statacpp: a simple Stata / C++ interface

Robert Grant Kingston & St George's <u>robertgrantstats.co.uk</u>





Mata

Greata



Why?

- RCpp has been very popular
- interface from a data analysisspecific high-level language to a compiled fast low(er)-level language
- C++ is widely used and trusted
- There are many powerful libraries
- You can run on multiple cores without Stata/MP







Startup advice overheard: you have too many hipsters, you won't scale like that. Hire some fat guys who know c++.



How?

- Built by smashing StataStan & sticking it back together
- Write code out to a .cpp text file
- Add in variables, globals, matrices from Stata
- Add in code to write results back into a new do-file
- Shell command to compile it; shell command to run the new executable file
- Do the new do-file to get the results into Stata; carry on where you left off

"they say no thing is wrote now-a-days, but low nonsense and mere bagatelle"

-Alain René le Sage, 1759

Silly example

- Grant's Patented Fuel Efficiency Boosterizer
- We pass the mpg variable from the auto dataset, and a global, to C++
- There, mpg values are multiplied by the global, and passed back as mpg2
- Trebles all round

sysuse auto global myglob=2 mkmat weight length in 1/5, mat(mymat) /* C++ int main () { cout << "Now running the Fuel Efficiency Boosterizer" << endl; cout << "We will multiply mpg by: " << myglob << endl;</pre> std::vector <int> mpg2 = mpg; for(int i=0;i<mpg.size();i++) {</pre> mpg2[i] = mpg[i]*myglob; } double mymat2[1][2]= {{mymat[0][0], mymat[0][1]}}; // send var mpg2 // send matrix mymat2 return 0; } */

```
statacpp mpg, codefile("myprog.cpp") inline globals("myglob") matrices("mymat")
tabstat mpg mpg2, stat(min q max)
```

```
#include <iostream>
    #include<array>
2
    #include<vector>
3
    #include <fstream>
 4
    #include <sstream>
5
    using std::cout;
6
    using std::endl;
7
    using std::array;
8
    using std::vector;
9
    using std::ifstream;
10
    using std::ofstream;
11
12
    int main () {
    std::vector <int> mpg = {22, 17, 22, 20, 15, 18, 26, 20, 16, 19, 14, 14, 21, 29, 16, 22,
13
    22, 24, 19, 30, 18, 16, 17, 28, 21, 12, 12, 14, 22, 14, 15, 18, 14, 20, 21, 19, 19, 18, 19,
    24, 16, 28, 34, 25, 26, 18, 18, 18, 19, 19, 19, 24, 17, 23, 25, 23, 35, 24, 21, 21, 25, 28,
    30, 14, 26, 35, 18, 31, 18, 23, 41, 25, 25, 17;
    double mymat[5][2] = { { 2930,186 }, { 3350,173 }, { 2640,168 }, { 3250,196 }, {
14
    4080,222 } };
    double myglob = 2;
15
```

- cout << "Now running the Fuel Efficiency Boosterizer" << endl; 16
- cout << "We will multiply mpg by: " << myglob << endl; 17

1

```
18
    std::vector <int> mpg2 = mpg;
    for(int i=0;i<mpg.size();i++) {</pre>
19
    mpg2[i] = mpg[i]*myglob;
20
21
22
    double mymat2[1][2]= {{mymat[0][0], mymat[0][1]}};
23
    // send var mpg2
    // send matrix mymat2
24
    ofstream wfile;
25
    wfile.open("output.do",ofstream::out);
26
    wfile << "input mpg2" << endl;
27
    for(int i=0; i<=(mpg2.size()-1); i++) {</pre>
28
    wfile << mpg2[i] << endl;
29
30
    }
    int ncells; int ncols; int nrows;
31
32
    ncells = sizeof(mymat2)/sizeof(double);
    ncols = sizeof(mymat2[0])/sizeof(double);
33
    nrows = ncells/ncols;
34
    wfile << "matrix mymat2 = [";</pre>
35
    for(int i=0; i<nrows; i++) {</pre>
36
    for(int j=0; j<ncols; j++) {</pre>
37
    wfile << mymat2[i][j];</pre>
38
    if(j<(ncols-1)) { wfile << ", "; }}</pre>
39
    if(i<(nrows-1)) { wfile << " \\ "; }}</pre>
40
    wfile << "]" << endl;
41
    wfile.close();
42
    return 0;
43
44
    }
```

1	input mpg2
2	44
3	34
4	44
5	40
6	30
7	36
8	52
9	40
10	32
11	38
12	28
13	28
14	42
15	58
16	32

67	70
68	36
69	62
70	36
71	46
72	82
73	50
74	50
75	34
76	<pre>matrix mymat2 = [2930, 186]</pre>

Application 1

- Big(-ish) data
- Let's draw a heatmap of pickup locations for every taxi journey in New York city in 2013.
- MTA dataset obtained by Chris Whong, ~50GB





NYC taxi data

- Loop through each of 24 text files
- No need to load to RAM; process one line at a time
- Binning on rectangular grids: latitude, longitude
- Simplest form of MapReduce concept
- You could also extract a random sample, and don't forget the value of sufficient statistics...

NYC taxi data

- Get the latitude & longitude from line 1
- Add each line (1 taxi journey) to the relevant bin
- Move to the next line
- Return the binned counts to Stata as data
- Draw some plots, do some analysis



NYC taxi data

- But Robert, you could do that with Stata file commands
- Sure, but
 - this can be parallelised without Stata/MP and
 - there are many other input streams in C++, e.g. from sensors on serial ports

Application 2

- Deep(-ish) learning
- Let's send our data through a C++ library that offers analyses we don't have inside Stata
- Fisher's irises
- Interlocked spirals (artificial data)

5

3

2

0

-1

-2

-3

-4

-5

Fisher's irises

- An example from the OpenNN library
- A simple neural network for classification
- 4 input neurons, 6 hidden neurons in 1 layer, 3 output neurons
- This is an easy problem

Interlocked spirals



playground.tensorflow.org

Interlocked spirals

- An artificial 'hard' problem
- Classical statistical tools will not help
- 6 input neurons (x, y, x², y², sin x, sin y)
- 4:4 hidden neurons (2 layers [='deep'])
- 1 output neuron
- Very hard without knowing the structure

Limitations & grumpiness

- One .cpp file, limited linking capability
- g++ (& makefile) only
- Not even tested in W****s
- But wouldn't it be nice to have:
 - StataCUDA
 - the reverse interface to call Stata for analysis
- Don't ask for stuff, go to <u>github.com/robertgrant/statacpp</u> and make it