 | 101,081 | 111,187 | 122,793 | 95,284 | 80,679 | 70,892 | 5,620 |





Real Estate Tax



Source: 2014 American Community Survey.

- ACS matches to nonmissing vendor data 96.97 percent of the time.
- Overall agreement rate <u>in</u> <u>decile range</u> is 43.45%.
- With up to 5% difference in values, most frequent agreement occurs with tax values greater than or equal to \$6,800, 39.33%.

Table 17: ACS Real Estate Tax (2014, unedited) by Vendor Data

| | | | Vendor Property Tax | | | | | | | | | |
|------------------------------|-------------------------|---------|---------------------|-----------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|----------|---------------------------|
| ACS Real Estate Tax | Matched ACS Count | [0-450) | [450-850) | [850- 1,200) | [1,200- 1,600) | [1,600- 2,000) | [2,000- 2,600) | [2,600- 3,500) | [3,500- 4,500) | [4,500- 6,800) | [6,800+] | Vendor data missing |
| [0-450) | 112,627 | 54.47 | 14.28 | 5.8 | 4.11 | 2.65 | 2.47 | 2.14 | 1.22 | 0.98 | 0.56 | 11.31 |
| [450-850) | 112,835 | 14.97 | 57.89 | 12 | 5.16 | 2.55 | 1.77 | 1.35 | 0.55 | 0.42 | 0.13 | 3.2 |
| [850- 1,200) | 123,930 | 4.77 | 15.2 | 44.25 | 16.96 | 6.58 | 4.78 | 2.48 | 1.1 | 0.62 | 0.35 | 2.91 |
| [1,200- 1,600) | 107,881 | 2.36 | 5.81 | 12.23 | 46.7 | 15.82 | 7.09 | 4.62 | 1.55 | 0.9 | 0.33 | 2.58 |
| [1,600- 2,000) | 103,674 | 1.58 | 3.45 | 5.72 | 12.65 | 42.53 | 19.17 | 7.57 | 2.89 | 1.44 | 0.43 | 2.57 |
| [2,000- 2,600) | 109,557 | 0.96 | 1.61 | 2.58 | 4.57 | 8.8 | 52.38 | 20.34 | 4.15 | 2.07 | 0.47 | 2.07 |
| [2,600- 3,500) | 126,820 | 0.74 | 0.96 | 1.54 | 2.73 | 3.73 | 11.36 | 55.07 | 16.7 | 4.58 | 0.88 | 1.71 |
| [3,500- 4,500) | 95,699 | 0.49 | 0.52 | 0.77 | 1.15 | 1.7 | 3.94 | 14.43 | 54.46 | 19.68 | 1.63 | 1.25 |
| [4,500- 6,800) | 109,238 | 0.4 | 0.38 | 0.42 | 0.71 | 0.8 | 1.79 | 4.05 | 10.22 | 70.23 | 10.06 | 0.93 |
| [6,800+] | 111,527 | 0.65 | 0.72 | 0.81 | 1 | 0.84 | 1.03 | 1.7 | 2.01 | 9.46 | 81.1 | 0.67 |
| ACS data missing | 345,198 | 12.38 | 14.7 | 12.01 | 11.31 | 8.99 | 9.85 | 9.93 | 6.53 | 6.51 | 4.48 | 3.3 |
| Column total | 1,458,986 | 134,690 | 165,526 | 142,391 | 145,477 | 124,033 | 150,929 | 166,374 | 121,816 | 141,459 | 122,107 | 44,184 |





Conclusion

- MAFID-match rate is 64.17 percent of all 2014 ACS households.
 - 88.1% in single family, owner-occupied subsample.
- Property tax data performs best for ACS topics directly related to the calculation of property owner tax obligations such as acreage, property value and real estate tax.
 - High availability of non-missing vendor data values.
- Regarding number of rooms and bedrooms, the linked data is not ideal but might still be valuable for imputation.
- Vendor data on tenure does not provide enough information for a quality match to ACS records.





Appendix





Linkage to non-missing Information

Table 2: Match rate by non-missing and missing wendor data among MAFID-matched observations

| ACS topic | Count, ACS records matched to non- missing vendor data | % of ACS households matched to non-missing vendor data | Count, ACS records matched to missing vendor data | % of ACS households matched to missing vendor data |
|----------------------|---|--|---|--|
| Acreage | 1,379,902 | 94.58% | 79,084 | 5.42% |
| Number of Rooms | 640,572 | 43.91% | 818,414 | 56.09% |
| Number of Bedrooms | 892,147 | 61.15% | 566,839 | 38.85% |
| Tenure | 181,927 | 12.47% | 1,277,059 | 87.53% |
| Total Property Value | 1,453,366 | 99.61% | 5,620 | 0.39% |
| Real Estate Tax | 1,414,802 | 96.97% | 44,184 | 3.03% |

Note: Rows sum to total MAFID-matched obs. (Number of ACS households) = 1,458,986

Source: 2014 American Community Survey and government property tax data from commercial vendor.

Table 1A: Match rate by non-missing and missing vendor data among MAFID-matched observations; single family, owner-occupied subsample

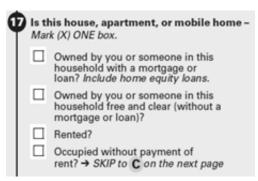
| ACS topic | Count, ACS records matched to non- missing vendor data | % of ACS households matched to non-missing | Count, ACS records matched to missing vendor data | % of ACS households matched to missing |
|----------------------|---|---|---|---|
| Acreage | 1,125,501 | vendor data 96.71% | 38,247 | vendor data 3.29% |
| Number of Rooms | 524,235 | 45.05% | 639,513 | 54.95% |
| Number of Bedrooms | 720,014 | 61.87% | 443,734 | 38.13% |
| Tenure | 50,928 | 4.38% | 1,112,820 | 95.62% |
| Total Property Value | 1,160,534 | 99.72% | 3,214 | 0.28% |
| Real Estate Tax | 1,130,851 | 97.17% | 32,897 | 2.83% |

Note: Rows sum to total single family, detached MAFID-matched obs. (#ACS households) = 1,163,748





Tenure



Source: 2014 American Community Survey.

Table 3: ACS Tenure (2014, unedited) by Vendor Data

| | | Vendor Tenure | | | | |
|----------------------------------|----------------------|-------------------------|-------------------------------------|--|--|--|
| ACS Tenure | Matched ACS Count | Absentee (situs ≠ mail) | Vendor data on tenure not available | | | |
| Owned with a mortgage | 807,382 | 34,077 | 773,305 | | | |
| Owned without a mortgage | 415,038 | 22,737 | 392,301 | | | |
| Rented | 177,229 | 110,226 | 67,003 | | | |
| Occupied without payment of rent | 23,648 | 8,256 | 15,392 | | | |
| Other | 1,375 | 92 | 1,283 | | | |
| ACS data on tenure not available | 34,314 | 6,539 | 27,775 | | | |

Source: 2014 American Community Survey and government property tax data from commercial vendor.

- Focus on identifying owners/renters in vendor data.
 - Absentee owner indicator, 12.47%.
 - Corporate ownership, 3.48%.
 - Vacancy status, 0.33%.

Missing data



