# Working with acs.R (version 2.0)

# Ezra Haber Glenn, AICP Massachusetts Institute of Technology Department of Urban Studies & Planning

# March 8, 2016

# Contents

1	Pur	pose	2		
	1.1	of this Document	2		
	1.2	of this Package	2		
2	Getting Started in R				
	2.1	Getting and Installing R	2		
	2.2	Getting and Installing the acs Package	3		
		2.2.1 Installing from CRAN	3		
		2.2.2 Installing from a zipped tarball	4		
	2.3	Getting and Installing a Census API Key	5		
		2.3.1 Using a Blank Key: an informal workaround	6		
3	Wo	rking with the New Functions	6		
	3.1	Overview	6		
	3.2	User-Specific Geographies	6		
		3.2.1 Basic Building Blocks: the single element geo.set	6		
		3.2.2 But where's the data?	8		
		3.2.3 Real geo. sets: complex groups and combinations	8		
			10		
		0 0	11		
			12		
		8 8	12		
	3.3		16		
	0.0		16		
			18		
		1	20		
		5.5.5 the deb.150kdp() function. Infiding the variables you want	20		
4	Exp	porting Data	<b>25</b>		
5	$\mathbf{Add}$	ditional Resources	26		

$\mathbf{A}$	A worked example using blockgroup-level data and nested combined geo.sets			
	A.1	Making the geo.set	2	
	A.2	Using combine=T to make a neighborhood	28	
	A.3	Even more complex geo.sets	29	
	A.4	Gathering neighborhood data on transit mode-share	30	

# 1 Purpose...

#### 1.1 of this Document

These notes are intended to accompany the updated acs.R package (version 2.0). Much of the code in the package, as well as the guidance in this document, was originally developed by the author in partnership with and under contract for Puget Sound Regional Council (PSRC).<sup>1</sup>

## 1.2 of this Package

The acs.R package includes functions to allow users (a) to create custom geographies by combining existing ones provided by the Census, (b) to download and import demographic data from the American Community Survey (ACS) and Decennial Census (SF1/SF3), and (c) manage, manipulate, analyze, and present this data (including proper statistical techniques for dealing with estimates and standard errors). In addition, the package includes a pair of helpful "lookup" tools, one to help users identify the geographic units they want, and the other to identify tables and variables from the ACS for the data they are looking for, and some additional convenience functions for working with Census data.

# 2 Getting Started in R

# 2.1 Getting and Installing R

R is a complete statistical package—actually, a complete programming language with special features for statistical applications—with a syntax and workflow all its own. Luckily, it is well-documented through a variety of tutorials and manuals, most notably those hosted by the cran project at htp://cran.r-project.org/manuals.html. Good starting points include:

- R Installation and Administration, to get you started (with chapters for each major operating system); and
- An Introduction to R, which provides an introduction to the language and how to use R for doing statistical analysis and graphics.

<sup>&</sup>lt;sup>1</sup>For users of previous versions of the package, see http://papers.ssrn.com/sol3/papers.cfm?abstract\_id=2552524, which provides an earlier version of this guide.

Beyond these, there are dozens of additional good guides. (For a small sampling, see cran.r-project.org/other-docs.html.)

Exact installation instructions vary from one operating system or distribution to the next, but at this point most include an automated installer of one kind or another (a windows .exe installer, a Macintosh .pkg, a Debian apt package, etc.). Once you have the correct version to install, it usually requires little more than double-clicking an installer icon or executing a single command-line function.

Windows users may also want to review the FAQ at http://cran.r-project.org/bin/windows/base/rw-FAQ.html; similarly, Mac users should visit http://cran.r-project.org/bin/macosx/RMacOSX-FAQ.html.

### 2.2 Getting and Installing the acs Package

#### 2.2.1 Installing from CRAN

The acs package is hosted on the CRAN repository. Once R is installed and started, users may install the package with the install.packages command, which automatically handles dependencies.

```
> # do this once, you never need to do it again
# you may be asked to select a CRAN mirror, and then
# lots of output will scroll past
> install.packages("acs")
--- Please select a CRAN mirror for use in this session ---
Loading Tcl/Tk interface ... done
trying URL 'http://lib.stat.cmu.edu/R/CRAN/src/contrib/acs_1.0.tar.gz'
Content type 'application/x-gzip' length 1437111 bytes (1.4 Mb)
opened URL
_____
downloaded 1.4 Mb
* installing *source* package acs ...
** package acs successfully unpacked and MD5 sums checked
** R.
** data
  moving datasets to lazyload DB
** preparing package for lazy loading
Creating a generic function for summary from package base in
  package acs
Creating a new generic function for apply in package acs
Creating a generic function for plot from package graphics in
  package acs
** help
*** installing help indices
** building package indices
```

After installing, be sure to load the package with library(acs) each time you start a new session.

### 2.2.2 Installing from a zipped tarball

If for some reason the latest version of the package in not available through the CRAN repository (or if, perhaps, you intend to experiment with additional modifications to the source code), you may obtain the software as a "zipped tarball" of the complete package. It can be installed just like any other package, although dependencies must be managed separately. Simply start R and then type:

```
> # do this once, you never need to do it again
> install.packages(pkgs = "acs_2.0.tar.gz", repos = NULL)
* installing *source* package acs ...
** R.
** data
** moving datasets to lazyload DB
** preparing package for lazy loading
Creating a generic function for summary from package base in
   package acs
Creating a new generic function for apply in package acs
Creating a generic function for plot from package graphics in
   package acs
** help
*** installing help indices
** building package indices
** testing if installed package can be loaded
* DONE (acs)
```

(You may need to change the working directory to find the file, or specify a complete path to the pkgs = argument.) Once installed, don't forget to actually load the package to make the installed functions available:

```
> # do this every time to start a new session
> library(acs)
Loading required package: stringr
Loading required package: plyr
Loading required package: XML
Attaching package: acs
The following object(s) are masked from package:base:
    apply
```

The acs.R package depends on a few other fairly common R packages: methods, stringr, plyr, and XML. If these are not already on your system, you may need to install those as well—just use install.packages("package.name"). (Note: when the package is downloaded from the CRAN repository, these dependencies will be managed automatically.)

If installation of the tarball fails, users may need to specify the following additional options (likely for Windows and possibly Mac systems):

Assuming you were able to do these steps, we're ready to try it out.

#### 2.3 Getting and Installing a Census API Key

To download data via the American Community Survey application program interface (API), users need to request a "key" from the Census. Visit http://api.census.gov/data/key\_signup.html and fill out the simple form there, agree to the Terms of Service, and the Census will email you a secret key for only you to use.

When working with the functions described below,<sup>2</sup> this key must be provided as an argument to the function. Rather than expecting you to provide this long key each time, the package includes an api.key.install() function, which will take the key and install it on the system as part of the package for all future sessions.

```
> # do this once, you never need to do it again
> api.key.install(key="592bc14cnotarealkey686552b17fda3c89dd389")
>
```

<sup>&</sup>lt;sup>2</sup>or at least those that require interaction with the API, such as acs.fetch(), acs.lookup(), and the check= option for geo.make().

#### 2.3.1 Using a Blank Key: an informal workaround

Currently, the requirement for a key seems to be laxly enforced by the Census API, but is nonetheless coded into the acs package. Users without a key may find success by simply installing a blank key (i.e., via api.key.install(key=""); similarly, calls to acs.fetch and geo.make(..., check=T) may succeed with a key="" argument. Note that while this may work today, it may fail in the future if the API decides to start enforcing the requirement.

# 3 Working with the New Functions

#### 3.1 Overview

We've tried to make this User Guide as detailed as possible, to help you learn about the many advanced features of the new package. As a result, it may look like there is a lot to learn, but in fact the basics are pretty simple: to get ACS data for your own user-defined geographies, all you need to do is:

- 1. install and load the package, and (optionally) install an API key (see sections 2.2 and 2.3);
- 2. create a geo.set using the geo.make() function (see section 3.2);
- 3. optionally, use the acs.lookup() function to explore the variables you may want to download (see section 3.3.3 on page 20);
- 4. use the acs.fetch() function to download data for your new geography (see section 3.3.1 on page 16); and then
- 5. use the existing functions in the package to work with your data (see worked example in appendix A and the package documentation).

As a teaser, here you can see one single command that will download ACS data on "Place of Birth for the Foreign-Born Population in the United States" for *every tract* in all four PSRC counties:

When I tried this at home, it took about 10 seconds to download—but it's a lot of data to deal with: over 249,000 numbers (estimates and errors for 161 variables for each of a 776 tracts...).

### 3.2 User-Specific Geographies

### 3.2.1 Basic Building Blocks: the single element geo.set

The geo.make() function is used to create new (user-specified) geographies. At the most basic level, a user specifies some combination of existing census levels (state, county, county subdivision, place, tract, and/or block group), and the function returns a new geo.set object holding this information.<sup>3</sup> If you assign this object to a name, you can keep it for later use. (Remember, by default, functions in R don't save things—they simply evaluate and print the results and move on.)

```
> washington=geo.make(state=53)
> alabama=geo.make(state="Alab")
> yakima=geo.make(state="WA", county="Yakima")
> yakima
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: [1] "Yakima County, Washington"

Slot "combine":
[1] FALSE
Slot "combine.term":
[1] "aggregate"
```

When specifying the state, county, county subdivision, and/or place, geo.make() will accept either FIPS codes or common names, and will try to match on partial strings; there is also limited support for regular expressions, but by default the searches are case sensitive and matches are expected at the start of names. (For example, geo.make(state="WA", county="Kits") should find Kitsap County, and the more adventurous yakima=geo.make(state="Washi", county=".\*kima") should work to create the same Yakima county geo.set as above.) Important: when creating new geographies, each set of arguments must match with exactly one known Census geography: if, for example, the names of two places (or counties, or whatever) would both match, the geo.make() function will return an error. The one exception to this "single match" rule is that for the smallest level of geography specified, a user can enter "\*" to indicate that all geographies at that level should be selected.

tract= and block.group= can only be specified by FIPS code number (or "\*" for all); they don't really have names to use. (Tracts should be specified as six digit numbers, although initial zeroes may be removed; often trailing zeroes

<sup>&</sup>lt;sup>3</sup>Note: for reasons that will become clear in a moment, even a single geographic unit—say, one specific tract or county—will be wrapped up as a geo.set. Technically, each individual element in the set is known as a geo, but users will rarely (if ever) interact will individual elements such as this; wrapping all groups of geographies—even groups consisting of just one element—in geo.sets like this will help make them easier to deal with as the geographies get more complex. To avoid extra words here, I may occasionally ignore this distinction and refer to user-created geo.sets as "geos."

<sup>&</sup>lt;sup>4</sup>This seemed preferable to simply including both matches, since all sorts of place names might match a string, and it is doubtful a user really wants them all.

are removed in common usage, so a tract referred to as "tract 243" is technically FIPS code 24300, and "tract 3872.01" becomes 387201.)

When creating new geographies, note, too, that not all combinations are valid;<sup>5</sup> in particular, the package attempts to follow paths through the Census "summary levels" (such as summary level 140: "state-county-tract" or summary level 160: "state-place"). So when specifying, for example, state, county, and place, the county will be ignored.

```
> moxee=geo.make(state="WA", county="Yakima", place="Moxee")
Warning message:
In function (state, county, county.subdivision, place, tract, block.group) :
   Using sumlev 160 (state-place)
   Other levels not supported by census api at this time
```

(Despite this warning, the geo.set named moxee was nonetheless created—this is just a warning.)

#### 3.2.2 But where's the data...?

Note that these new geo.sets are simply placeholders for geographic entities—they do not actually contain any census data *about* these places. Be patient (or jump ahead to section 3.3 on page 16).

#### 3.2.3 Real geo. sets: complex groups and combinations

OK, so far, so good, but what if we want to create new complex geographies made of more than one known census geography? This is why these things are called geo.sets: they are actually *collections* of individual census geographic units, which we will later use to download and manipulate ACS data.

Looking back to when we created the yakima geo.set object (section 3.2.1 on the preceding page), you can see that the newly created object contained some additional information beyond the name of the place: in particular, all geo.sets include a slot named "combine" (initially set to FALSE) and a slot named "combine.term" (initially set to "aggregate"). When a geo.set consists of just a single geo, these extra slots don't do much, but if a geo.set contains more than one item, these two variables determine whether the geographies are to be treated as a set of individual lines or combined together (and relabeled with the "combine.term").<sup>6</sup> Once we have some more interesting sets, these will come in handy.

To make some more interesting sets, we have a few different options:

Specifying Multiple Geographies through geo.make() Rather than specifying a single set of FIPS codes or names, a user can pass the geo.make()

 $<sup>^5\</sup>mathrm{But}$  don't fret: see section 3.2.7 on page 12.

<sup>&</sup>lt;sup>6</sup>All this combining and relabeling takes place when the actual data is downloaded, so up until then you can continue to change and re-change the structure of your geo.sets.

function *vectors* of any length for state=, county=, and the like. If these vectors are all the same length, they will be combined in sequence; if some are shorter, they will be "recycled" in standard R fashion. (Note that this means if you only specify one item for say, state=, it will be used for all, but if you give two states, they will be alternated in the matching.) For simple combinations, this is probably the easiest way to create sets, but for more complicated things, it can get confusing.

```
> psrc=geo.make(state="WA", county=c(33,35,53,61))
> psrc
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: [1] "King County, Washington"

[[2]]
"geo" object: [1] "Kitsap County, Washington"

[[3]]
"geo" object: [1] "Pierce County, Washington"

[[4]]
"geo" object: [1] "Snohomish County, Washington"

Slot "combine":
[1] FALSE

Slot "combine.term":
[1] "aggregate"
```

Adding Existing geo.sets with "+" If you have already created a few different geo.sets, you can easily combine them together into a new geo.set with the "+" operator. Note that this will create a "flat" geo.set (no nesting—see section 3.2.5 on page 11), regardless of whether the constituent parts are nested sets.

<sup>&</sup>lt;sup>7</sup>By default, the new set will have combine=FALSE, with one exception: when adding a single-geography (i.e., length==1) to an existing set with combine= already set to TRUE, the new set will keep combine=TRUE, essentially "folding in" the new geography.

```
> length(north.mercer.island.plus)
[1] 3
> str(north.mercer.island.plus)
Formal class 'geo.set' [package "acs"] with 3 slots
  ..@ geo.list
                :List of 3
  ....$ :Formal class 'geo' [package "acs"] with 3 slots
  .. .. .. .. @ api.for:List of 1
  .. .. .. ..$ tract: num 24300
  .. .. .. .. @ api.in :List of 2
  .. .. .. ... state : num 53
  .. .. .. ..$ county: num 33
  ..... 0 name : chr "Tract 24300, King County, Washington"
  ....$ :Formal class 'geo' [package "acs"] with 3 slots
  .. .. .. .. @ api.for:List of 1
  .. .. .. .. $ tract: num 24400
  .. .. .. .. @ api.in :List of 2
  .. .. .. ... state : num 53
  .. .. .. ..$ county: num 33
  ..... @ name : chr "Tract 24400, King County, Washington"
  ....$ :Formal class 'geo' [package "acs"] with 3 slots
  .. .. .. .. @ api.for:List of 1
  .. .. .. .. .. $ tract: num 24500
  .. .. .. .. @ api.in :List of 2
  .. .. .. ... state : num 53
  .. .. .. ..$ county: num 33
  ......@ name : chr "Tract 24500, King County, Washington"
                : logi FALSE
  ..@ combine
  ..@ combine.term: chr "aggregate + aggregate"
```

Combining geo.sets with "c()" A third way to create new multi-element geo.sets is through the use of R's c() function (short for "combine"). Similar to the way R treats lists with this function, c() will combine geo.sets, but attempt to keep whatever structure they already have in place. The result is often a much more complex kind of nested object. There is real power in this structure, but it can also be a bit tricky; probably best reserved for "power users," but certainly worth playing with. (Hint: try creating different sets and combining them in different ways with c(), and then using length() and str() to examine the results.)

#### 3.2.4 Changing combine and combine.term

To check the current value of the combine and combine.term slots, you can use the combine() and combine.term() functions; to change these values, simply use combine()= and combine.term=.8

<sup>&</sup>lt;sup>8</sup>or combine()<- and combine.term()<-, for R traditionalists...

```
> combine(north.mercer.island)
[1] FALSE
> combine.term(north.mercer.island)
[1] "aggregate"
> combine(north.mercer.island)=T
> combine.term(north.mercer.island)="North Mercer Island"
> north.mercer.island
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: [1] "Tract 24300, King County, Washington"
[[2]]
"geo" object: [1] "Tract 24400, King County, Washington"
Slot "combine":
[1] TRUE
Slot "combine.term":
[1] "North Mercer Island"
```

#### 3.2.5 Nested and Flat geo.sets

Remember: by default, the addition operator ("+") will always return "flat" geo.sets, with all the geographies in a single list. The combination operator ("c()"), on the other hand, will generally return nested hierarchies, embedding sets within sets. When working with nested sets like this, the combine flag can be set at each level to aggregate *subsets* within the structure (although be careful—if a higher level of set includes combine=T, you'll never actually see the unaggregated subsets deeper down...).

Using these different techniques, you should be able to create whatever sort of new geographies you want—aggregating some geographies, keeping others distinct (but still bundled as a "set" for convenience), mixing and matching different levels of Census geography, and so on.

Two more helpful shortcuts to keep this all straight:

Setting combine= when creating geo.sets When creating new user-defined geographies with geo.make(), a user can explicitly set both combine=new-value and combine.term=new-value as additional arguments to the function.

flatten.geo.set() The package also includes a flatten.geo.set() helper function which will iron out even the most complex nested geo.set; it will always return an un-nested geo.set with all the geographies at a single depth, with a length() equal to the number of composite parts.

#### 3.2.6 Subsetting geo.sets

Sometimes, instead of combing geo.sets, users may want to work with just a portion of the an existing set. For this, rather than extending the addition metaphor and developing some sort of "subtraction rule," the package implements methods for R's standard subsetting rules for vectors, using [square brackets].

```
> north.mercer.island[2]
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: [1] "Tract 24400, King County, Washington"
Slot "combine":
[1] FALSE
Slot "combine.term":
[1] "aggregate (partial)"
> psrc[3:4]
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: [1] "Pierce County, Washington"
[[2]]
"geo" object: [1] "Snohomish County, Washington"
Slot "combine":
[1] FALSE
Slot "combine.term":
[1] "aggregate (partial)"
```

Note that subsetting geo.sets will still always return a complete geo.set, even when selecting only a single geography.

#### 3.2.7 Two tools to reduce frustration in selecting geographies

geo.lookup(): a helper to find what you need It can often be difficult to find exactly the geography you are looking for, and since (as noted above) geo.make() expects single matches to the groups of arguments it is given, this

could result in a lot of frustration—especially when trying to find names for places or county subdivisions, which are unfamiliar to many users (and often seem very close or redundant: e.g., knowing whether to look for "Moses Lake city" vs. "Moses Lake CDP"). To help, the package also includes the geo.lookup() function, which searches on the same arguments as geo.make(), but outputs all the matches for your inspection.

Unlike geo.make(), geo.lookup() looks for matches anywhere in the name (except when dealing with state names), and will output a dataframe showing candidates that match some or all of the arguments. (The logic is a little complicated, but basically to be included, a geography must match the given state name; when a county and a subdivision are both given, both must match; otherwise, geographies are included that match any—but not necessarily all—of the other arguments.)

```
> geo.lookup(state="WA", county="Ska", county.subdivision="oo")
  state state.name county
                               county.name county.subdivision
1
     53 Washington
                        NA
                                       <NA>
                                                             NA
2
                        57
     53 Washington
                             Skagit County
                                                             NA
3
     53 Washington
                        59 Skamania County
                                                             NA
4
     53 Washington
                        57
                             Skagit County
                                                          92944
5
     53 Washington
                        59 Skamania County
                                                          90424
  county.subdivision.name
                      <NA>
1
2
                      <NA>
3
                      <NA>
4
        Sedro-Woolley CCD
5
     Carson-Underwood CCD
 geo.lookup(state="WA", county="Kit", place="Ra")
  state state.name county
                                county.name place
                                                        place.name
     53 Washington
1
                                       <NA>
                                                               <NA>
                        NA
                                                NA
                             Kitsap County
2
     53 Washington
                                                NA
                                                               <NA>
                        35
3
     53 Washington
                        37 Kittitas County
                                                NA
                                                               <NA>
4
     53 Washington
                        NA
                             Pierce County 57140 Raft Island CDP
5
     53 Washington
                        NA Thurston County 57220
                                                      Rainier city
6
     53 Washington
                        NA
                                King County 57395
                                                    Ravensdale CDP
7
     53 Washington
                        NA
                            Pacific County 57430
                                                      Raymond city
```

In the first example, the first row matches just the state (summary level 40); the next two rows show matches at the state and county level (summary level 50); the final two rows show matches that were found looking at state ("WA"), county (containing "Ska"), and county subdivision (containing "oo"). In the second example, we see something similar in the first three rows, but after that the rest only match on state-place, ignoring the county selection (like summary level 160), although the county names are included in the output for convenience.

The geo.lookup() function can also accept more than a single string for each argument. In the case of states, the function checks each one independently; in all other cases, matching is done on any and all together (as with a logical "or").

```
> geo.lookup(state=c("WA", "OR"), county=c("M","B"))
   state state.name county
                                  county.name
      53 Washington
                         NA
                                         <NA>
2
                          5
                                Benton County
      53 Washington
3
      53 Washington
                         45
                                Mason County
4
      41
             Oregon
                         NA
                                          <NA>
5
      41
             Oregon
                          1
                                 Baker County
6
      41
             Oregon
                          3
                               Benton County
7
             Oregon
                              Malheur County
      41
                         45
8
      41
             Oregon
                         47
                               Marion County
9
      41
             Oregon
                         49
                                Morrow County
             Oregon
                         51 Multnomah County
10
      41
```

Setting check=T when using geo.make() Another trick to ensure valid geography matching is to set the check= argument when using geo.make(). When this option is set to TRUE (not the default), R will verify each element of the geo.set in turn as it creates it, querying the Census API server. If it encounters an invalid geography, the function will return an error, saving you trouble later; essentially, it helps catch geographies that are technically valid in form but match to no actual census geographies. 10

```
> no.state=geo.make(state=3) # there is no state with this FIPS code
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: character(0)

Slot "combine":
[1] FALSE
Slot "combine.term":
[1] "aggregate"
> no.state-geo.make(state=3, check=T)
```

<sup>&</sup>lt;sup>9</sup>At present, geo.lookup() only accepts and searches on state=, county=, county.subdivision=, and place=; eventually we hope to include lookup support to help find tract and block.group numbers as well.

<sup>&</sup>lt;sup>10</sup>At present, the function breaks on the first non-match, without a whole lot of help; in the future I'll add in some better error-handling for this.

```
Testing geography item 1: .... Error in file(file, "rt") : cannot
open the connection
> # give it something with a bad county/tract match
> shoreline.nw.border=geo.make(state=53,
    county=c(33, 33, 61, 61, 61),
    tract=c(20100, 20200, 20300, 50600, 50700), check=T, combine=T,
    combine.term="Shoreline NW Tracts")
Testing geography item 1: Tract 20100, King County, Washington .... OK.
Testing geography item 2: Tract 20200, King County, Washington .... OK.
Testing geography item 3: Tract 20300, Snohomish County, Washington
.... Error in file(file, "rt") : cannot open the connection
> # fix the problem and try again
> shoreline.nw.border=geo.make(state=53,
    county=c(33, 33, 33, 61, 61),
    tract=c(20100, 20200, 20300, 50600, 50700), check=T, combine=T,
    combine.term="Shoreline NW Tracts")
Testing geography item 1: Tract 20100, King County, Washington .... OK.
Testing geography item 2: Tract 20200, King County, Washington .... OK.
Testing geography item 3: Tract 20300, King County, Washington .... OK.
Testing geography item 4: Tract 50600, Snohomish County, Washington .... OK.
Testing geography item 5: Tract 50700, Snohomish County, Washington .... OK.
> shoreline.nw.border
An object of class "geo.set"
Slot "geo.list":
[[1]]
"geo" object: [1] "Tract 20100, King County, Washington"
"geo" object: [1] "Tract 20200, King County, Washington"
[[3]]
"geo" object: [1] "Tract 20300, King County, Washington"
[[4]]
"geo" object: [1] "Tract 50600, Snohomish County, Washington"
"geo" object: [1] "Tract 50700, Snohomish County, Washington"
Slot "combine":
[1] TRUE
Slot "combine.term":
```

```
[1] "Shoreline NW Tracts"
> # it worked!
> # also, note how we can set combine= and combine.term=
> # as arguments to geo.make() -- cool!
```

# 3.3 Getting Data

Once you've created some  $\tt geo.sets$ , you're ready for the fun part: using the package to download data directly from the Census ACS API.<sup>11</sup>

#### 3.3.1 acs.fetch(): the workhorse function

Whereas the previous version of the package required users to download data from the Census and then import it into R via the read.acs() function, these steps are combined in the new acs.fetch() function. Assuming you've already installed an API key (see section 2.3 on page 5)<sup>12</sup>, the call is quite simple:

```
> # table B01003: "Total Population"
> acs.fetch(geography=psrc, endyear=2011, table.number="B01003")
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                 B01003_001
King County
                 1908379 +/- 0
                 249238 +/- 0
Kitsap County
Pierce County
                 791528 +/- 0
Snohomish County 704536 +/- 0
> # table B05001: "Nativity and Citizenship Status in the United States"
> acs.fetch(geography=north.mercer.island.plus, endyear=2011,
  table.number="B05001")
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
  for different intervals, see confint()
                 B05001_001
                              B05001_002
                                           B05001_003 B05001_004 B05001_005
Census Tract 243 6771 +/- 374 5233 +/- 431 0 +/- 92
                                                      71 +/- 74 896 +/- 225
Census Tract 244 3040 +/- 253 2272 +/- 266 13 +/- 21 57 +/- 44 311 +/- 91
Census Tract 245 4630 +/- 245 3878 +/- 228 0 +/- 92
                                                      69 +/- 43 483 +/- 137
                 B05001_006
```

<sup>11</sup> Actually, you could download data even without creating a geo.set object first—R's evaluation procedures are perfectly happy letting you use geo.make() "on the fly" and passing the results to the acs.fetch() function: you could enter something like acs.fetch(geography=geo.make(state="WA", county="\*"), table.number="B01003").

 $<sup>^{12}</sup>$ And if you haven't, you can simply add a key= argument each time.

```
Census Tract 243 571 +/- 177
Census Tract 244 387 +/- 140
Census Tract 245 200 +/- 85
   For each of these geo.sets, combine=F, but if we want to get more creative
we can try:
> combine(north.mercer.island.plus)=T
> combine.term(north.mercer.island.plus)="North Mercer Island Tracts"
> my.geos=c(psrc, north.mercer.island.plus, shoreline.nw.border)
> # table B08013: "Aggregate Travel Time To Work (in Minutes) Of Workers By Sex"
> acs.fetch(geo=my.geos, table.number="B08013", endyear=2011,
                col.names=c("Total", "Male", "Female"))
ACS DATA:
 2007 -- 2011 ;
  Estimates w/90% confidence intervals;
  for different intervals, see confint()
                           Total
King County
                           24971250 +/- 189173
Kitsap County
                           3183505 +/- 83983
Pierce County
                           9986285 +/- 116148
                           9638070 +/- 109605
Snohomish County
North Mercer Island Tracts 118285 +/- 10711.36657948
                           283540 +/- 19482.3119007986
Shoreline NW Tracts
                           13972415 +/- 124050
King County
Kitsap County
                           1936155 +/- 70636
                           5787210 +/- 82246
Pierce County
                           5550680 +/- 77512
Snohomish County
North Mercer Island Tracts 70055 +/- 8217.77110900517
                           158090 +/- 15076.8047012621
Shoreline NW Tracts
                           Female
King County
                           10998835 +/- 129473
                           1247345 +/- 50974
Kitsap County
Pierce County
                           4199075 +/- 77010
Snohomish County
                           4087390 +/- 67221
North Mercer Island Tracts 48235 +/- 6455.83534486436
                           125450 +/- 11813.2511189765
Shoreline NW Tracts
```

As you can see, when combine=T, acs.fetch will aggregate the data (using the sum method for acs-class objects) when it is downloaded.<sup>13</sup>

<sup>13</sup> Note: At the request of some users, the acs package includes a special one.zero= option for the sum function, which may be desirable when aggregating lots of variables with zero-values for estimates. Since acs.fetch calls sum internally, you can set this option when you call acs.fetch and it will be passed along: for example, one could type acs.fetch(geo=my.geos, endyear=2011, table.number="B08013", one.zero=T). See help(sum-methods) for more on this.

Available data By default, acs.fetch() will download the "Five-Year ACS" (span=5) data from the ACS (dataset="acs"), but these defaults can be changed by setting these options to other values. As of version 2.0 of the package, endyear is a required option with no default; users must specify the latest year for the dataset they are seeking: for example, endyear=2011 for the 2007-2011 ACS data (or, with span=3, for the 2009-2011 data...), or endyear=2010 for the latest Decennial data (assuming that dataset="sf1" or dataset="sf3", of course.)

At present, the Census API provides the following, all of which are available using acs.fetch with the proper combinations of endyear, span, and dataset:

- American Community Survey (dataset="acs")
  - 5-Year Data: endyear= 2009 through 2014 (i.e., six surveys, 2005-2009 through 2010-2014);
  - 3-Year Data: endyear= 2012, 2013;
  - 1-Year Data: endyear= 2011, 2012, 2013, 2014).
- Decennial Census Data
  - SF1/Short-Form (dataset="sf1"): endyear= 1990, 2000, 2010;
  - SF3/Long-Form (dataset="sf3"): endyear= 1990, 2000.  $^{15}$

See http://www.census.gov/data/developers/data-sets.html for more information about available data, including guidance about which geographies are provided for each dataset.

Downloading based on a table number is probably the most fool-proof way to get the data you want, but acs.fetch() will also accept a number of other arguments instead of table.number. Users can provide strings to search for in table names (e.g., table.name="Age by Sex" or table.name="First Ancestry Reported") or keywords to find in the names of variables (e.g., keyword="Male" or keyword="Haiti")—but be warned: given how many tables there are, you may get more matches than you expected and suffer from the "download overload" of fast-scrolling screens full of data. On the other hand, if you know you want a specific variable or two (not a whole table, just a few columns of it—such as variable="B05001\_006" or variable=c("B16001\_058", "B16001\_059")), you can ask for that with acs.fetch(variable=variable.code, ...).

#### 3.3.2 More descriptive variable names: col.names=

Variable names like B01003\_001 and B05001\_006 provide a great shorthand, and can be good for experienced users, but most of us prefer something more

<sup>&</sup>lt;sup>14</sup>Users may set span=1 or span=3 for other ACS products, or span=0 for Decennial data; similarly, use dataset="sf1" or dataset="sf3" for other census products.

<sup>&</sup>lt;sup>15</sup>SF3 was discontinued after 2000 and replaced with the ACS.

<sup>&</sup>lt;sup>16</sup>But don't lose hope: see section 3.3.3 on the acs.lookup() tool, which can help with this problem.

descriptive. To help, the acs.fetch() function accepts a special argument called col.names, which can take any of the following values:

- 1. when col.names="auto" (the default), census variable codes are returned;
- 2. when col.names is given a character vector the same length as the number of variables in the table, these names will be used instead as variables for the new acs object; and
- 3. when col.names="pretty", the function will use descriptive names for the variables (but beware: these can be quite long).

```
> ancestry=acs.fetch(geo=psrc, table.name="People Reporting Ancestry",
     endyear=2011, col.names="pretty")
> ancestry[, 20:30] # just a selection of rows -- it's a long table!
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                 People Reporting Ancestry: Basque
                 1125 +/- 267
King County
                 41 +/- 34
Kitsap County
                 210 +/- 113
Pierce County
Snohomish County 135 +/- 68
                 People Reporting Ancestry: Belgian
King County
                 2928 +/- 466
Kitsap County
                 428 +/- 196
Pierce County
                 781 +/- 197
Snohomish County 844 +/- 263
                 People Reporting Ancestry: Brazilian
                 1716 +/- 519
King County
Kitsap County
                 231 +/- 185
Pierce County
                 124 +/- 91
Snohomish County 221 +/- 97
                 People Reporting Ancestry: British
                 17088 +/- 997
King County
                 1607 +/- 373
Kitsap County
                 3943 +/- 573
Pierce County
Snohomish County 4735 +/- 599
                 People Reporting Ancestry: Bulgarian
King County
                 1659 +/- 409
                 18 +/- 26
Kitsap County
Pierce County
                 213 +/- 123
Snohomish County 444 +/- 248
                 People Reporting Ancestry: Cajun
King County
                 234 +/- 141
Kitsap County
                 49 +/- 41
```

```
222 +/- 117
Pierce County
Snohomish County 140 +/- 92
                 People Reporting Ancestry: Canadian
                 9996 +/- 984
King County
Kitsap County
                 1076 +/- 311
                 3016 +/- 462
Pierce County
Snohomish County 3694 +/- 527
                 People Reporting Ancestry: Carpatho Rusyn
King County
                 49 +/- 38
Kitsap County
                 3 + / - 4
                 0 + / - 92
Pierce County
Snohomish County 0 +/- 92
                 People Reporting Ancestry: Celtic
                 898 +/- 328
King County
Kitsap County
                 101 +/- 66
                 263 +/- 101
Pierce County
Snohomish County 207 +/- 121
                 People Reporting Ancestry: Croatian
                 4577 +/- 647
King County
                 596 +/- 243
Kitsap County
Pierce County
                 2334 +/- 496
Snohomish County 743 +/- 234
                 People Reporting Ancestry: Cypriot
King County
                 0 +/- 92
                 0 +/- 92
Kitsap County
Pierce County
                 0 +/- 92
Snohomish County 0 +/- 92
```

#### 3.3.3 the acs.lookup() function: finding the variables you want

Using acs.fetch() you can download all the data you need from the Census, provided you either know the variable codes or table numbers or are willing to make some educated guesses. This is a fine way to work, and it may be all you need to get started, but for more deliberate users, we've also developed a second lookup tool—known as acs.lookup()—to help identify the tables and variables they are interested in. As with the geo.lookup() tool, the results of acs.lookup() can be named, saved, modified, and eventually passed to acs.fetch() to get data.

Finding the variables you want acs.lookup() takes arguments similar to acs.fetch—in particular, table.number, table.name, and keyword, as well as dataset (optional, defaults to dataset="acs"), endyear (required, as with acs.fetch), and span (optional, defaults to span=5)—and searches for matches in the meta-data of the Census tables. When multiple search terms are passed to a given argument (e.g., acs.lookup(endyear=2011, keyword=c("Female",

```
table.number="B01001", keyword="Female")), the tool searches for matches
that include all of these terms (i.e., terms are combined with a logical AND,
not a logical OR). Like acs.fetch, string matches with acs.lookup are case
sensitive by default, but users may change this by passing case.sensitive=F
as an option.
> urdu=acs.lookup(keyword="Urdu", endyear=2011)
An object of class "acs.lookup"
endyear= 2011 ; span= 5
results:
  variable.code table.number
    B16001_057
                      B16001
2
     B16001_058
                      B16001
     B16001_059
                      B16001
                                                                       table.name
1 Language Spoken at Home by Ability to Speak English for the Population 5+ Yrs
2 Language Spoken at Home by Ability to Speak English for the Population 5+ Yrs
3 Language Spoken at Home by Ability to Speak English for the Population 5+ Yrs
                                 variable.name
1
                                        Urdu:
             Urdu: Speak English 'very well'
3 Urdu: Speak English less than 'very well'
> age.by.sex=acs.lookup(table.name="Age by Sex", endyear=2011)
> age.by.sex
An object of class "acs.lookup"
endyear= 2011 ; span= 5
results:
  variable.code table.number
                                                                 table.name
     B01002 001
                                                          Median Age by Sex
                     B01002
2
     B01002_002
                      B01002
                                                          Median Age by Sex
3
     B01002_003
                      B01002
                                                          Median Age by Sex
                      B23013 Median Age by Sex for Workers 16 to 64 Years
4
     B23013_001
5
     B23013_002
                      B23013 Median Age by Sex for Workers 16 to 64 Years
6
     B23013_003
                      B23013 Median Age by Sex for Workers 16 to 64 Years
           variable.name
  Median age -- Total:
2
     Median age -- Male
```

"GED")), the tool returns matches where *all* of the terms are found; similarly, when more than one lookup argument is used (e.g., acs.lookup(endyear=2011,

3

Median age -- Female Median age -- Total: Median age-- Male

#### 6 Median age-- Female

Arguments for the acs.lookup are documented in the help files (see ?acs.lookup), but users unfamiliar with ACS variable nomenclature may want to spend a little time testing different search terms, keeping the following in mind:

- The table.number argument is fairly self-explanatory: it usually contains a six-character string, almost always starting with a "B" or "C", followed by a five-digit number (e.g., "B01001" or "C02003"). For tables that include data from Puerto Rico, the table number may include the letters "PR" at the end (e.g., "B05001PR" for "Nativity and Citizenship Status in Puerto Rico"). Note: For each acs.lookup search, only one table number is allowed.
- Strings passed to the table.name argument provide search terms to match in the *table names* of the ACS: for example, "Sex" or "Age" or "Age by Sex". Note: these include words that describe *types of categories*, not the categories themselves.
- The keyword argument contains terms to search for in the actual variable names of the table. Typically these include descriptive information on the nominative categories of the Census on Sex, Age, Race, Language, Ownership, and the like. Examples include "Male", "Female", "Black", "Spanish", "Subsaharan African", "80 to 84 years", "renter-occupied", and so on. Note: due to inconsistent capitalization rules, if you don't find the results, you expected, you may want to try again with case.sensitive=F.
- Don't forget that endyear is a required argument for acs.lookup.
- While dataset and span are optional arguments, variable codes, table numbers, and table names may change from year to year or dataset to dataset, so it's best to specify them as well, just as you would do for acs.fetch.

To help keep it clear, as a rule of thumb: table.name tells you what sort of categories the table's variables contain, and keyword tells you what particular categories each specific variable includes. So if you want information on all races (or age groups or languages, etc.), use table.name="Race" (or "Age" or "Language", etc.); if you only want a specific race (or age group or language, etc.), use keyword="Asian" (and so on).

Manipulating and using acs.lookup objects Since acs.lookup objects are valid objects in R, they can be named and saved (for example, urdu and age.by.sex above) and further manipulated by the user. Results contained within acs.objects can be subsetted (with [square brackets]), and even combined (with either c() or +—both function the same way) to create new acs.lookup objects.

```
> workers.age.by.sex=age.by.sex[4:6]
> my.vars=workers.age.by.sex+urdu
> # could also be:
> # my.vars=c(workers.age.by.sex, urdu)
> mv.vars
An object of class "acs.lookup"
endyear= 2011 ; span= 5
results:
   variable.code table.number
                     B23013
     B23013_001
     B23013_002
                       B23013
5
6
     B23013_003
                      B23013
41
     B16001_057
                      B16001
51
     B16001_058
                      B16001
61
     B16001_059
                       B16001
                                                                       table.name
4
                                    Median Age by Sex for Workers 16 to 64 Years
5
                                    Median Age by Sex for Workers 16 to 64 Years
6
                                    Median Age by Sex for Workers 16 to 64 Years
41 Language Spoken at Home by Ability to Speak English for the Population 5+ Yrs
51 Language Spoken at Home by Ability to Speak English for the Population 5+ Yrs
61 Language Spoken at Home by Ability to Speak English for the Population 5+ Yrs
                                 variable.name
4
                         Median age -- Total:
5
                            Median age-- Male
6
                          Median age-- Female
41
                                        Urdu:
              Urdu: Speak English 'very well'
51
   Urdu: Speak English less than 'very well'
> acs.fetch(geography=psrc, endyear=2011, variable=my.vars)
ACS DATA:
 2007 -- 2011 ;
  Estimates w/90% confidence intervals;
  for different intervals, see confint()
                             B23013_001
                                          B23013_002
                                                       B23013_003
                             39.6 +/- 0.2 39.5 +/- 0.2 39.6 +/- 0.2
King County, Washington
                             41.2 +/- 0.3 40.3 +/- 0.3 42.3 +/- 0.4
Kitsap County, Washington
Pierce County, Washington
                             39.8 +/- 0.2 39.6 +/- 0.2 40.1 +/- 0.2
Snohomish County, Washington 41.1 +/- 0.2 40.9 +/- 0.2 41.3 +/- 0.3
                             B16001_057
                                        B16001_058
                                                       B16001_059
King County, Washington
                             1735 +/- 557 1308 +/- 454 427 +/- 170
Kitsap County, Washington
                             75 +/- 99
                                          75 +/- 99
                                                       0 + / - 92
Pierce County, Washington
                             219 +/- 189 204 +/- 178 15 +/- 27
Snohomish County, Washington 1179 +/- 520 858 +/- 329 321 +/- 267
```

>

Note that these "acs.lookup" objects can also be passed as variables to acs.fetch with different (new) values for endyear and span:

```
> acs.fetch(geography=psrc, endyear=2014, variable=my.vars)
ACS DATA:
 2010 -- 2014 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                            B23013_001
                                         B23013_002
                                                      B23013_003
King County, Washington
                            39.7 +/- 0.1 39.8 +/- 0.2 39.6 +/- 0.2
Kitsap County, Washington
                            41 +/- 0.3
                                         39.6 +/- 0.4 42.6 +/- 0.5
                             40 +/- 0.2
Pierce County, Washington
                                          39.7 +/- 0.2 40.4 +/- 0.3
Snohomish County, Washington 41.3 +/- 0.2 41.4 +/- 0.2 41.1 +/- 0.2
                            B16001_057
                                         B16001_058
                                                      B16001_059
King County, Washington
                             2343 +/- 527 1880 +/- 425 463 +/- 168
                                                       0 +/- 28
Kitsap County, Washington
                             62 +/- 91
                                          62 +/- 91
                             108 +/- 161 77 +/- 106
Pierce County, Washington
                                                       31 +/- 56
Snohomish County, Washington 1123 +/- 488 860 +/- 318 263 +/- 211
> acs.fetch(geography=psrc, endyear=2014, span=1, variable=my.vars)
ACS DATA:
 2014;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                            B23013_001 B23013_002
                                                      B23013 003
                            39.4 +/- 0.2 39.6 +/- 0.2 39.1 +/- 0.4
King County, Washington
Kitsap County, Washington
                            40 +/- 0.7
                                          38.1 +/- 1.4 41.8 +/- 1.2
                            39.3 +/- 0.4 39.2 +/- 0.5 39.4 +/- 0.7
Pierce County, Washington
Snohomish County, Washington 41 \pm 0.5
                                        41.2 +/- 0.5 40.7 +/- 0.7
                            B16001_057
                                          B16001_058
                                                        B16001_059
King County, Washington
                             2844 +/- 1478 2413 +/- 1158 431 +/- 403
                                                         NA +/- NA
Kitsap County, Washington
                             NA +/- NA
                                           NA +/- NA
Pierce County, Washington
                            NA +/- NA
                                          NA +/- NA
                                                         NA +/- NA
Snohomish County, Washington 1856 +/- 1247 1581 +/- 1076 275 +/- 258
```

And, in this way, once the Census has released data for 2015 users may begin to download it even before the acs package has been updated:

```
> acs.fetch(geography=psrc, endyear=2015, variable=my.vars)
Error in file(file, "rt") : cannot open the connection
> # error now, but when the data is available through the API
> # this will actually work!!
```

# 4 Exporting Data

In the future, versions of the acs package will include improved export functions to allow users to save acs data in a variety of formats. For now, however, users wishing to export data for use in spreadsheets or other program can make use of the existing export functions, such as write.csv, along with the package's estimate, standard.error, and confint functions. Thus, to save the estimates, standard errors, and a 90% confidence interval as three different .csv spreadsheets:

```
> write.csv(estimate(ancestry), file="./ancestry_estimate.csv")
> write.csv(standard.error(ancestry), file="./ancestry_error.csv")
> write.csv(confint(ancestry, level=.90), file="./ancestry_confint.csv")
```

Depending on the shape you ideally want the data to take, you may want to first create a dataframe from these various elements—a first column of estimate, a second column of 90% MOEs, for example—and then save that:

```
> urdu.speakers=acs.fetch(geography=c(psrc, north.mercer.island.plus),
    variable=urdu[1], endyear=2011, col.names="Speak Urdu")
> urdu.speakers
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
  for different intervals, see confint()
                             Speak Urdu
King County, Washington
                             1735 +/- 557
                             75 +/- 99
Kitsap County, Washington
Pierce County, Washington
                             219 +/- 189
Snohomish County, Washington 1179 +/- 520
North Mercer Island Tracts
                             0 +/- 159.348674296337
> my.data=data.frame(estimate(urdu.speakers),
     1.645*standard.error(urdu.speakers))
> colnames(my.data)=c("Estimate","90% MOE")
> my.data
                             Estimate 90% MOE
King County, Washington
                                 1735 557.0000
Kitsap County, Washington
                                   75 99.0000
Pierce County, Washington
                                  219 189.0000
Snohomish County, Washington
                                 1179 520.0000
North Mercer Island Tracts
                                    0 159.3487
> write.csv(my.data, file="./urdu.csv")
```

# 5 Additional Resources

The acs.R package is hosted on the CRAN repository, where updates will appear from time to time. For additional guidance and examples, users are advised to review the complete documentation at (http://cran.r-project.org/web/packages/acs/index.html), which can also be accessed in an R session via the help function.

Additional insights on the general object-oriented approach of the package may be found in my 2011 article, "acs.R: an R Package for Neighborhood-Level Data from the U.S. Census" (http://papers.ssrn.com/sol3/papers.cfm? abstract\_id=2171390). In addition, the "CityState" website http://eglenn.scripts.mit.edu/citystate/ will continue to include updates, patches, worked examples, and more. And finally, users may subscribe to a mailing list at http://mailman.mit.edu/mailman/listinfo/acs-r to keep in touch about the ongoing development of the package, including information on ongoing development; user questions, technical assistance, and new feature requests; and additional updates.

# A A worked example using blockgroup-level data and nested combined geo.sets

To showcase how the package can create new census geographies based on blockgroups—the smallest census geographies provided via the Census API—we can use the following example from Middlesex County in Massachusetts.

# A.1 Making the geo.set

To gather data on all the block groups for tract 387201, we create a new geo like this:

```
> my.tract=geo.make(state="MA", county="Middlesex",
    tract=387201, block.group="*", check=T)
Testing geography item 1: Tract 387201, Blockgroup *,
    Middlesex County, Massachusetts .... OK.
```

This might be a useful first step, especially if I didn't know how many block groups there were in the tract, or what they were called. Also, note that check=T is not required, but can often help ensure you are dealing with valid geos.

If we then wanted to get very basic info on these block groups—say, table number "B01003" (Total Population), we use:

Here we can see that the block.group="\*" has yielded the actual four block groups for the tract.<sup>17</sup> Now, if instead of wanting all of them, we only wanted the first two, we could just type:

```
> my.bgs=geo.make(state="MA", county="Middlesex",
    tract=387201, block.group=1:2, check=T)
```

<sup>17</sup>A similar approach can help find the names of all tracts in a county, for example: acs.fetch(geography=geo.make(state="MA", county="Middlesex", tract="\*"), table.number="B01001") returns a list of all 300+ tracts in the county, with estimates of total population.

```
Testing geography item 1: Tract 387201, Blockgroup 1,
  Middlesex County, Massachusetts .... OK.
Testing geography item 2: Tract 387201, Blockgroup 2,
 Middlesex County, Massachusetts .... OK.
And then:
> bg.total.pop=acs.fetch(geo=my.bgs, endyear=2011, table.number="B01003")
> bg.total.pop
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
              B01003_001
Block Group 1 2681 +/- 319
Block Group 2 952 +/- 213
Now, if we wanted to add in some blockgroups from tract 387100 (a.k.a. "tract
3871"—but remember: we need those trailing zeroes)—say, blockgroups 2 and
3—we could enter:
> my.bgs=my.bgs+geo.make(state="MA", county="Middlesex",
  tract=387100, block.group=2:3, check=T)
Testing geography item 1: Tract 387100, Blockgroup 2,
  Middlesex County, Massachusetts .... OK.
Testing geography item 2: Tract 387100, Blockgroup 3,
  Middlesex County, Massachusetts .... OK.
And then:
> acs.fetch(geo=my.bgs, endyear=2011, table.number="B01003")
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                                                              B01003 001
Block Group 1, Census Tract 3872.01, Middlesex County, ...
                                                              2681 +/- 319
Block Group 2, Census Tract 3872.01, Middlesex County, ...
                                                              952 +/- 213
Block Group 2, Census Tract 3871, Middlesex County, ...
                                                              827 +/- 171
Block Group 3, Census Tract 3871, Middlesex County, ...
                                                              1821 +/- 236
```

## A.2 Using combine=T to make a neighborhood

Next, to showcase the real power of geo.sets: let's say we don't just want to get data on the four blockgroups, but I want to \*combine\* them into a

single new geographic entity—say, a neighborhood called "Turkey Hill." Before downloading, we could simply say:

And *voila!*, the package sums the estimates and deals with the margins of error, so we don't need to get our hands dirty with square roots and standard errors and all that messy stuff.

### A.3 Even more complex geo.sets

We can even create interesting nested geo.sets, where some of the lower levels are combined, and others are kept distinct:

```
> more.bgs=c(my.bgs, geo.make(state="MA",
  county="Middlesex", tract=370300, block.group=1:2, check=T),
  geo.make(state="MA", county="Middlesex", tract=370400,
  block.group=1:3, combine=T, combine.term="Quirky Hill", check=T))
Testing geography item 1: Tract 370300, Blockgroup 1, .... OK.
Testing geography item 2: Tract 370300, Blockgroup 2, .... OK.
Testing geography item 1: Tract 370400, Blockgroup 1, .... OK.
Testing geography item 2: Tract 370400, Blockgroup 2, .... OK.
Testing geography item 3: Tract 370400, Blockgroup 3, .... OK.
> acs.fetch(geo=more.bgs, endyear=2011, table.number="B01003",
  col.names="pretty")
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                                    Total Population: Total
                                    6281 +/- 481.733328720362
Turkey Hill
Block Group 1, Census Tract 3703
                                    315 +/- 132
Block Group 2, Census Tract 3703
                                    1460 +/- 358
                                    2594 +/- 487.719181496894
Quirky Hill
```

We can even create a <code>geo.set</code> that bundles different levels of census geography—for example, our two neighborhoods ("Turkey Hill" and "Quirky Hill"), plus some data for comparison on the entire county and state level.

```
> neighborhood.geos=c(more.bgs[c(1,3)],
  geo.make(state="MA", county="Middlesex"),
  geo.make(state="MA"))
> acs.fetch(geography=neighborhood.geos, endyear=2011,
  table.number="B01003", col.names="pretty")
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
  for different intervals, see confint()
                                Total Population: Total
                                6281 +/- 481.733328720362
Turkey Hill
                                2594 +/- 487.719181496894
Quirky Hill
Middlesex County, Massachusetts 1491762 +/- 0
                                6512227 +/- 0
Massachusetts
```

Note that this geo.set can now be used again and again to download and analyze many different variables for these same geographies.

# A.4 Gathering neighborhood data on transit mode-share

As a final example, let's look for some data on commuting choices for these two neighborhoods, compared to the county and state. If we don't know what census variables we wants, we can use the acs.lookup function to search for likely candidates. Let's see which variables use the word "Bicycle":

```
> acs.lookup(keyword="Bicycle", endyear=2011)
An object of class "acs.lookup"
endyear= 2011 ; span= 5
results:
  variable.code table.number
1
     B08006_014
                      B08006
2
     B08006_031
                      B08006
3
     B08006_048
                      B08006
4
     B08301_018
                      B08301
5
     B08406_014
                      B08406
6
     B08406_031
                      B08406
7
     B08406_048
                      B08406
8
     B08601_018
                      B08601
                                                                  table.name
                          Sex of Workers by Means of Transportation to Work
1
2
                          Sex of Workers by Means of Transportation to Work
3
                          Sex of Workers by Means of Transportation to Work
                                             Means of Transportation to Work
5 Sex of Workers by Means of Transportation to Work for Workplace Geography
```

```
6 Sex of Workers by Means of Transportation to Work for Workplace Geography
7 Sex of Workers by Means of Transportation to Work for Workplace Geography
8
                    Means of Transportation to Work for Workplace Geography
      variable.name
1
           Bicvcle
2
     Male: Bicycle
3
  Female: Bicycle
           Bicycle
4
           Bicycle
5
6
     Male: Bicycle
7
  Female: Bicycle
           Bicycle
>
```

We've quickly narrowed a few thousand variables down to just 8. As is common with the ACS, there are a number of tables that relate to the topic we are interested in (means of transportation), often cross-tabulated with other topics. The simplest one seems to be the fourth in the list, "Means of Transportation to Work," from table number B08301. Let's look at all the variables there, just to be sure:

```
> acs.lookup(table.number="B08301", endyear=2011)
An object of class "acs.lookup"
endyear= 2011 ; span= 5
results:
  variable.code table.number
                                                   table.name
                      B08301 Means of Transportation to Work
1
     B08301_001
2
     B08301_002
                      B08301 Means of Transportation to Work
3
     B08301_003
                      B08301 Means of Transportation to Work
4
     B08301_004
                      B08301 Means of Transportation to Work
5
     B08301_005
                      B08301 Means of Transportation to Work
    [abbreviated for space]
                                          variable.name
1
                                                Total:
2
                                   Car, truck, or van:
3
                      Car, truck, or van: Drove alone
4
                       Car, truck, or van: Carpooled:
   Car, truck, or van: Carpooled: In 2-person carpool
    [abbreviated for space]
```

This seems to be what we want, including data on people who drove to work alone, biked, took public transit, and so on for 20 different modes (as well as the all important "Total" on the first line, which we will need for percentages).

For our purposes, let's look at just a few of these variables: drove alone, public transportation, biking, and the total population from the table. We can subset these and save them as a new acs.lookup object, and pass them right on to fetch some data.

```
> transit.vars=acs.lookup(table.number="B08301")[c(1,3,10,18),
  endyear=2011]
> transit.vars
An object of class "acs.lookup"
endyear= 2011 ; span= 5
results:
   variable.code table.number
                                                    table.name
      B08301_001
                       B08301 Means of Transportation to Work
1
3
      B08301_003
                       B08301 Means of Transportation to Work
      B08301_010
                       B08301 Means of Transportation to Work
10
      B08301_018
                       B08301 Means of Transportation to Work
18
                                  variable.name
                                        Total:
1
               Car, truck, or van: Drove alone
10 Public transportation (excluding taxicab):
18
                                       Bicycle
> transit.data=acs.fetch(geography=neighborhood.geos,
  variable=transit.vars, endyear=2011,
  col.names=c("Total","Drove Alone","Public Transit","Biked"))
> transit.data
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
Turkey Hill
                                3159 +/- 405.076535978079
Quirky Hill
                                1891 +/- 380.596899619532
Middlesex County, Massachusetts 773894 +/- 3339
                                3202521 +/- 8062
Massachusetts
                                Drove Alone
Turkey Hill
                                2687 +/- 352.326553072572
                                1068 +/- 301.584150777192
Quirky Hill
Middlesex County, Massachusetts 539042 +/- 3602
Massachusetts
                                2316985 +/- 8271
                                Public Transit
Turkey Hill
                                110 +/- 133.285408053545
```

 $<sup>^{18}\</sup>mathrm{Note}$  the importance of the last of these variables: when computing percentages for ACS data, always use the totals from the particular table, not from some other "Total population" table.

```
Quirky Hill 333 +/- 133.007518584477
Middlesex County, Massachusetts 82883 +/- 1931
Massachusetts 291160 +/- 3799
Biked
Turkey Hill 0 +/- 190
Quirky Hill 40 +/- 103.009708280336
Middlesex County, Massachusetts 9661 +/- 725
Massachusetts 21938 +/- 1195
```

Since these are raw counts, and we might be more interested in percentages, we can use the special math functions of the acs package to divide the last three columns by the first. (The division function will automatically deal with both estimates and standard errors.) In some cases, division on acs objects is quite simple: something like transit.data[,2]/transit.data[,1] would convert the second column from counts to percentages. We can try that here, as follows:

```
> transit.data[,2]/transit.data[,1]
ACS DATA:
 2007 -- 2011 ;
 Estimates w/90% confidence intervals;
 for different intervals, see confint()
                                ( Drove Alone : Total )
                                0.850585628363406 +/- 0.155998230670757
Turkey Hill
                                0.564780539397144 +/- 0.195848029196112
Quirky Hill
Middlesex County, Massachusetts 0.696532083205193 +/- 0.00554027354078655
Massachusetts
                                0.723487839736258 +/- 0.00316025915803343
Warning message:
In transit.data[, 2]/transit.data[, 1] :
  ** using the more conservative formula for ratio-type
 dividing, which does not assume that numerator is a subset of
  denominator; for more precise results when seeking a proportion
  and not a ratio, use divide.acs(..., method="proportion") **
```

In this case, however, as the warning notes, this is actually slightly wrong: since this should in fact be a "proportion-type" division (and not a "ratio-type" division—see <code>?divide.acs</code>), we don't want standard division with "/", but instead must use the package's special <code>acs.divide</code> function. This can be called on each column of our data with R's standard <code>apply</code> function, which has been adapted to work on <code>acs</code> objects.

```
> apply(transit.data[,2:4], MARGIN=1, FUN=divide.acs,
  denominator=transit.data[,1], method="proportion",
  verbose=F)
ACS DATA:
```

```
2007 -- 2011 ;
  Estimates w/90% confidence intervals;
  for different intervals, see confint()
                                ( Drove Alone / Total )
Turkey Hill
                                0.850585628363406 +/- 0.0233001603324679
                                0.564780539397144 +/- 0.111865144361133
Quirky Hill
Middlesex County, Massachusetts 0.696532083205193 +/- 0.00355414596064069
                                0.723487839736258 +/- 0.00183110720072149
Massachusetts
                                ( Public Transit / Total )
Turkey Hill
                                0.034821145932257 +/- 0.0419553490713477
Quirky Hill
                                0.176097303014278 +/- 0.0607546663302448
Middlesex County, Massachusetts 0.107098646584674 +/- 0.00245201395451528
                                0.0909158753369611 +/- 0.00116396486009957
Massachusetts
                                ( Biked / Total )
Turkey Hill
                                0 +/- 0.0601456157011713
                                0.0211528291909043 +/- 0.0546397830403873
Quirky Hill
Middlesex County, Massachusetts 0.0124836217879968 +/- 0.000938367861201701
                                0.00685022830451385 +/- 0.000373541799644013
Massachusetts
```

Note in passing that the resulting *estimates* are the same as in the previous division, but that there errors are slightly different as a result of the proportion-type operation.<sup>19</sup>

Now we can see something interesting in our data: not only do far more people in Turkey Hill drive alone (and far fewer take public transit) than in Quirky Hill (or even in the county or state), the differences seem far beyond the report margin of errors.

<sup>&</sup>lt;sup>19</sup>If you don't set verbose=F, the function also returns some warnings—the first two just to let you know that proportion-division is not the same as ratio-division; the third lets you know that in one case, the function defaulted to ratio-style division as per Census guidance.