

Assignment Games Maximum Score for the C Block PCS Auction

Jeremy T. Fox

March 11, 2005

March 23, 2005: payoffs non-additive across matches

August 11, 2005: exchange two licenses at once

August 19, 2005: oversample adjacent packages

August 20, 2005: put one license exchanges back in

November 3, 2006: jump bids only last rivals

March 1, 2007: HT style bounds using price data

May 20, 2009: Check whether pairwise stable equilibrium exists

June 9, 2010: Make sure winnings always under eligibility

- Licenses are the agents in a two-sided matching market

Normalization is coefficient on pop*eligibility is 1.

Opening Stuff

Packages

```
(L2) In[1]:= SetDirectory[NotebookDirectory[]];  
(L2) In[2]:= << MatchEstimation`;  
General::obspkg :  
Histograms` is now obsolete. The legacy version being loaded may conflict with current Mathematica  
functionality. See the Compatibility Guide for updating information. >>  
BarChart3D::shdw : Symbol BarChart3D appears in multiple contexts {BarCharts`,  
System`}; definitions in context BarCharts` may shadow or be shadowed by other definitions. >>  
Histogram3D::shdw : Symbol Histogram3D appears in multiple contexts {Histograms`,  
System`}; definitions in context Histograms` may shadow or be shadowed by other definitions. >>  
(L2) In[3]:= << Developer`;
```

Read in Data - licenses

```
(L2 In[4]:= rationals = 0.000000000000000000000001;
(* SetDirectory["/Users/fox/Documents/Phones/FCC/Talks/SITE July 2004/Empirical"]; *)

SetDirectory[ToFileName[Extract[
"FileName" /. NotebookInformation[EvaluationNotebook[]], {1}, FrontEnd`FileName]]];
SetDirectory["data"];

(*SetDirectory["Z:\Documents\Phones\FCC\Talks\SITE July 2004\Empirical"]; *)
marketdata = Import["btadata_2004_03_12_1.csv", "CSV"];
marketdata = Delete[marketdata, 1];

bidderdata = Import["bidderblk_03_28_2004_pln.csv", "CSV"];
bidderdata = Delete[bidderdata, 257]; (* FCC *)
bidderdata = Delete[bidderdata, 1];

(* There is a data entry problem where the winner
of DCR's licenses is falsely labeled as bidder 190, DCC.
DCC was a small company that won no licenses. So the
easiest solution is just to call bidder 190 DCR
instead of DCC. *)

bidderdataDCC = bidderdata[[190]];
bidderdata[[190]] = bidderdata[[234]];
bidderdata[[234]] = bidderdataDCC;

bidders = Length[bidderdata];
observations = bidders;
eligibilitydata = Rationalize[bidderdata[[All, 4]], rationals] / 1000 000;

(* SetDirectory["/Users/fox/Documents/Phones/FCC/Talks/SITE July 2004/Empirical"]; *)
adjacencymatrixpre = Import["btamatrix_merged.csv", "CSV"];
adjacencymatrix = Transpose[Delete[Transpose[adjacencymatrixpre], 1]];

(* bidderelig = bidderdata[[All,4]] /1000; *)

licenses = Length[marketdata];
populationdata = Rationalize[marketdata[[All, 6]], rationals] / 1000 000;
pricedata = Rationalize[marketdata[[All, 3]], rationals] / 1000 000;
microwavedata = Rationalize[marketdata[[All, 10]], rationals];
microwavedata = microwavedata / 100;
householdover35thous = Rationalize[marketdata[[All, 8]], rationals];
winnerdata = marketdata[[All, 5]];
householdover35thouspopulationdata = householdover35thous populationdata;
```

```
(* SetDirectory["/Users/fox/Documents/Phones/FCC/Talks/SITE July 2004/Empirical"]; *)
btadistancesdio = Import["distancesmat_dio_perl_fixed.dat", "Table"];
btadistancesdio = Rationalize[btadistancesdio, rationals];
btadistancesdiomiles = btadistancesdio / 1.609;

packages = 2^licenses;
packagesamplenum = 250;
observations = bidders;
fcclimit = 98;

datalicensechoices = Table[Flatten@Position[winnerdata, i], {i, bidders}];
winningpackages = Select[datalicensechoices, # ≠ {} &];
uniquewinners =
  Flatten@Table[Flatten@Position[datalicensechoices, winningpackages[[p]] ],
  {p, 1, Length[winningpackages]}];
uniquewinnersnum = Length[uniquewinners];

(* extra stats - new this file *)

(* SetDirectory["/Users/fox/Documents/Phones/FCC/Talks/SITE July 2004/Empirical"]; *)
marketstats = Import["btastatsexport.csv", "CSV"];
marketstats[[1]];
marketstats = Delete[marketstats, 1];
densitydata = marketstats[[All, 8]];
```

- **BTA's to use**

(L2) In[43]:=

```

(* gets rid of BTAs with no Todd distance calculation *)

btastouse = Complement[Range[487], {14, 136, 221, 190, 192, 222, 254}];
btastousenum = Length[btastouse];

winningpackagesusableincnull = Table[Complement[winningpackages[[p]],
  Complement[Range[licenses], btastouse]], {p, uniquewinnersnum}];
winningpackagesusable = Select[Union[winningpackagesusableincnull], # ≠ {} &];
winningpackagesusablenum = Length[winningpackagesusable];
winningpackagesusablesizes
  = Table[Length[winningpackagesusable[[p]]], {p, winningpackagesusablenum}];

nouse = Complement[Range[licenses], btastouse];
winningpositions =
  Flatten[Table[Last[Position[winningpackagesusable, winningpackagesusable[[p]]]],
    {p, winningpackagesusablenum}]];
datalicensechoicesusable = Table[Complement[datalicensechoices[[i]], nouse],
  {i, observations}];

(* This creates an error, it is not so important *)
bidderpositions = Flatten@
  Table[If[Position[winningpackagesusable, datalicensechoicesusable[[i]]] ≠ {},
    Last[Position[winningpackagesusable, datalicensechoicesusable[[i]]]],
    {}], {i, observations}];

uniquewinnersusable =
  Flatten@Table[Flatten@Position[datalicensechoicesusable, winningpackagesusable[[p]]],
    {p, 1, winningpackagesusablenum}];
uniquewinnersusablenum = Length[uniquewinnersusable];

enclosingpackage =
  Table[Position[uniquewinnersusable, winnerdata[[btastouse[[b]]]]][[1, 1]],
    {b, btastousenum}];

```

■ Reverse lookup for BTAstouse

```
(L2) In[56]:= btatouselookupbta = Table[Module[{pos},
  pos = Position[btastouse, b]; If[pos == {}, {}, pos[[1, 1]]]], {b, licenses}];
```

■ Bidder Positions

Key to link up bidders to the dataset I just created

■ Read in Assset and Revenue Data

Note that these variables have all missing values set to zero.

Fix up "South Central Utah Telephone Association" eligibility data

```
(L2) In[57]:= (* SetDirectory[
  "/Users/fox/Documents/Phones/FCC/BTADATA/C Block Form 175s Ali Manning"]; *)
form175data = Import["fccform175nomiss.csv"];
assetsdata = form175data[[All, 2]] / 1000000 // N;
revenueedata = form175data[[All, 3]] / 1000000 // N;

bidderdata[[67, 4]] = form175data[[67, 4]];
eligibilitydata[[67]] = Rationalize[form175data[[67, 4]], rationals] / 1000000;
```

■ Read in synergy data

```
(L2) In[62]:= (* SetDirectory["/Users/fox/Documents/Phones/FCC/BTADATA/Pat_Package_2004_10_05"]; *)
geographicdistansematrix =
  Import["geographic distance population weighted centroid.csv"];
geographicdistansematrixkm = geographicdistansematrix / 1000;
airlinetravelmatrix = Import["air travel passengers bta year 1994.csv"];
tripsmatrix = Import["american travel survey 1995 zero.csv"];
adjacencymatrix = Import["adjacency bta.csv"];
```

■ Eligibility at each round & end of the auction

```
(L2) In[67]:= (* SetDirectory[
  "/Users/fox/Documents/Phones/FCC/BTADATA/Eligibility By Round Fox/"]; *)
eligibilitybyrounddata = Import["cblock eligibility round matrix 1.csv"];
eligibilitybyrounddata = Delete[eligibilitybyrounddata, 1];
eligibilitybyrounddata2 = Transpose[Delete[Transpose[eligibilitybyrounddata], 1]];
Dimensions[eligibilitybyrounddata2]
initialeligfromrounds = eligibilitybyrounddata2[[All, 1]];
finalelig = eligibilitybyrounddata2[[All, 181]];

(L2) Out[70]= {255, 181}
```

■ Look for errors in winners

```
(L2) In[73]:= dataCheckWinners =
  Table[{l, marketdata[[l, 2]], {marketdata[[l, 4]], {bidderdata[[marketdata[[l, 5]], 3]], marketdata[[l, 5]], bidderdata[[marketdata[[l, 5]], 1]]}, {l, 1, 493}}},
    Union[dataCheckWinners[[All, {3, 4}]]]
```

```
(L2) Out[74]= {{{21Centur}, {21st Century Telesis Joint Venture}}, {{AerForce}, {Aer Force Communications, L.P.}}, {{Alabama}, {Central Alabama Partnership L.P. 132}}, {{Alpine}, {Alpine PCS, Inc.}}, {{Americal}, {Americall International, L.L.C.}}, {{Anishnab}, {Anishnabe Communications Enterprise, Inc.}}, {{BDPCS}, {BDPCS, Inc.}}, {{BRK}, {BRK WIRELESS CO., INC.}}, {{Brooking}, {Brookings Municipal Utilities}}, {{Carolina}, {Carolina PCS I Limited Partnership}}, {{Cellutech}, {CELLUTECH}}, {{ChaseTel}, {Chase Telecommunications L.P.}}, {{Chillico}, {The Chillicothe Telephone Co.-Communications, Inc.}}, {{CHPCS}, {CH PCS, Inc.}}, {{Comtel}, {Comtel PCS Mainstreet Limited Partnership}}, {{ComVent}, {Communications Venture PCS Limited Partnership}}, {{CookWest}, {Cook Inlet Western Wireless PV/SS PCS, L.P.}}, {{DCR}, {DCR PCS, Inc.}}, {{Devon}, {Devon Mobile Communications, L.P.}}, {{Eldorado}, {Eldorado Communications, L.L.C.}}, {{Enterpri}, {Enterprise Communications Partnership}}, {{FAMS}, {FAMS & ASSOCIATES}}, {{Fortunet}, {Fortunet Wireless Communications, L.P.}}, {{Georgia}, {Georgia Independent PCS Corporation}}, {{Global}, {GLOBAL INFORMATION TECHNOLOGIES, INC.}}, {{GuestMar}, {Mark M. Guest}}, {{GWI}, {GWI PCS, Inc.}}, {{HighCnty}, {High Country Communications, L.P.}}, {{Indus}, {Indus, Inc.}}, {{Integrat}, {Integrated Communications Group Corporation}}, {{Kansas}, {Kansas Personal Communication Services, LTD}}, {{Kentucky}, {Third Kentucky Cellular Corporation}}, {{KMTel}, {KMTel L.L.C.}}, {{LongSt}, {Longstreet Communication International, Inc.}}, {{Loralen}, {LORALEN CORP.}}, {{MBO}, {MBO Wireless, Inc.}}, {{McBride}, {Vincent D. McBride}}, {{MCG}, {MCG PCS, Inc.}}, {{MercuryP}, {Mercury PCS, L.L.C.}}, {{Meretel}, {Meretel Communications, LP}}, {{MFRI}, {MFRI Inc.}}, {{Miccom}, {Miccom Associates, Ltd.}}, {{MountSol}, {Mountain Solutions, Ltd.}}, {{National}, {National Telecom Holdings, Inc.}}, {{NDakota}, {New Dakota Investment Trust}}, {{NEngldW}, {New England Wireless Communications, L.P.}}, {{NextWave}, {NextWave Personal Communications Inc.}}, {{NMich}, {Northern Michigan PCS Consortium L.L.C.}}, {{NoVERRPb}, {NOVERR PUBLISHING INC.}}, {{NWaveP}, {New Wave PCS, Inc.}}, {{Omnipoin}, {Omnipoint PCS Entrepreneurs, Inc.}}, {{OnQue}, {OnQue Communications, Inc.}}, {{PCS2000}, {PCS 2000, L.P.}}, {{PCSMob}, {PCS Mobile America, Inc.}}, {{PCSOne}, {PCS One, Inc.}}, {{PCSouth}, {PCSouth, Inc.}}, {{PCSPplus}, {PCS Plus, LLC An Arizona Limited Liability Company}}, {{PerComN}, {Personal Communications Network, Inc.}}, {{PokaLam}, {Poka Lambro PCS, Inc.}}, {{PokaWire}, {Poka Lambro/PVT Wireless Limited Partnership}}, {{Polycell}, {POLYCELL COMMUNICATIONS, INC.}}, {{PVTWire}, {PVT Wireless Limited Partnership}}, {{Quantum}, {Quantum Communications Group, Inc.}}, {{Reserve}, {Reserve Telephone Company, Inc.}}, {{RFW}, {R.F.W. Inc.}}, {{RLV}, {RLV-PCS I PARTNERSHIP}}, {{Roberts}, {ROBERTS-ROBERTS & ASSOCIATES, LLC}}, {{Rosas}, {Rosas, Inc.}}, {{R&S}, {R & S PCS, Inc.}}, {{RTCom}, {RT Communications, Inc.}}, {{Savannah}, {Savannah Independent PCS Corporation}}, {{SComSys}, {SOUTHERN COMMUNICATIONS SYSTEMS, INC.}}, {{SETel}, {SouthEast Telephone Limited Partnership, Ltd.}}, {{SEWire}, {Southeast Wireless Communications, L.P.}}, {{SOWega}, {SOWEGA Wireless Communications, L.P.}}, {{SWireles}, {Southern Wireless, L.P.}}, {{SWMinn}, {Southwest Minnesota PCS Limited Partnership}}, {{TriState}, {Mobile Tri-States L.P. 130}}, {{TWS}, {TWS, LLC}}, {{UrbanC}, {Urban Communicators PCS Limited Partnership}}, {{UsaMicro}, {USA Micro-Cellular, Inc.}}, {{Virginia}, {Virginia PCS Alliance Consortium}}, {{Windkeep}, {Windkeeper Communications, Inc.}}, {{Wire2000}, {Wireless 2000, Inc.}}, {{WirePCS}, {Wireless PCS, Inc.}}, {{WireTelC}, {WIRELESS TELECOM, INC.}}, {{WireVent}, {WIRELESS VENTURES, INC.}}, {{WMinn}, {Western Minnesota PCS Limited Partnership}}}
```

Matching with prices data

All pairwise combinations of one license each, in continental United States

■ Package combinations

Different winning packages

■ License swaps

```
(L2) In[75]:= combinationsoflicensesPreRobust = Permutations[btastouse, {2}];
licenseswapsonewayPreRobust = Select[combinationsoflicensesPreRobust,
    enclosingpackage[[btatouselookupbta[[#[[1]]]]]] != 
    enclosingpackage[[btatouselookupbta[[#[[2]]]]]] ] & ;
licenseswapsonewaynumPreRobust = Length[licenseswapsonewayPreRobust];
```

■ Resulting packages

Take away license 1 and add license 2

```
(L2) In[78]:= packageesswapsonewayPreRobust =
Table[Union[Complement[winningpackagesusable[[enclosingpackage[[
    btatouselookupbta[[licenseswapsonewayPreRobust[[1, 1]]]]]]], {
    licenseswapsonewayPreRobust[[1, 1]]}, {licenseswapsonewayPreRobust[[1, 2]]}], {
    1, licenseswapsonewaynumPreRobust}];
```

■ Winners for swaps

Who was the winner of the original package that license 2 is being added to?

```
(L2) In[79]:= packages1swapwinnerpackPreRobust =
ToPackedArray[Table[enclosingpackage[[btatouselookupbta[[[
    licenseswapsonewayPreRobust[[1, 1]]]]]], {1, licenseswapsonewaynumPreRobust}];
```

■ New for the robustness check: pop of package must be under bidder initial eligibility

■ Key inputs for the calculations

```
(L2) In[80]:= eligibilitydatareal = N[eligibilitydata] / Total[populationdata[[btastouse]] // N];
populationdatareal = N[populationdata] / Total[populationdata[[btastouse]]];
```

■ Population of the new packages

```
(L2) In[82]:= pack1waypopPreRobust =
ToPackedArray[Table[Total[populationdatareal[[packageesswapsonewayPreRobust[[1]]]]], {
    1, licenseswapsonewaynumPreRobust}]];
```

- Compare to eligibility

```
(L2) In[83]:= popLessThanEligPreRobust = Table[
    pack1waypopPreRobust[[1]] <= eligibilitydatareal[[packages1swapwinnerpackPreRobust[[1]]]],
    {1, licensesswapsonewaynumPreRobust}];
Tally[popLessThanEligPreRobust]
(L2) Out[84]= {{True, 73409}, {False, 148975}}
```

- Redo key variables

```
(L2) In[85]:= licensesswapsoneway =
    ToPackedArray[Pick[licensesswapsonewayPreRobust, popLessThanEligPreRobust]];
licensesswapsonewaynum = Length[licensesswapsoneway];
packagesswapsoneway =
    ToPackedArray[Pick[packagesswapsonewayPreRobust, popLessThanEligPreRobust]];
packages1swapwinnerpack = ToPackedArray[
    Pick[packages1swapwinnerpackPreRobust, popLessThanEligPreRobust]];
(L2) Out[85]= 73409
```

- License adds and subtracts (no robustness yet)

- Combinations of one license and one winning package

From different winners

```
(L2) In[88]:= combinationspackageslicenses = Tuples[{Range[winningpackagesusablenum], btastouse}];
combinationspackageslicensesdiffpack = Select[combinationspackageslicenses,
    #[[1]] ≠ enclosingpackage[[btatouselookupbta[[#[[2]]]]]] &];
combinationspackageslicensesdiffpacknum = Length[combinationspackageslicensesdiffpack]
(L2) Out[90]= 40320
```

- Resulting packages, for adds and subtracts

```
(L2) In[91]:= packagesadds =
    Table[Union[winningpackagesusable[[combinationspackageslicensesdiffpack[[1, 1]]]],
    {combinationspackageslicensesdiffpack[[1, 2]]}], {1, combinationspackageslicensesdiffpacknum}];
packagesaddsnum = combinationspackageslicensesdiffpacknum;
packagessubtracts =
    Table[Complement[winningpackagesusable[[enclosingpackage[[b]]]], {btastouse[[b]]}],
    {b, btastousenum}];
```

- Winning packages link for comparison

```
(L2) In[94]:= winnerpack1add = combinationspackageslicensesdiffpack[[All, 1]];
winnerpack1sub = enclosingpackage;
```

- Pop, price, pop*eligibility & density*pop

- Population

```
(L2) In[96]:= pack1waypop =
  ToPackedArray[ Table [ Total[ populationdatareal[[packagesswapsoneway[[1]] ]], {1, licenseswapsonewaynum} ] ];
packwinpop = Table [ Total[ populationdatareal[[winningpackagesusable[[1]] ]], {1, winningpackagesusablenum} ];
pack1diffpop = packwinpop[[packages1swapwinnerpack]] - pack1waypop;

packladdpop = ToPackedArray[
  Table [ Total[ populationdatareal[[packagesadds[[1]] ]], {1, packagesaddsnum} ] ];
pack1subpop = ToPackedArray[ Table [
  Total[ populationdatareal[[packagegsubtracts[[1]] ]], {1, btastousenum} ] ];

packladdirpop = packwinpop[[winnerpack1add]] - packladdpop;
pack1subdirpop = packwinpop[[winnerpack1sub]] - pack1subpop;
```

- Price

```
(L2) In[103]:= pricedatareal = N[pricedata];
pack1wayprice = ToPackedArray[ Table [
  Total[ pricedatareal[[packagesswapsoneway[[1]] ]], {1, licenseswapsonewaynum} ] ];
packwinprice = Table [ Total[ pricedatareal[[winningpackagesusable[[1]] ]], {1, winningpackagesusablenum} ];
pack1diffprice = packwinprice[[packages1swapwinnerpack]] - pack1wayprice;

packladdprice = ToPackedArray[
  Table [ Total[ pricedatareal[[packagesadds[[1]] ]], {1, packagesaddsnum} ] ];
pack1subprice = ToPackedArray[ Table [ Total[ pricedatareal[[packagegsubtracts[[1]] ]], {1, btastousenum} ] ];

packladdirprice = packwinprice[[winnerpack1add]] - packladdprice;
pack1subdirprice = packwinprice[[winnerpack1sub]] - pack1subprice;
```

- Pop*eligibility

Note, eligibility applies to all of US, not just continental US

```
(L2) In[111]:= pack1wayelig = ToPackedArray[
  Table [ eligibilitydatareal[[ uniquewinnersusable[[packages1swapwinnerpack[[1]]]]]], {1, licenseswapsonewaynum}]];
pack1waypoptimeselig = pack1waypop pack1wayelig;

packwinelig = ToPackedArray[ Table [
  eligibilitydatareal[[ uniquewinnersusable[[enclosingpackage[[btatouselookupbta[[ winningpackagesusable[[1,1]]]]]]]], {1, winningpackagesusablenum}]];
packwinpoptimeselig = packwinpop packwinelig;

pack1diffpoptimeselig =
  packwinpoptimeselig[[packages1swapwinnerpack]] - pack1waypoptimeselig;

packladddelig = ToPackedArray[ Table [ eligibilitydatareal[[uniquewinnersusable[[ combinationspackageslicensesdiffpack[[1,1]]]]]], {1, packagesaddsnum}]];
packladdpoptimeselig = packladdpop packladddelig;

pack1subelig = ToPackedArray[
  Table [ eligibilitydatareal[[ marketdata[[ btastouse[[1]], 5]]]], {1, btastousenum}]];
pack1subpoptimeselig = pack1subpop pack1subelig;

packladdirdiffpoptimeselig = packwinpoptimeselig[[winnerpackladd]] - packladdpoptimeselig;
pack1subdirdiffpoptimeselig = packwinpoptimeselig[[winnerpack1sub]] - pack1subpoptimeselig;
```

■ Sum (density license * pop license)

```
(L2) In[122]:= densityreal = N[densitydata];
pack1waydensitypop =
  ToPackedArray[ Table [ Total[ populationdatareal[[packagesswapsoneway[[1]]]] densityreal[[packagesswapsoneway[[1]]]]], {1, licenseswapsonewaynum}]];

packwindensitypop =
  ToPackedArray[ Table [ Total[ populationdatareal[[winningpackagesusable[[1]]]] densityreal[[winningpackagesusable[[1]]]]], {1, winningpackagesusablenum}]];

pack1diffdensitypop = packwindensitypop[[packages1swapwinnerpack]] - pack1waydensitypop;

packladdirdensitypop = ToPackedArray[ Table [
  Total[ populationdatareal[[packagesadds[[1]]]] densityreal[[packagesadds[[1]]]]], {1, packagesaddsnum}]];
pack1subdensitypop = ToPackedArray[ Table [
  Total[ populationdatareal[[packagessubtracts[[1]]]] densityreal[[packagessubtracts[[1]]]]], {1, btastousenum}];

packladdirdiffdensitypop = packwindensitypop[[winnerpackladd]] - packladdirdensitypop;
pack1subdirdiffdensitypop = packwindensitypop[[winnerpack1sub]] - pack1subdensitypop;
```

■ Geographic synergies

■ Gravity equation and geographic distance

Do not want to divide by zero, so set 0 distances to 10^10 to effectively zero out

Also, make population in 10,000's so that the numbers will come out nicely

Scale of distance function

Divide by maximum synergies for the licenses in a package

We take the power of distances to focus only on local comparisons

Package 80 is GWI/MetroPCS, it is only in Miami, Atlanta, San Francisco

```
(L2) In[130]:= geodistpower = 2
btadistancesdiomilestenforown =
(btadistancesdiomiles + DiagonalMatrix[Diagonal[btadistancesdiomiles] + 10.^10]) ^
geodistpower;
(L2) Out[130]=
2
(L2) In[132]:=
```

■ Gravity equations

(L2) In[133]:=

```

populationdatarealtimes100 = populationdatareal 100;

pack1waygeodist =
ToPackedArray[Table[ Total[populationdatareal[[packageSSwapsoneway[[1]]]]]
Total[Transpose[KroneckerProduct[populationdatarealtimes100[[ packageSSwapsoneway[[1]]]], populationdatarealtimes100[[ packageSSwapsoneway[[1]]]]]] / btadistancesdiomilestenforown[[ packageSSwapsoneway[[1]]], packageSSwapsoneway[[1]]]] ] /
Total[Transpose[KroneckerProduct[populationdatarealtimes100[[ packageSSwapsoneway[[1]]]], populationdatarealtimes100[[btastouse ]]]] /
btadistancesdiomilestenforown[[ packageSSwapsoneway[[1]], btastouse ]]] ] ] /
Total[populationdatareal[[packageSSwapsoneway[[1]]]]], {1,
licenseswapsonewaynum}];

packwingeodist = ToPackedArray[
Table[ Total[populationdatareal[[winningpackagesusable[[1]]]]] Total[Transpose[
KroneckerProduct[populationdatarealtimes100[[winningpackagesusable[[1]]]]] /
populationdatarealtimes100[[winningpackagesusable[[1]]]]] ] / btadistancesdiomilestenforown[[winningpackagesusable[[1]]], winningpackagesusable[[1]]]] ] / Total[Transpose[
KroneckerProduct[populationdatarealtimes100[[winningpackagesusable[[1]]]]], populationdatarealtimes100[[btastouse ]]]] / btadistancesdiomilestenforown[[winningpackagesusable[[1]], btastouse ]]] ] ] /
Total[populationdatareal[[winningpackagesusable[[1]]]]], {1, winningpackagesusablenum}];

pack1diffgeodist = packwingeodist[[packages1swapwinnerpack]] - pack1waygeodist;

packladdgeodist =
ToPackedArray[Table[ Total[populationdatareal[[packagesadds[[1]]]]] Total[
Transpose[KroneckerProduct[populationdatarealtimes100[[packagesadds[[1]]]]], populationdatarealtimes100[[packagesadds[[1]]]]] / btadistancesdiomilestenforown[[packagesadds[[1]], packagesadds[[1]]]]] ] /
Total[Transpose[KroneckerProduct[populationdatarealtimes100[[ packagesadds[[1]]]], populationdatarealtimes100[[btastouse ]]]] / btadistancesdiomilestenforown[[packagesadds[[1]], btastouse ]]] ] ] ] /
Total[populationdatareal[[packagesadds[[1]]]]], {1, packagesaddsnum}];

(* note quiet shuts down division by 0 errors from empty sets,
remember to check here *)

```

```

pack1subgeodistpre =
Quiet[ToPackedArray[
Table[ Total[ populationdatareal[[packagessubtracts[[1]]]] Total[Transpose[
KroneckerProduct[ populationdatarealtimes100[[packagessubtracts[[1]]]], 
populationdatarealtimes100[[packagessubtracts[[1]]]] ] / 
btadistancesdiomilestenforown[[ packagessubtracts[[1]], 
packagessubtracts[[1]] ] ] / 
Total[ Transpose[ KroneckerProduct[ populationdatarealtimes100[[ 
packagessubtracts[[1]]]], populationdatarealtimes100[[btastouse ]]] ] / 
btadistancesdiomilestenforown[[ packagessubtracts[[1]], btastouse ]]] ] ] / 
Total[populationdatareal[[packagessubtracts[[1]]]]], {1,
btastousenum}]];
pack1subgeodist = pack1subgeodistpre /. Indeterminate → 0.0;

pack1laddirgeodist = packwingeodist[[winnerpack1ladd]] - pack1laddirgeodist;
pack1subdirgeodist = packwingeodist[[winnerpack1sub]] - pack1subgeodist;

```

- Airline travel synergies

Not fixed to not decrease when adding licenses

```
(L2) In[142]:= airlinetravelmatrixreal = ToPackedArray[N[airlinetravelmatrix] + 0.00000001];

pack1wayairtrav =
ToPackedArray[Monitor[Table[Total[populationdatareal[[packageesswapsoneway[[1]]]]]
Total[Transpose[airlinetravelmatrixreal[[packageesswapsoneway[[1]], packageesswapsoneway[[1]]]]]] / Total[Transpose[
airlinetravelmatrixreal[[packageesswapsoneway[[1]], btastouse]]]] ] /
Total[populationdatareal[[packageesswapsoneway[[1]]]]], {1, licensespawsonewaynum}], 1]];

packwinairtrav =
ToPackedArray[Table[Total[populationdatareal[[winningpackagesusable[[1]]]]]
Total[Transpose[airlinetravelmatrixreal[[winningpackagesusable[[1]], winningpackagesusable[[1]]]]]] / Total[Transpose[
airlinetravelmatrixreal[[winningpackagesusable[[1]], btastouse]]]] ] /
Total[populationdatareal[[winningpackagesusable[[1]]]]], {1, winningpackagesusablenum}]]];

pack1diffairtrav = packwinairtrav[[packages1swapwinnerpack]] - pack1wayairtrav;

packladdairtrav =
ToPackedArray[Table[Total[populationdatareal[[packagesadds[[1]]]]] Total[
Transpose[airlinetravelmatrixreal[[packagesadds[[1]], packagesadds[[1]]]]]]] / Total[Transpose[airlinetravelmatrixreal[[packagesadds[[1]], btastouse]]]] ] /
Total[populationdatareal[[packagesadds[[1]]]]], {1, packagesaddsnum}]]];

(* quiet shuts off errors about transposes for empty packages*)

pack1subairtravpre =
Quiet[ToPackedArray[Table[Total[populationdatareal[[packageessubtracts[[1]]]]]
Total[Transpose[airlinetravelmatrixreal[[packageessubtracts[[1]], packageessubtracts[[1]]]]]] / Total[
Transpose[airlinetravelmatrixreal[[packageessubtracts[[1]], btastouse]]]] ] / Total[populationdatareal[[packageessubtracts[[1]]]]], {1, btastousenum}]]];

pack1subairtrav = pack1subairtravpre /. Indeterminate → 0.0;

packladdirtrav = packwinairtrav[[winnerpackladd]] - packladdairtrav;
pack1subdirtrav = packwinairtrav[[winnerpack1sub]] - pack1subairtrav;
```

■ ATS travel survey synergies

Not fixed to not decrease when adding licenses

```
(L2) In[151]:= tripsmatrixreal = ToPackedArray[ N[tripsmatrix] + 0.00000001 ] ;

pack1wayatstrav = ToPackedArray[
  Monitor[ Table[ Total[ populationdatareal[[packagesswapsoneway[[1]]]] Total[Transpose[
    tripsmatrixreal[[packagesswapsoneway[[1]]], packagesswapsoneway[[1]]]] ] ] / 
    Total[Transpose[tripsmatrixreal[[packagesswapsoneway[[1]], btastouse ]]] ] ] / 
    Total[populationdatareal[[packagesswapsoneway[[1]]]]], {1, licenseswapsonewaynum} ] , 1] ] ;

packwinatstrav =
  ToPackedArray[Table[ Total[ populationdatareal[[winningpackagesusable[[1]]]] ]
    Total[Transpose[tripsmatrixreal[[winningpackagesusable[[1]]], winningpackagesusable[[1]]]] ] / 
    Total[Transpose[tripsmatrixreal[[winningpackagesusable[[1]], btastouse ]]] ] ] / 
    Total[populationdatareal[[winningpackagesusable[[1]]]]], {1, winningpackagesusablenum} ] ] ;

pack1ldiffatstrav = packwinatstrav[[packages1swapwinnerpack]] - pack1wayatstrav;

packladdatstrav = ToPackedArray[Table[ Total[ populationdatareal[[packagesadds[[1]]]] ]
  Total[Transpose[tripsmatrixreal[[packagesadds[[1]], packagesadds[[1]]]] ] ] / 
  Total[Transpose[tripsmatrixreal[[packagesadds[[1]], btastouse ]]] ] ] / 
  Total[populationdatareal[[packagesadds[[1]]]]], {1, packagesaddsnum} ] ] ;

pack1subatstravpre = Quiet[ToPackedArray[
  Table[ Total[ populationdatareal[[packagessubtracts[[1]]]] Total[Transpose[
    tripsmatrixreal[[packagessubtracts[[1]], packagessubtracts[[1]]]] ] ] / 
    Total[Transpose[tripsmatrixreal[[packagessubtracts[[1]], btastouse ]]] ] ] / 
    Total[populationdatareal[[packagessubtracts[[1]]]]], {1, btastousenum} ] ] ];

pack1subatstrav = pack1subatstravpre /. Indeterminate → 0.0;

packladdirdiffatstrav = packwinatstrav[[winnerpack1ladd]] - packladdatstrav;
pack1subdiffatstrav = packwinatstrav[[winnerpack1sub]] - pack1subatstrav;
```

■ Eligibility * geographic distance

```
(L2) In[160]:= packwingeodistelig = packwingeodist packwinelig;

pack1diffgeodistelig = ToPackedArray[ pack1diffgeodist pack1wayelig ];

packaddgeodistelig = packladdgeodist pack1laddelig;
packsubgeodistelig = pack1subgeodist pack1subelig;

packladdirdiffgeodistelig = packwingeodistelig[[winnerpack1ladd]] - packaddgeodistelig;
pack1subdiffgeodistelig = packwingeodistelig[[winnerpack1sub]] - packsubgeodistelig;
```

- Pop * complementarities

- Pop * geographic distance

```
(L2) In[166]:= packwingeodistpop = packwingeodist packwinpop;
pack1ldiffgeodistpop = ToPackedArray[ pack1ldiffgeodist pack1waypop ];
packaddgeodistpop = packladdgeodist packladdpop;
packsubgeodistpop = pack1subgeodist pack1subpop;
packladdirgeodistpop = packwingeodistpop[[winnerpackladd]] - packaddgeodistpop;
pack1subdirgeodistpop = packwingeodistpop[[winnerpack1sub]] - packsubgeodistpop;
```

- Pop * air travel

```
(L2) In[172]:= packwinairtravpop = packwinairtrav packwinpop;
pack1ldiffairtravpop = ToPackedArray[ pack1ldiffairtrav pack1waypop ];
packaddirtravpop = packladdirtrav packladdirpop;
packsubairtravpop = pack1subairtrav pack1subpop;
packladdirgeodistpop = packwinairtravpop[[winnerpackladd]] - packaddirtravpop;
pack1subdirgeodistpop = packwinairtravpop[[winnerpack1sub]] - packsubairtravpop;
```

- Pop * ATS

```
(L2) In[178]:= packwinatstravpop = packwinatstrav packwinpop;
pack1ldiffatstravpop = ToPackedArray[ pack1ldiffatstrav pack1waypop ];
packaddirstravpop = packladdirstrav packladdirpop;
packsubatstravpop = pack1subatstrav pack1subpop;
packladdirgeodistpop = packwinatstravpop[[winnerpackladd]] - packaddirstravpop;
pack1subdirgeodistpop = packwinatstravpop[[winnerpack1sub]] - packsubatstravpop;
```

- Put variables into toolkit data array

- 1 way swaps

```
(L2) In[184]:= dataArray1way = ToPackedArray[ {pack1ldiffprice, pack1ldiffpop, pack1ldiffpoptimeselig,
pack1ldiffdensitypop, pack1ldiffgeodist, pack1ldiffgeodistelig, pack1ldiffairtrav,
pack1ldiffatstrav, pack1ldiffgeodistpop, pack1ldiffairtravpop, pack1ldiffatstravpop} ];
ByteCount[dataarray1way] / 1024.^2
(L2) Out[185]=
6.16085
```

■ 1 license adds

```
(L2) In[186]:= dataarrayladd =
  ToPackedArray[ {pack1laddirprice, pack1laddirpop, pack1laddirpoptimeselig,
    pack1laddirdensitypop, pack1laddirgeodist, pack1laddirgeodistelig,
    pack1laddirfairtrav, pack1laddirfatstrav, pack1laddirgeodistpop,
    pack1laddirfairtravpop, pack1laddirfatstravpop} ];
  ByteCount[dataarrayladd] / 1024.^2
(L2) Out[187]=
  3.38391
```

■ 1 license subtractions

```
(L2) In[188]:= dataarraylsub =
  ToPackedArray[ {pack1subdirprice, pack1subdirpop, pack1subdirpoptimeselig,
    pack1subdirdensitypop, pack1subdirgeodist, pack1subdirgeodistelig,
    pack1subdirfairtrav, pack1subdirfatstrav, pack1subdirgeodistpop,
    pack1subdirfairtravpop, pack1subdirfatstravpop} ];
  ByteCount[dataarraylsub] / 1024.^2
(L2) Out[189]=
  0.0404053
```

■ Toolkit map format

```
(L2) In[190]:= datamaplway = ToPackedArray[
  Table[ {enclosingpackage[[btatouselookupbta[[ licenseswapsoneway[[1, 1]] ]]]], ,
    enclosingpackage[[btatouselookupbta[[ licenseswapsoneway[[1, 2]] ]]]]}, ,
  {1, licenseswapsonewaynum}]];
(L2) In[191]:= datamapladd = ToPackedArray[ Table[
  {combinationspackageslicensesdiffpack[[1, 1]], enclosingpackage[[btatouselookupbta[[ combinationspackageslicensesdiffpack[[1, 2]] ]]]]}, , {1, packagesaddsnum}]];
datamaplsub = ToPackedArray[
  Table[ {enclosingpackage[[1]], enclosingpackage[[1]]}, , {1, btastousenum}]];
```

■ Combine all into one

```
(L2) In[193]:= dataarraylall = Join[ dataarraylway, dataarrayladd, dataarraylsub, 2];
  datamaplall = Join[ datamaplway, datamapladd, datamaplsub];
  ByteCount[dataarraylall] / 1024.^2
(L2) Out[195]=
  9.58492
```

■ Export

```
(L2) In[196]:= SetDirectory[NotebookDirectory[]];
  SetDirectory["DataEst"];
  Export["dataarraylwayadd.csv", dataarraylall];
  Save["dataarraylwayadd.math", dataarraylall];
  Export["datamaplwayadd.csv", datamaplall];
  Save["datamaplwayadd.math", datamaplall];
```

■ Mean of variables

```
(L2) In[202]:= Mean[Transpose[dataArray1all] ]
StandardDeviation[Transpose[dataArray1all] ]

(L2) Out[202]=
{-11.9982, -0.00110618, -0.000036207, -2.04555, 0.0142385, 0.000460133,
-0.0000524807, 0.0009238, 0.0000903197, -0.0000113037, -0.000011071}

(L2) Out[203]=
{51.1588, 0.00392584, 0.00044981, 18.5099, 0.0235929, 0.00167346,
0.00379413, 0.00998141, 0.000481924, 0.000393824, 0.000491012}
```

■ Swaps

```
(L2) In[204]:= Mean[Transpose[dataArray1way] ]
StandardDeviation[Transpose[dataArray1way] ]

(L2) Out[204]=
{-7.50394, -0.00059033, -0.000016974, -1.07839, 0.0182793, 0.000532964,
0.000247533, 0.00178206, 0.000149769, -6.41669 × 10-7, 0.000016208}

(L2) Out[205]=
{35.4209, 0.00272618, 0.00020951, 9.81269, 0.0258036, 0.00124011,
0.00361362, 0.00932549, 0.000364858, 0.0000630112, 0.000161651}
```

■ Adds, subs

Difference between adds and subs arises from weighting all licenses equally (subs) or weighting all packages equally (adds)

```
(L2) In[206]:= Mean[Transpose[dataArray1add] ]
StandardDeviation[Transpose[dataArray1add] ]

(L2) Out[206]=
{-20.5685, -0.00208333, -0.0000814296, -3.87693, 0.00687917, 0.000305282,
-0.000632615, -0.000704632, -0.0000332225, -0.0000406267, -0.0000737074}

(L2) Out[207]=
{70.3386, 0.00531308, 0.000581435, 27.9361, 0.0164875,
0.00207612, 0.00395391, 0.0107026, 0.000437504, 0.000521276, 0.00065305}

(L2) In[208]:= Mean[Transpose[dataArray1sub] ]
StandardDeviation[Transpose[dataArray1sub] ]

(L2) Out[208]=
{20.5685, 0.00208333, 0.000821077, 3.87693, 0.0144353,
0.00232908, 0.00279607, 0.00645397, 0.00137598, 0.000821232, 0.00107845}

(L2) Out[209]=
{70.4111, 0.00531856, 0.00347746, 27.9649, 0.0270855,
0.00793054, 0.00805728, 0.0204561, 0.00392173, 0.00356578, 0.00399345}
```

■ Winning packages

```
(L2) In[210]:= packindataarrayall = {packwinprice, packwinpop, packwinoptimeselig,
packwindensitypop, packwingeodist, packwingeodistelig, packwinairtrav,
packwinatstrav, packwingeodistpop, packwinairtravpop, packwinatstravpop};
```

```
(L2) In[211]:= Mean[Transpose[packindataarrayall]]
StandardDeviation[Transpose[packindataarrayall]]
Map[Max, packindataarrayall]
Map[Min, packindataarrayall]

(L2) Out[211]= {116.152, 0.0117647, 0.00463667, 21.8933, 0.0677183,
0.0118288, 0.0147153, 0.0318486, 0.00388512, 0.00232106, 0.00315061}

(L2) Out[212]= {496.128, 0.0442504, 0.0299441, 124.931, 0.111326,
0.0476612, 0.0511259, 0.0778808, 0.020581, 0.0165767, 0.0201134}

(L2) Out[213]= {4200.77, 0.379645, 0.270545, 1111.52, 0.478555,
0.341031, 0.395683, 0.48049, 0.181681, 0.150219, 0.182415}

(L2) Out[214]= {0.102375, 0.000111362, 1.24014 × 10-8, 0.00259376, 1.18107 × 10-19, 1.21002 × 10-22,
3.37919 × 10-15, 1.37552 × 10-11, 4.57553 × 10-23, 2.39575 × 10-17, 9.75203 × 10-14}
```

Data for matches only estimator

- No need to recreate data, use indices into data for prices

```
(L2) In[215]:= licenseswapstwowayPreRobust =
ToPackedArray[Select[licenseswapsoneway, #[[1]] < #[[2]] & ];
licenseswapstwowaynumPreRobust = Length[licenseswapstwowayPreRobust];
```

- From 2 way list, find 1 way records that correspond

Some may be 0 entries in licenseswapstwowaydatapos because of eligibility robustness

```
(L2) In[217]:= licenseswapstwowaydataposmatPreRobust = ToPackedArray[Table[0, {licenses}, {licenses}]];
Do[
licenseswapstwowaydataposmatPreRobust[[licenseswapsoneway[[1, 1]], licenseswapsoneway[[1, 2]]]] = 1;
,{1, licenseswapsonewaynum}]
licenseswapstwowaydataposPreRobust =
Table[{licenseswapstwowaydataposmatPreRobust[[licenseswapstwowayPreRobust[[1, 1]],
licenseswapstwowayPreRobust[[1, 2]]]], licenseswapstwowaydataposmatPreRobust[[licenseswapstwowayPreRobust[[1, 2]], licenseswapstwowayPreRobust[[1, 1]]]]},
{1, licenseswapstwowaynumPreRobust}];
```

- Delete the 0 entries because of eligibility robustness

```
(L2) In[220]:= isAnyOneWayMissingPreRobust = Table[ licenseswapstwowaydataposPreRobust[[1, 1]] ≠ 0 && 
    licenseswapstwowaydataposPreRobust[[1, 2]] ≠ 0, {1, licenseswapstwowaynumPreRobust}]; 
Tally[isAnyOneWayMissingPreRobust]

licenseswapstwoway = Pick[licenseswapstwowayPreRobust, isAnyOneWayMissingPreRobust];
licenseswapstwowaynum = Length[licenseswapstwoway]
licenseswapstwowaydatapos =
    Pick[licenseswapstwowaydataposPreRobust, isAnyOneWayMissingPreRobust];

(L2) Out[221]=
{{True, 13428}, {False, 21531}}
```

```
(L2) Out[223]=
13428
```

- For additions, find corresponding subtraction

```
(L2) In[225]:= addstosubstracts =
Table[btatouselookupbta[[combinationspackageslicensesdiffpack[[1, 2]]]], 
{1, combinationspackageslicensesdiffpacknum}];
```

- Create data from data for 1 way swap inequalities

```
(L2) In[226]:= pack2diffprice = pack1diffprice[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffprice[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffpop = pack1diffpop[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffpop[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffoptimeselig = pack1diffoptimeselig[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffoptimeselig[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffdensitypop = pack1diffdensitypop[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffdensitypop[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffgeodist = pack1diffgeodist[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffgeodist[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffgeodistelig = pack1diffgeodistelig[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffgeodistelig[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffairtrav = pack1diffairtrav[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffairtrav[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffatstrav = pack1diffatstrav[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffatstrav[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffgeodistpop = pack1diffgeodistpop[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffgeodistpop[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffairtravpop = pack1diffairtravpop[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffairtravpop[[licenseswapstwowaydatapos[[All, 2]]]];
pack2diffatstravpop = pack1diffatstravpop[[licenseswapstwowaydatapos[[All, 1]]]] + 
    pack1diffatstravpop[[licenseswapstwowaydatapos[[All, 2]]]];
```

- Data for adds and subtracts

```
(L2) In[237]:= pack2adddiffprice = pack1adddiffprice + pack1subdiffprice[[ addstosubtracts ]];
pack2adddiffpop = pack1adddiffpop + pack1subdiffpop[[ addstosubtracts ]];
pack2adddiffpoptimeselig =
    pack1adddiffpoptimeselig + pack1subdiffpoptimeselig[[ addstosubtracts ]];
pack2adddiffdensitypop = pack1adddiffdensitypop +
    pack1subdiffdensitypop[[ addstosubtracts ]];
pack2adddiffgeodist = pack1adddiffgeodist + pack1subdiffgeodist[[ addstosubtracts ]];
pack2adddiffgeodistelig =
    pack1adddiffgeodistelig + pack1subdiffgeodistelig[[ addstosubtracts ]];
pack2adddiffairtrav = pack1adddiffairtrav + pack1subdiffairtrav[[ addstosubtracts ]];
pack2adddiffatstrav = pack1adddiffatstrav + pack1subdiffatstrav[[ addstosubtracts ]];
pack2adddiffgeodistpop =
    pack1adddiffgeodistpop + pack1subdiffgeodistpop[[ addstosubtracts ]];
pack2adddiffairtravpop = pack1adddiffairtravpop +
    pack1subdiffairtravpop[[ addstosubtracts ]];
pack2adddiffatstravpop = pack1adddiffatstravpop +
    pack1subdiffatstravpop[[ addstosubtracts ]];
```

- Put 2 way variables into toolkit data array

- Swaps

```
(L2) In[248]:= dataArray2way = ToPackedArray[ {pack2diffprice, pack2diffpop, pack2diffpoptimeselig,
    pack2diffdensitypop, pack2diffgeodist, pack2diffgeodistelig, pack2diffairtrav,
    pack2diffatstrav, pack2diffgeodistpop, pack2diffairtravpop, pack2diffatstravpop} ];
ByteCount[dataarray2way] / 1024.^2
(L2) Out[249]=
1.12704
```

- Adds

```
(L2) In[250]:= dataArray2add =
ToPackedArray[ {pack2adddiffprice, pack2adddiffpop, pack2adddiffpoptimeselig,
    pack2adddiffdensitypop, pack2adddiffgeodist, pack2adddiffgeodistelig,
    pack2adddiffairtrav, pack2adddiffatstrav, pack2adddiffgeodistpop,
    pack2adddiffairtravpop, pack2adddiffatstravpop} ];
ByteCount[dataarray2add] / 1024.^2
(L2) Out[251]=
3.38391
```

- Toolkit map format

- Swaps

Data map in terms of winning packages

```
(L2) In[252]:= datamap2way = ToPackedArray[
Table[ {enclosingpackage[[btatouselookupbta[[ licenseswapstwoway[[1, 1]] ]]]],
    enclosingpackage[[btatouselookupbta[[ licenseswapstwoway[[1, 2]] ]]]]}, ,
{1, licenseswapstwowaynum} ]];
```

Terms of winning licenses

```
(L2) In[253]:= datamap2waylic = ToPackedArray[licenseswapstwoway];
```

■ Adds

Winning packages

```
(L2) In[254]:= datamap2add = datamapladd;
```

Winning licenses

```
(L2) In[255]:= datamap2addlic = Transpose[{combinationspackageslicensesdiffpack[[All, 2]], combinationspackageslicensesdiffpack[[All, 2]]}];
```

■ Combine adds and swaps

```
(L2) In[256]:= dataarray2all = Join[dataarray2way, dataarray2add, 2];
datamap2all = Join[datamap2way, datamap2add];
```

■ Export

```
(L2) In[258]:= SetDirectory[NotebookDirectory[]];
SetDirectory["DataEst"];
Export["dataarray2wayadd.csv", dataarray2all];
Save["dataarray2wayadd.math", dataarray2all];

Export["datamap2wayadd.csv", datamap2all];
Save["datamap2wayadd.math", datamap2all];
```

■ Mean of variables

Keep in mind adds weight by package, more or less, while swaps weight by licenses
So adds overweight small packages compared to swaps

```
(L2) In[264]:= Mean[Transpose[dataarray2way]];
StandardDeviation[Transpose[dataarray2way]];

(L2) Out[264]=
{-1.82167 \times 10^{-15}, 5.72364 \times 10^{-19}, 8.61364 \times 10^{-6}, -1.52644 \times 10^{-17}, 0.0313777,
0.000775067, 0.000310215, 0.0025149, 0.000190179, 9.03657 \times 10^{-7}, 0.0000226012}
```

```
(L2) Out[265]=
{5.12596 \times 10^{-15}, 1.29898 \times 10^{-18}, 0.0000527769, 5.56963 \times 10^{-16}, 0.0344062,
0.00132065, 0.00148725, 0.0109254, 0.000264713, 0.0000112302, 0.000095513}
```

```
(L2) In[266]:= Mean[Transpose[dataarray2add]];
StandardDeviation[Transpose[dataarray2add]];

(L2) Out[266]=
{3.97325 \times 10^{-14}, 3.86828 \times 10^{-19}, 0.000739647, -1.6815 \times 10^{-14}, 0.0213145,
0.00263436, 0.00216345, 0.00574934, 0.00134276, 0.000780605, 0.00100475}

(L2) Out[267]=
{1.59101 \times 10^{-13}, 8.95295 \times 10^{-18}, 0.00333922, 6.30628 \times 10^{-14}, 0.0330628,
0.00834356, 0.00873037, 0.0223327, 0.00389062, 0.00352698, 0.00364012}
```

```
(L2) In[268]:= Mean[Transpose[dataarray2all]]
StandardDeviation[Transpose[dataarray2all]]

(L2) Out[268]=
{2.93509 × 10-14, 4.33181 × 10-19, 0.000557011, -1.26179 × 10-14, 0.0238286,
0.00216985, 0.00170045, 0.00494127, 0.00105481, 0.00058581, 0.000759374}

(L2) Out[269]=
{1.38994 × 10-13, 7.78187 × 10-18, 0.00290955, 5.51027 × 10-14, 0.033686,
0.00730111, 0.00764023, 0.0201476, 0.00340906, 0.00307338, 0.00318168}
```

- Is weighting of adds by packages instead of licenses causing differences in means, especially for elig*pop?

Answer, no. Found error, it was in elig*pop for swaps calculation
Affects standard deviation of synergy measures a lot

- Number of licenses (combined) per inequality

```
(L2) In[270]:= addpacksizes = Table[
    Total[winningpackagesusablesizes[[datamap2add[[1]]]]], {1, Length[datamap2add]}];
```

- New means

```
(L2) In[271]:= weightmeansadd = Total[addpacksizes Transpose[dataarray2add]] / Total[addpacksizes]
Sqrt[
Total[addpacksizes Transpose[(dataarray2add - weightmeansadd)^2]] / Total[addpacksizes]]

(L2) Out[271]=
{1.13672 × 10-13, 1.50883 × 10-18, 0.00170667, -4.54736 × 10-14, 0.0226727,
0.00420733, 0.00406261, 0.00692976, 0.00273345, 0.00192897, 0.00227244}

(L2) Out[272]=
{2.44254 × 10-13, 1.4106 × 10-17, 0.00522027, 9.8542 × 10-14, 0.034069,
0.00954663, 0.0122433, 0.0230326, 0.0057885, 0.00557458, 0.00562167}
```

End of data stuff

No prices

Gets rid of adding licenses reduces complementarities

- Only geo*pop and elig*pop

- Objective function

```
(L2) In[273]:= obj2waygeosynergyeligpop[data_, bgeo_] :=
Module[{values, onesorzeros},
values = data[[3]] + bgeo * data[[9]] + 0.000001;
onesorzeros = values / Abs[values] + 1.0;
Total[onesorzeros] / 2. / Length[data[[1]]]
];
```

```
(L2) In[274]:= obj2waygeosynergyeligpopneg[data_, bgeo_] :=
Module[{values, onesorzeros},
values = -data[[3]] + bgeo * data[[9]] + 0.000001;
onesorzeros = values / Abs[values] + 1.0;
Total[onesorzeros] / 2. / Length[data[[1]]]
];
```

■ Adds (no robust to elig yet)

```
(L2) In[275]:= obj2waygeosynergyeligpop[dataarray2add, 1.] // Timing
```

```
(L2) Out[275]= {0.002766, 0.879936}
```

```
(L2) In[276]:= Timing[ans = pairwiseMSE[obj2waygeosynergyeligpop, dataarray2add,
{bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
"SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ]]
```

```
(L2) Out[276]= {7.44194, {0.897073, {bgeodist → 9.35226}}}
```

```
(L2) In[277]:= Do[
Print[
AbsoluteTiming[ans = pairwiseMSE[obj2waygeosynergyeligpop, dataarray2add, {bgeodist},
nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 75,
"RandomSeed" → Floor[SessionTime[]]} } ] ]
,
{k,
1,
15}]

{12.514332, {0.897073, {bgeodist → 9.35026}}}
{12.383349, {0.897073, {bgeodist → 9.34744}}}
{14.186830, {0.897073, {bgeodist → 9.87563}}}
{8.221142, {0.897073, {bgeodist → 9.87188}}}
{13.720280, {0.897073, {bgeodist → 9.34535}}}
{11.569547, {0.897073, {bgeodist → 9.34352}}}
{11.902047, {0.897073, {bgeodist → 9.87617}}}
{12.444316, {0.897073, {bgeodist → 9.34662}}}
{9.211629, {0.897073, {bgeodist → 9.35103}}}
{13.167185, {0.897073, {bgeodist → 9.34851}}}
{9.499285, {0.897073, {bgeodist → 9.8748}}}
{13.230796, {0.897073, {bgeodist → 9.87769}}}
{14.710374, {0.897073, {bgeodist → 9.34456}}}
{9.519295, {0.897073, {bgeodist → 9.87301}}}
{11.412525, {0.897073, {bgeodist → 9.35036}}}
```

- Negatives (no robust to elig yet)

```
(L2) In[278]:= Do[
  Print[AbsoluteTiming[
    ans = pairwiseMSE[obj2waygeosynergyeligpopneg, dataarray2add, {bgeodist},
    nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 75,
      "RandomSeed" → Floor[SessionTime[]]}}]]]
  ,
  {k,
   1,
   15}]

{14.975304, {0.91131, {bgeodist → 3.80944}}}

{7.676906, {0.91131, {bgeodist → 3.80938}}}

{10.582344, {0.91131, {bgeodist → 3.80936}}}

{13.572473, {0.91131, {bgeodist → 3.80942}}}

{9.254714, {0.91131, {bgeodist → 3.80946}}}

{16.283009, {0.91131, {bgeodist → 3.80894}}}

{12.005050, {0.91131, {bgeodist → 3.80957}}}

{16.288016, {0.91131, {bgeodist → 3.80951}}}

{15.746709, {0.91131, {bgeodist → 3.80952}}}

{8.816011, {0.91131, {bgeodist → 3.80938}}}

{9.452897, {0.91131, {bgeodist → 3.80879}}}

{13.845980, {0.91131, {bgeodist → 3.80922}}}

{10.819950, {0.91131, {bgeodist → 3.8089}}}

{7.622191, {0.91131, {bgeodist → 3.80935}}}

{15.345055, {0.91131, {bgeodist → 3.80861}}}

(L2) In[279]:= Do[
  Print[AbsoluteTiming[
    ans = pairwiseMSE[obj2waygeosynergyeligpopneg, dataarray2add, {bgeodist},
    nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 150,
      "RandomSeed" → Floor[SessionTime[]]}}]]]
  ,
  {k,
   1,
   15}]
```

```
{32.145716, {0.91131, {bgeodist → 3.80945}}}
{27.638361, {0.91131, {bgeodist → 3.80943}}}
{30.681827, {0.91131, {bgeodist → 3.80921}}}
{27.891866, {0.91131, {bgeodist → 3.80929}}}
{33.041174, {0.91131, {bgeodist → 3.80922}}}
{27.046455, {0.91131, {bgeodist → 3.80917}}}
{27.732771, {0.91131, {bgeodist → 3.8091}}}
{26.943305, {0.91131, {bgeodist → 3.80887}}}
{29.815729, {0.91131, {bgeodist → 3.80921}}}
{28.582397, {0.91131, {bgeodist → 3.80946}}}
{18.788838, {0.91131, {bgeodist → 3.80919}}}
{28.565031, {0.91131, {bgeodist → 3.80885}}}
{31.262756, {0.91131, {bgeodist → 3.80958}}}
{26.800649, {0.91131, {bgeodist → 3.80949}}}
{30.433512, {0.91131, {bgeodist → 3.80871}}}
```

- Standard errors for adds (no robust to elig yet)

- Swaps

```
(L2) In[282]:= obj2waygeosynergyeligpop[dataarray2way, 1.] // Timing
(L2) Out[282]= {0.000701, 0.955615}

(L2) In[283]:= Timing[ans = pairwiseMSE[obj2waygeosynergyeligpop, dataarray2way,
    {bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
        "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ] ]
(L2) Out[283]= {2.93304, {0.955913, {bgeodist → 1.09685}}}

(L2) In[284]:= Do[
    Print[
        AbsoluteTiming[ans = pairwiseMSE[obj2waygeosynergyeligpop, dataarray2way, {bgeodist},
            nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 75,
                "RandomSeed" → Floor[SessionTime[]]} } ] ]
    ,
    {k,
     1,
     15}]
```

```
{3.212954, {0.955913, {bgeodist → 1.09632}}}
{2.366604, {0.955913, {bgeodist → 1.0956}}}
{3.689563, {0.955913, {bgeodist → 1.09327}}}
{2.480694, {0.955913, {bgeodist → 1.05618}}}
{2.790384, {0.955913, {bgeodist → 1.09431}}}
{2.785870, {0.955913, {bgeodist → 1.09459}}}
{2.381107, {0.955913, {bgeodist → 1.09575}}}
{2.507791, {0.955913, {bgeodist → 1.09472}}}
{2.420787, {0.955913, {bgeodist → 1.09497}}}
{2.894350, {0.955913, {bgeodist → 1.09643}}}
{2.786608, {0.955913, {bgeodist → 1.09415}}}
{2.789246, {0.955913, {bgeodist → 1.09507}}}
{3.257576, {0.955913, {bgeodist → 1.09557}}}
{2.341859, {0.955913, {bgeodist → 1.09688}}}
{2.439927, {0.955913, {bgeodist → 1.09515}}}
```

■ Negative

```
(L2) In[285]:= Timing[ans = pairwiseMSE[obj2waygeosynergyeligpopneg, dataarray2way,
  {bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ] ]
(L2) Out[285]= {6.21497, {0.939976, {bgeodist → 30.3227}}}

(L2) In[286]:= Timing[ans = pairwiseMSE[obj2waygeosynergyeligpopneg, dataarray2way,
  {bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ] ]
(L2) Out[286]= {3.7734, {0.939976, {bgeodist → 29.988}}}
```

■ Standard errors for swaps

```
(L2) In[289]:= estimateWay4 = {bgeodist} /. {bgeodist → 1.0561848284265936`}
(L2) Out[289]= {1.05618}
```

```
(L2) In[290]:= Timing[pointcroul = pointIdentifiedCR[25, 200, estimateway4,
    obj2waygeosynergyeligpop, {bgeodist}, datamap2way, dataarray2way,
    asymptotics → coalitions, nMaximizeOptions → {Method → {"DifferentialEvolution",
        "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ]]

(L2) Out[290]=
{431.824,
 {{0.87303, 1.55774}}, {{-0.144794}, {0.0120099}, {-1.23212}, {0.205249}, {-0.141778},
 {1.05187}, {0.75213}, {0.194077}, {-1.21946}, {0.215212}, {-2.29251}, {-0.146136},
 {1.05947}, {0.199361}, {0.183997}, {0.805952}, {-3.61565}, {-3.37017}, {-0.0286137},
 {-2.29788}, {-2.29236}, {-0.862618}, {0.194771}, {-2.31332}, {0.874775}, {-3.34848},
 {-2.14326}, {-2.30135}, {-0.143206}, {-2.30416}, {-3.33939}, {0.184303}, {-1.21866},
 {-2.29968}, {0.200431}, {-3.29795}, {-0.145172}, {0.193969}, {0.19348}, {0.00524353},
 {1.28281}, {0.634335}, {0.190863}, {-0.145933}, {0.616472}, {1.09575}, {-0.144907},
 {-3.78664}, {1.45774}, {-0.954879}, {-0.141959}, {-1.16639}, {-2.07109}, {-2.31409},
 {0.201751}, {0.200898}, {0.18373}, {1.29069}, {0.195886}, {0.197929}, {0.206391},
 {-2.31434}, {-0.151629}, {-2.29862}, {0.198086}, {0.192808}, {0.197676}, {0.205814},
 {0.188445}, {-2.11667}, {-1.17471}, {-2.02884}, {0.200775}, {-3.34883}, {0.645065},
 {-0.141604}, {3.42759}, {-1.096}, {1.39792}, {0.618353}, {-2.3072}, {0.197574},
 {-3.78951}, {-0.0139475}, {1.3885}, {0.625819}, {0.197791}, {0.189513}, {-3.8058},
 {-1.71017}, {0.00566357}, {0.197163}, {0.192311}, {0.211108}, {-3.2965}, {0.191315},
 {0.908139}, {1.37582}, {-2.31394}, {-3.80277}, {-3.84758}, {0.201044}, {-2.29093},
 {0.739827}, {-1.21758}, {-1.23983}, {1.06026}, {-2.3024}, {1.42188}, {0.194851},
 {-0.144558}, {-2.31411}, {0.157626}, {-2.29831}, {0.191206}, {-2.12648}, {0.20176},
 {-0.144767}, {0.200576}, {1.0531}, {-2.31379}, {-2.14687}, {0.00692537}, {1.07346},
 {-2.3146}, {0.219941}, {0.883126}, {0.89347}, {1.05353}, {-2.0022}, {-1.23476},
 {0.00579403}, {0.62244}, {-2.29455}, {-0.958694}, {0.203135}, {1.38279}, {0.211866},
 {0.200692}, {0.19222}, {-0.146717}, {-3.36991}, {-3.42947}, {0.205533}, {-2.31393},
 {0.190467}, {-0.144649}, {0.194643}, {-1.16438}, {-0.860035}, {0.604406}, {-2.29693},
 {-2.29783}, {-0.144886}, {1.39754}, {-0.211379}, {0.204452}, {-0.96381}, {0.194507},
 {-2.30152}, {0.00443801}, {0.191512}, {-2.29283}, {-2.29621}, {0.185171}, {0.19927},
 {0.629525}, {1.05142}, {-1.88356}, {-3.42764}, {1.06138}, {-2.29648}, {-3.91648},
 {0.170804}, {-3.34842}, {0.212231}, {-0.125894}, {-0.853646}, {0.196839}, {0.194527},
 {-2.28695}, {-2.30146}, {-0.145033}, {0.00493262}, {0.197086}, {-1.09038},
 {0.0119893}, {-2.27261}, {0.189161}, {-3.29344}, {0.207697}, {-2.29765}, {-3.29867},
 {-2.2947}, {-2.29807}, {0.19635}, {1.28355}, {0.0074516}, {0.753922}, {-2.29974}}}}
```

■ Add air and ATS travel

■ Objective function

```
(L2) In[291]:= obj2wayallsynergyeligpop[data_, bgeo_, bair_, bats_] :=
Module[ {values, onesorzeros},
  values = data[[3]] + bgeo * data[[9]] + bair * data[[10]] + bats * data[[11]] + 0.000001;
  onesorzeros = values / Abs[values] + 1.0;
  Total[onesorzeros] / 2. / Length[data[[1]]]
];

(L2) In[292]:= obj2wayallsynergyeligpopneg[data_, bgeo_, bair_, bats_] :=
Module[ {values, onesorzeros},
  values = -data[[3]] + bgeo * data[[9]] + bair * data[[10]] + bats * data[[11]] + 0.000001;
  onesorzeros = values / Abs[values] + 1.0;
  Total[onesorzeros] / 2. / Length[data[[1]]]
];
```

■ Adds (no robust)

```
(L2) In[293]:= obj2wayallsynergyeligpop[dataarray2add, 1., 1., 1.] // Timing
(L2) Out[293]= {0.00523, 0.845908}
```

```
(L2) In[294]:= Timing[ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2add,
  {bgeodist, bair, bats}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ]]

(L2) Out[294]= {25.419, {0.925992, {bgeodist → 49.3593, bair → -10.5536, bats → -6.76417}}}

(L2) In[295]:= Do[Print[Timing[
  ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2add, {bgeodist, bair, bats},
  nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 75,
  "RandomSeed" → Floor[SessionTime[]]} } ]]
  ,
  {k,
  1,
  15}]]

{25.6287, {0.924306, {bgeodist → 23.4789, bair → -4.37997, bats → -3.72971}}}
{24.4955, {0.925992, {bgeodist → 45.8363, bair → -9.79007, bats → -6.34549}}}
{25.5736, {0.924529, {bgeodist → 28.0475, bair → -4.80461, bats → -4.43683}}}
{23.6906, {0.925719, {bgeodist → 44.5238, bair → -8.99763, bats → -6.02435}}}
{23.4831, {0.925967, {bgeodist → 43.2716, bair → -9.0609, bats → -6.27912}}}
{25.9809, {0.925223, {bgeodist → 33.4096, bair → -6.7184, bats → -5.07489}}}
{24.3282, {0.92567, {bgeodist → 39.4995, bair → -8.60175, bats → -5.39678}}}
{25.2, {0.925546, {bgeodist → 48.0106, bair → -11.3394, bats → -4.97364}}}
{23.1807, {0.925843, {bgeodist → 47.5411, bair → -10.754, bats → -5.7687}}}
{24.7834, {0.924926, {bgeodist → 28.3178, bair → -5.90425, bats → -3.99968}}}
{24.2442, {0.925521, {bgeodist → 44.1084, bair → -8.58523, bats → -6.04663}}}
{23.0973, {0.925719, {bgeodist → 39.1135, bair → -8.24857, bats → -5.62432}}}
{23.7865, {0.924901, {bgeodist → 26.2547, bair → -5.3824, bats → -3.99711}}}
{23.8314, {0.925099, {bgeodist → 32.1847, bair → -6.61734, bats → -4.4649}}}
{23.1506, {0.925918, {bgeodist → 46.7142, bair → -9.65633, bats → -6.43547}}}

(L2) In[296]:= Do[Print[Timing[
  ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2add, {bgeodist, bair, bats},
  nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 150,
  "RandomSeed" → Floor[SessionTime[]]} } ]]
  ,
  {k,
  1,
  15}]]

(L2) Out[296]= $Aborted

Do[Print[
  Timing[ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2add, {bgeodist, bair, bats},
  nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 500,
  "RandomSeed" → Floor[SessionTime[]]} } ]]
  ,
  {k,
  1,
  15}]]
```

```

{767.571, {0.939335, {bgeodist → 52.0147, bair → -1.84829, bats → -1.69336}}}
{767.92, {0.93936, {bgeodist → 65.2506, bair → -2.30631, bats → -1.83533}}}}
{775.055, {0.939335, {bgeodist → 51.85, bair → -1.85408, bats → -1.7793}}}}
{770.254, {0.93936, {bgeodist → 46.874, bair → -1.50386, bats → -1.89645}}}}
{771.24, {0.939335, {bgeodist → 53.6229, bair → -1.85234, bats → -1.78913}}}}
{769.552, {0.940352, {bgeodist → 156.778, bair → -1.77726, bats → -7.13051}}}}
{775.767, {0.93936, {bgeodist → 52.7129, bair → -1.84868, bats → -1.7856}}}}
{776.246, {0.939335, {bgeodist → 53.7818, bair → -1.84532, bats → -1.80969}}}}
{768.314, {0.939335, {bgeodist → 52.4297, bair → -1.72354, bats → -1.8695}}}}
{769.896, {0.939385, {bgeodist → 62.3649, bair → -2.26715, bats → -1.69213}}}}
{769.225, {0.939385, {bgeodist → 62.2349, bair → -2.04807, bats → -1.98344}}}}
{782.011, {0.939385, {bgeodist → 65.5078, bair → -2.30591, bats → -1.8389}}}}
{775.351, {0.939335, {bgeodist → 52.9192, bair → -1.82081, bats → -1.788}}}}
{770.982, {0.939385, {bgeodist → 46.5896, bair → -1.47831, bats → -1.91612}}}}
{770.957, {0.939335, {bgeodist → 61.3547, bair → -1.96854, bats → -1.99322}}}

Do[Print[
  Timing[ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2add, {bgeodist, bair, bats},
    nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 750,
      "RandomSeed" → Floor[SessionTime[]]} } ] ]
  ,
  {k,
   1,
   15}]

{1160.35, {0.940352, {bgeodist → 136.635, bair → -1.75427, bats → -6.58845}}}
{1165.89, {0.93998, {bgeodist → 102.445, bair → -1.55897, bats → -4.99466}}}}
{1163.15, {0.93941, {bgeodist → 52.921, bair → -1.78232, bats → -1.80783}}}}
{1165.77, {0.93936, {bgeodist → 64.1681, bair → -2.15689, bats → -1.97393}}}}
{1159.45, {0.940005, {bgeodist → 102.983, bair → -0.817116, bats → -5.91782}}}}
{1163.53, {0.939385, {bgeodist → 52.3757, bair → -1.81326, bats → -1.73329}}}}
{1167.7, {0.939881, {bgeodist → 104.327, bair → -1.41342, bats → -5.16575}}}}
{1166.94, {0.939385, {bgeodist → 83.4991, bair → -1.05023, bats → -4.40946}}}}
{1165.44, {0.93941, {bgeodist → 63.4142, bair → -2.11244, bats → -1.97934}}}}
{1163.38, {0.939459, {bgeodist → 89.2711, bair → -1.38222, bats → -4.12386}}}}
{1163.3, {0.939385, {bgeodist → 52.1973, bair → -1.82695, bats → -1.73349}}}}
{1162.64, {0.940154, {bgeodist → 107.749, bair → -1.57812, bats → -5.04158}}}}
{1157.7, {0.939683, {bgeodist → 96.877, bair → -0.767106, bats → -5.44054}}}}
{1156.29, {0.93936, {bgeodist → 52.4839, bair → -1.78508, bats → -1.81587}}}}
{1159.35, {0.940079, {bgeodist → 114.201, bair → -1.42771, bats → -5.29076}}}}

```

Negative for adds (no robust)

```

Do[Print[Timing[
  ans = pairwiseMSE[obj2wayallsynergyeligpopneg, dataarray2add, {bgeodist, bair, bats},
  nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 75,
  "RandomSeed" → Floor[SessionTime[]]} } ] ]
  ,
{k,
1,
2}]

{131.353, {0.935169, {bgeodist → 55.2751, bair → -0.451361, bats → -1.21992}}}

{132.264, {0.935169, {bgeodist → 56.8364, bair → -0.679161, bats → -1.03795}}}

```

- Standard errors for adds (no robust)

- Swaps

```

(L2) In[297]:= obj2wayallsynergyeligpop[dataarray2way, 1., 1., 1.] // Timing

(L2) Out[297]= {0.001125, 0.949136}

(L2) In[298]:= Do[Print[Timing[
  ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2way, {bgeodist, bair, bats},
  nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 75,
  "RandomSeed" → Floor[SessionTime[]]} } ] ]
  ,
{k,
25}]

```

```

{8.02957, {0.95986, {bgeodist → 0.862162, bair → -0.26526, bats → -0.616751}}}
{7.86071, {0.95986, {bgeodist → 0.869962, bair → -0.268225, bats → -0.631965}}}
{7.8524, {0.95986, {bgeodist → 0.869923, bair → -0.266428, bats → -0.633848}}}
{7.82699, {0.95986, {bgeodist → 0.870526, bair → -0.267884, bats → -0.630821}}}
{7.8038, {0.95986, {bgeodist → 0.870234, bair → -0.269451, bats → -0.635465}}}
{7.88608, {0.95986, {bgeodist → 0.869864, bair → -0.269324, bats → -0.633586}}}
{7.83434, {0.95986, {bgeodist → 0.86992, bair → -0.268033, bats → -0.631974}}}
{7.83938, {0.95986, {bgeodist → 0.87026, bair → -0.267091, bats → -0.629898}}}
{7.82799, {0.95986, {bgeodist → 0.87038, bair → -0.267845, bats → -0.631451}}}
{7.86623, {0.95986, {bgeodist → 0.870254, bair → -0.266656, bats → -0.630794}}}
{7.86692, {0.959786, {bgeodist → 0.870936, bair → -0.261125, bats → -0.662644}}}
{7.97466, {0.95986, {bgeodist → 0.871074, bair → -0.268918, bats → -0.629528}}}
{7.8618, {0.959786, {bgeodist → 0.868953, bair → -0.263308, bats → -0.630649}}}
{8.00514, {0.95986, {bgeodist → 0.870063, bair → -0.267474, bats → -0.633664}}}
{7.9705, {0.95986, {bgeodist → 0.870039, bair → -0.268084, bats → -0.633253}}}
{7.83797, {0.95986, {bgeodist → 0.870057, bair → -0.269454, bats → -0.63456}}}
{7.83421, {0.95986, {bgeodist → 0.861423, bair → -0.264109, bats → -0.616217}}}
{7.83667, {0.95986, {bgeodist → 0.870515, bair → -0.266964, bats → -0.628709}}}
{7.8278, {0.95986, {bgeodist → 0.87037, bair → -0.26881, bats → -0.632484}}}
{7.84216, {0.95986, {bgeodist → 0.869875, bair → -0.268094, bats → -0.634339}}}
{7.84772, {0.95986, {bgeodist → 0.870193, bair → -0.267737, bats → -0.632934}}}
{7.81795, {0.95986, {bgeodist → 0.870143, bair → -0.267054, bats → -0.631947}}}
{7.79524, {0.959786, {bgeodist → 0.862192, bair → -0.263089, bats → -0.624471}}}
{5.01624, {0.959711, {bgeodist → 0.871093, bair → -0.259692, bats → -0.633304}}}
{7.85539, {0.959786, {bgeodist → 0.873286, bair → -0.260299, bats → -0.662367}}}

(L2) In[299]:= Do[Print[Timing[
  ans = pairwiseMSE[obj2wayallsynergyeligpop, dataarray2way, {bgeodist, bair, bats},
    nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 500,
      "RandomSeed" → Floor[SessionTime[]]} } ] ]
  ,
  {k,
  5}]

{50.1909, {0.95986, {bgeodist → 0.86158, bair → -0.258824, bats → -0.61943}}}
{49.9021, {0.95986, {bgeodist → 0.870146, bair → -0.269028, bats → -0.630008}}}
{49.8714, {0.95986, {bgeodist → 0.870128, bair → -0.267677, bats → -0.633214}}}
{49.8663, {0.95986, {bgeodist → 0.871148, bair → -0.269198, bats → -0.628976}}}

(L2) Out[299]=
$Aborted

```

Old estimates

- Negative coefficient on elig^*pop

```
(L2) In[300]:= Do[Print[Timing[
  ans = pairwiseMSE[obj2wayallsynergyeligpopneg, dataarray2way, {bgeodist, bair, bats},
  nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 150,
  "RandomSeed" → Floor[SessionTime[]]} } ] ],
  {k,
  3}]

{16.9061, {0.942508, {bgeodist → 56.9685, bair → 23.9127, bats → 19.576}}}
{17.2966, {0.942657, {bgeodist → 62.1413, bair → 30.5493, bats → 22.8292}}}
{16.7109, {0.942061, {bgeodist → 36.8352, bair → -1.01595, bats → 22.7904}}}
```

- Standard errors for swaps

```
(* estimateway3 = { bgeodist,bair,bats} /.
{bair→0.2335209988622914` ,bats→0.32074298170785814` ,bgeodist→0.6539897051203899` } *)
(L2) In[304]:= estimateway3 =
{ bgeodist, bair, bats} /. {bgeodist → 0.86158, bair → -0.258824, bats → -0.61943}
(L2) Out[304]=
{0.86158, -0.258824, -0.61943}

(L2) In[305]:= obj2wayallsynergyeligpop[dataarray2way, bgeodist, bair, bats] /.
{bgeodist → 0.86, bair → -0.26, bats → -0.62}
(L2) Out[305]=
0.959637

(L2) In[306]:= Timing[pointcrount1 = pointIdentifiedCR[25, 200, estimateway3,
obj2wayallsynergyeligpop, {bgeodist, bair, bats}, datamap2way, dataarray2way,
asymptotics → coalitions, nMaximizeOptions → {Method → {"DifferentialEvolution",
"SearchPoints" → 100, "RandomSeed" → Floor[SessionTime[]]} } ] ]
(L2) Out[306]=
{1590.16, {{0.583184, 1.05502}, {-0.512067, 0.510039}, {-0.955361, -0.271107}, {-0.249062, 0.511598, 0.26674}, {1.12643, -1.96155, -1.21788}, {0.715579, -1.81429, 2.54325}, {0.197075, -1.45827, -1.05968}, {-1.28106, -1.46682, 0.700528}, {1.12162, -2.85541, -0.967848}, {1.20454, -1.7155, -0.541377}, {1.47586, 0.3687, -0.616987}, {1.18265, -5.08487, 0.255549}, {0.0279207, 0.00623306, 0.4157}, {0.464494, -1.36903, -1.41585}, {0.306496, -1.40333, -0.171626}, {1.13812, -1.69934, -0.902535}, {0.0523838, -0.0355835, -0.0793261}, {1.15273, -2.14732, -0.982278}, {0.750301, -1.87255, 1.1904}, {0.788632, -1.67191, 2.25766}, {0.0639901, 0.444585, -0.582427}, {1.24171, -0.65752, -1.02752}, {-0.0804214, -0.00824475, -0.559213}, {0.551835, -2.05642, 5.52738},
```

```

{0.752685, -1.92591, 2.44253}, {0.00617408, 0.00176998, 0.0616592},
{-1.46044, 0.769504, 1.42398}, {1.61309, -5.80479, -2.83373}, {0.753463, -2.1079, 2.68989},
{0.00979021, -0.0573654, 0.0951044}, {2.10184, 2.98873, -0.876352},
{1.30292, -3.14843, -1.10783}, {-0.563243, 0.159261, 0.367664},
{-0.199778, 1.22728, -0.112648}, {-1.29009, -1.20301, 0.724884},
{-2.44977, 1.88597, 1.26342}, {0.933347, -1.96631, 0.945848},
{1.10738, -5.01488, -0.489208}, {-0.566142, 0.15347, 0.502215},
{-1.30655, -1.62052, 0.969857}, {0.511065, -1.90185, -0.308349},
{1.37355, -4.43937, -2.58806}, {1.41914, -0.702088, -2.0113},
{-0.678132, 0.206016, 0.861576}, {1.04566, -0.263507, -0.616931},
{0.410008, -3.63272, -0.539121}, {-0.357989, 0.409758, -0.816753},
{-0.0560203, -3.10613, -0.40108}, {-1.023388, -1.77263, 0.881405},
{1.12065, -2.87142, -0.937312}, {-1.11709, 1.33039, 0.979778},
{0.0402083, -0.0491537, -0.206195}, {0.39029, -3.91169, -0.312444},
{1.35726, -0.679271, 2.34578}, {-1.26194, -1.54282, 0.864447},
{0.136672, -0.0204039, 1.08501}, {0.394693, -3.70564, -0.419734},
{0.019247, 0.00726576, 0.149889}, {-1.47395, 1.66757, -0.125679},
{-1.49697, 1.03894, 0.270615}, {1.13211, -1.69719, -0.947436},
{-0.0690119, -0.06149, -0.532344}, {1.80583, 1.87833, -2.62978},
{0.964673, -1.72065, 0.793529}, {-1.30676, -1.70834, 0.957781},
{0.0383549, -0.094512, -0.0367446}, {-0.156745, 0.480231, -0.221994},
{0.0409339, -0.0472993, -0.0804761}, {1.93829, 2.36599, -1.17828},
{1.57373, -6.35899, -2.40329}, {0.499651, -3.7648, 0.222463},
{0.263279, -1.32714, -0.344158}, {0.308353, -1.44502, -0.104105},
{-0.536128, 0.108091, 0.93256}, {0.295514, -1.68969, -1.13846},
{3.10542, -5.11808, -2.19004}, {-0.240489, 0.525047, 0.249008},
{-1.0701, -1.84174, 0.527968}, {-0.587179, 0.17705, 0.33103}, {2.23881, -1.00887, 0.10009},
{-0.679623, 0.247981, 0.955135}, {-0.478254, 0.129582, 0.911386},
{0.0437495, 0.00718971, -0.211409}, {-0.287142, -2.72339, -0.958973},
{0.6495, -1.62286, -1.78693}, {-1.50448, 1.0405, 0.30499},
{-0.683209, 0.551786, 1.06116}, {0.410589, -3.73632, -0.401411},
{0.0468551, -0.0285258, -0.0522514}, {-0.530573, 0.130804, 0.361678},
{0.734325, -1.88201, 2.34596}, {2.29588, 1.2687, -0.894736}, {1.00532, -4.84719, 3.02534},
{0.127738, 0.0734468, -0.0210379}, {0.444993, -3.68549, -0.0939083},
{1.11816, -1.7026, -0.948202}, {-0.0761133, -0.263203, -0.12882},
{-0.0148648, -0.0115973, 0.0131769}, {0.277456, -1.41672, -0.407773},
{-0.651293, 0.988605, 0.443807}, {-1.05367, 1.21592, 1.02272},
{-0.289267, -2.7341, -0.195062}, {-0.677397, 1.06687, 0.258069},
{0.120606, -2.45364, -1.31767}, {-0.631235, 0.940769, 0.365036},
{0.284069, -1.4159, -0.416861}, {-1.11944, -2.08895, 0.582876},
{0.553151, -0.0901986, 4.15219}, {-0.652561, 0.848729, 0.449382},
{-0.120234, -0.053959, -0.264851}, {0.0515837, -0.112259, -0.0299365},
{-0.930365, 1.30176, 0.633129}, {1.15046, 1.54697, -1.93715},
{0.531464, -2.03203, -0.594239}, {0.0294399, -0.0456346, -0.1254},
{1.43539, -0.441153, -1.39332}, {1.60058, -7.53151, -2.82084},
{0.139979, -0.037639, 0.0828666}, {-0.10319, -0.166434, -0.199228},
{0.0825926, 0.0365834, -0.632187}, {-1.11696, -1.36879, 0.56954},
{-1.19199, 1.26153, 1.03049}, {1.12167, -4.83502, -0.487334},
{1.15437, -2.14309, -0.970795}, {0.293603, -2.77114, -0.41656},
{1.10788, -4.84845, -0.408717}, {0.764831, -1.65997, 2.23652},
{-0.497481, 0.149362, 0.380331}, {2.2806, 1.28042, -0.575117},

```

```

{0.754508, -3.44075, 2.53622}, {-0.720823, 0.235038, 0.821645},
{-0.633861, 0.818322, 0.221547}, {1.48134, -0.857392, -1.42022},
{0.534584, -2.06129, -0.579792}, {1.41307, 1.93746, -0.869709},
{0.107763, -0.0118299, -0.14712}, {-0.273193, 0.131181, 0.608751},
{0.0391484, -0.0433419, 0.131154}, {-1.11458, 0.653759, 1.00964},
{-0.752628, 0.403507, 0.392213}, {1.16023, -2.12751, -0.972241},
{0.082286, 0.214882, -0.227713}, {1.52827, -5.07967, -1.28109},
{-0.332711, 0.508015, -0.517869}, {0.420244, -3.57864, -0.422498},
{-0.0852571, 2.64285, -1.15816}, {1.0419, -0.281804, -0.615275},
{-0.500761, 0.137038, -0.0111878}, {-1.09547, -1.98695, 0.503434},
{0.286764, -1.27756, -0.172005}, {1.53684, 0.72063, -2.6611},
{-0.263233, 0.132124, 0.58887}, {1.29718, -3.09029, -1.15517},
{1.68895, -7.59563, -2.95369}, {-0.0851957, -1.82153, 0.0302617},
{-0.501928, -2.7905, 0.104166}, {0.540582, -2.04578, -0.625638},
{0.234052, -1.39878, -0.571886}, {2.91323, -1.23968, -2.48052},
{-2.62975, 1.91194, 1.66799}, {0.0633031, 0.048102, -0.0222082},
{0.236635, -1.39612, -0.571079}, {-0.0650969, -1.86377, -0.0323736},
{-1.13498, -1.15789, 0.588679}, {-1.08279, -1.44928, -0.037994},
{-1.10422, 1.33243, 0.651743}, {-1.10289, -1.3611, 0.561644}, {1.48763, 1.92021, -0.55332},
{1.71371, -8.14411, -1.6799}, {0.0919959, -0.0083264, -0.141498},
{1.14211, 1.41971, -1.83058}, {0.301795, -1.8342, -0.43736},
{-0.330101, 0.494724, -0.560503}, {-0.274712, -2.75878, -0.730502},
{-0.687222, 0.506245, -0.391674}, {-0.115544, -0.0448117, -0.256208},
{-0.503448, 0.0955496, 0.951471}, {1.21415, -2.77914, -1.58555},
{-1.36355, 1.74685, -0.189211}, {1.17011, -0.525811, -1.63368},
{1.16717, 1.38768, -1.84131}, {0.038968, -0.0135882, 0.328419},
{-0.634005, 1.3264, 0.477589}, {1.11503, -2.7581, -0.92692}, {1.54761, -8.1864, -1.50637},
{0.052751, -0.0126296, -0.0724535}, {0.241033, -1.35879, -0.585042},
{-1.0641, -1.82718, 0.524}, {-1.28109, -1.4699, 0.946714},
{-0.255281, 0.130211, 0.510774}, {1.66129, 1.47368, -2.93158},
{-1.11149, -1.2928, 0.501797}, {0.0444295, -0.03897, -0.210133},
{0.240806, -1.39918, -0.630032}, {1.10579, -4.96827, -0.430571},
{-1.36512, -2.36795, 1.11524}, {-0.105168, -1.7465, -1.13299},
{-0.679966, 0.224595, 0.919355}, {1.38623, 0.349532, -2.53529},
{1.71491, 1.32573, -1.87237}, {0.0118091, -0.00820953, 0.0899846},
{0.29506, -1.43447, -0.115883}, {-1.07296, -1.86395, 0.430368}}}}

```

Table about counterfactuals

Cannot find the original file with the four regions in the counterfactual.

■ Read in MTA information

```

SetDirectory[ NotebookDirectory[] ];
SetDirectory[ "data" ];
mtainfofilepre = Import["cntysv2000_census mta may2009.csv" ];
mtainfofilenames = mtainfofilepre[[1]];
mtainfofile = mtainfofilepre[[2 ;; 52]];

mtastouse = Complement[ Range[51], {25, 47, 49, 50, 51} ];
mtastousenum = Length[mtastouse]

btainfofilepre = Import["cntysv2000_census bta may2009.csv"];
btainfofilenames = btainfofilepre[[1]];
btainfofile = btainfofilepre[[2 ;; 494]];

{MTA, Geo. Desc, Market Name, Market Name Abb. (30 Char.), 1990 census , 2000 census }

46

{BTA, Geo. Desc, Market Name, Market Name Abb. (30 Char.),
MTA, MTA Market Name, MTA Market Name Abb. (30 Char.), 7/1/99 est ,
7/1/98 est , 1990 revised , 1990 census , 2000 census }

```

■ Parameters

Set above

```

estimateaway3
estimateaway3a = Join[{1}, estimateaway3]
{0.32, -0.16, 0.03}

{1, 0.32, -0.16, 0.03}

```

■ Actual winning packages in the C block

```

packwincovars = {Total[packwinoptimeselig],
Total[packwingeodistpop], Total[packwinairtravpop], Total[packwinatstravpop] }
packwincovarsparams = packwincovars estimateaway3a
Total[packwincovarsparams]
{0.394117, 0.469871, 0.19729, 0.267802}

{0.394117, 0.150359, -0.0315664, 0.00803406}

0.520943

```

■ All licenses won by separate bidders

No complementarities, of course

```

allbtasseparateelig =
PadRight[Reverse[Sort[eligibilitydatareal]], btastousenum, 0.00010893412935493899`];
allbtasseparatepop = Reverse[Sort[populationdatareal[[btastouse]]]];
allbtasseparatepopelig = allbtasseparatepop allbtasseparateelig;
Total[allbtasseparatepopelig]

```

0.174831

- **MTAs**

- **Packages to look at**

```

btainfofilenamesmtapos = Position[btainfofilenames, "MTA"][[1, 1]]
mtapacks = Table[Intersection[btastouse, Flatten@Position[
btainfofile[[All, btainfofilenamesmtapos]], mtastouse[[1]]]], {1, mtastousenum}];
5

```

- **Sort by population**

Somewhat unnecessary as the MTAs were numbered in order of population

```

mtapop = Table[Total[populationdatareal[[mtapacks[[m]]]]], {m, mtastousenum}];
mtapopordering = Ordering[mtapop];

```

- **Assign to 47 top winners, by eligibility**

```

maxeligwinners = Reverse[Sort[packwinelig][[winningpackagesusablenum - mtastousenum + 1 ;;]]];

```

- Covars

```

mtapopelig = mtaop.popmaxeligwinners;
mtageodist = Table[Total[populationdatareal[[mtapacks[[1]]]]]
  Total[Transpose[KroneckerProduct[populationdatarealtimes100[[mtapacks[[1]]]],
    populationdatarealtimes100[[mtapacks[[1]]]]]] / 
  btadistancesdiomilestenforown[[mtapacks[[1]], mtapacks[[1]]]]] ] /
  Total[Transpose[KroneckerProduct[populationdatarealtimes100[[mtapacks[[1]]]],
    populationdatarealtimes100[[btastouse]]]] / 
  btadistancesdiomilestenforown[[mtapacks[[1]], btastouse]]] ] ] /
  Total[populationdatareal[[mtapacks[[1]]]]], {1, mtastousenum}];

mtaairtrav = Table[Total[populationdatareal[[mtapacks[[1]]]]]
  Total[Transpose[airlinetravelmatrixreal[[mtapacks[[1]], mtapacks[[1]]]]]] / 
  Total[Transpose[airlinetravelmatrixreal[[mtapacks[[1]], btastouse]]]] ] /
  Total[populationdatareal[[mtapacks[[1]]]], {1, mtastousenum}];
mtaatstrav = Table[Total[populationdatareal[[mtapacks[[1]]]]]
  Total[Transpose[tripsmatrixreal[[mtapacks[[1]], mtapacks[[1]]]]]] / 
  Total[Transpose[tripsmatrixreal[[mtapacks[[1]], btastouse]]]] ] /
  Total[populationdatareal[[mtapacks[[1]]]], {1, mtastousenum}];

packwincovars = {Total[mtapopelig], Total[mtapop mtageodist],
  Total[mtapop mtaairtrav], Total[mtapop mtaatstrav]}
packwincovarsparams = packwincovars estimateway3a
Total[packwincovarsparams]

{0.19836, 0.722036, 0.0373545, 0.16777}
{0.19836, 0.231052, -0.00597671, 0.00503311}
0.428468

```

- Four large regional licenses

- Manually input groupings

Old CSV file with four regions seems to be lost
Northeast, South, Midwest, West

Tennessee, Texas, and Oklahoma mostly in South
El Paso is in the West
Pittsburgh is in the Midwest

```

fourgroupsmtas =
{{1, 8, 9, 10, 35}, {6, 7, 11, 13, 14, 15, 17, 23, 26, 28, 29, 33, 37, 40, 41, 44, 48},
 {3, 5, 12, 16, 18, 19, 20, 21, 31, 32, 34, 38, 45, 46}, {2, 4, 22, 24, 27, 30, 36, 39, 42}}
{{1, 8, 9, 10, 35}, {6, 7, 11, 13, 14, 15, 17, 23, 26, 28, 29, 33, 37, 40, 41, 44, 48},
 {3, 5, 12, 16, 18, 19, 20, 21, 31, 32, 34, 38, 45, 46}, {2, 4, 22, 24, 27, 30, 36, 39, 42}}

```

- Do the groupings by state

Deactivated because of lost file

```
(* btainfofilenamefourregionpos = Position[mtainfofilenames, "Fourregions"][[1,1]]
fourgroupsmtas =
Table[Flatten@Position[mtainfofile[[All, btainfofilenamefourregionpos]], k], {k, 4}] *)
```

Translate to BTAs

```

mtapacksall =
  Table[ Flatten@Position[ btainfofile[[All, btainfofilenamesmtapos]], 1 ] , {1, 52} ];
btasfourregions = Table[ Union[Flatten@mtapacksall[[fourgroupsmtas[[k]] ]]], {k, 4}];

■ Covars

fourelig = maxeligwinners[[;; 4]];
fourpop = Table[ Total[ populationdatareal[[ btasfourregions[[1]] ]]], {1, 4}];
fourpoporder = Reverse[Ordering[fourpop] ];
fourpopelig = fourpop fourelig[[fourpoporder]];
fourgeodist = Table [
  Total[ populationdatareal[[btasfourregions[[1]] ]]] Total[ Transpose[ KroneckerProduct[
    populationdatarealtimes100[[btasfourregions[[1]] ]], populationdatarealtimes100[[[
      btasfourregions[[1]] ]]] / btadistancesdiomilestenforown[[[
        btasfourregions[[1]], btasfourregions[[1]] ]]] ] /
  Total[ Transpose[ KroneckerProduct[ populationdatarealtimes100[[[
    btasfourregions[[1]] ]], populationdatarealtimes100[[btastouse ]]] ] / 
    btadistancesdiomilestenforown[[ btasfourregions[[1]], btastouse ]]] ] ] /
  Total[populationdatareal[[btasfourregions[[1]] ]]], {1,
  4}];

fourairtrav = Table [Total[ populationdatareal[[btasfourregions[[1]] ]]] Total[Transpose[
  airlinetravelmatrixreal[[btasfourregions[[1]], btasfourregions[[1]] ]]] ] /
  Total[Transpose[airlinetravelmatrixreal[[btasfourregions[[1]], btastouse ]]] ] ] ] /
  Total[populationdatareal[[btasfourregions[[1]] ]]], {1, 4}];
fouratstrav = Table [Total[ populationdatareal[[btasfourregions[[1]] ]]] /
  Total[Transpose[tripsmatrixreal[[btasfourregions[[1]], btasfourregions[[1]] ]]] ] ] /
  Total[Transpose[tripsmatrixreal[[btasfourregions[[1]], btastouse ]]] ] ] /
  Total[populationdatareal[[btasfourregions[[1]] ]]], {1, 4}];

packwincovars = {Total[fourpopelig], Total[fourpop fourgeodist],
  Total[fourpop fourairtrav], Total[fourpop fouratstrav] }
packwincovarsparams = packwincovars estimateway3a
Total[packwincovarsparams]

{0.504843, 0.959819, 0.373551, 0.579929}

{0.504843, 0.307142, -0.0597681, 0.0173979}

0.769615

```

■ One big winner (NextWave)

```

packwincovars = {packwinelig[[85]], 1, 1, 1}
packwincovarsparams = packwincovars estimateway3a
Total[packwincovarsparams]
{0.712628, 1, 1, 1}

{0.712628, 0.32, -0.16, 0.03}

0.902628

```

Prices estimator

Normalize price to be in **trillions** manually, in the maximum score functions

Only elig*pop geo*pop

- Objective function

```

obj1eliggeo[data_, belig_, bgeo_] :=
Module[ {values, onesorzeros},
  values = data[[1]] / 1000000.0 + belig * data[[3]] + bgeo * data[[9]] + 0.000001;
  onesorzeros = values / Abs[values] + 1.0;
  Total[onesorzeros] / 2. / Length[data[[1]]]
];
obj1eligueoneg[data_, belig_, bgeo_] :=
Module[ {values, onesorzeros},
  values = -data[[1]] / 1000000.0 + belig * data[[3]] + bgeo * data[[9]] + 0.000001;
  onesorzeros = values / Abs[values] + 1.0;
  Total[onesorzeros] / 2. / Length[data[[1]]]
];

```

- Maximize, swaps

```

Dimensions[dataarray1way]
{11, 73409}

obj1eliggeo[dataarray1way, 1., 1.] // Timing
{0.011998, 0.830756}

obj1eliggeo[dataarray1way, 10.^5, 10.^5] // Timing
{0.024997, 0.824027}

obj1eliggeo[dataarray1way, 10.^9, 10.^9] // Timing
{0.024996, 0.824027}

Do[ Print[Timing[ ans = pairwiseMSE[obj1eliggeo, dataarray1way,
  {belig, bgeodist}, nMaximizeOptions \[Rule] {Method \[Rule] {"DifferentialEvolution",
  "SearchPoints" \[Rule] 75, "RandomSeed" \[Rule] Floor[SessionTime[]]} } ] ]
, {k, 1, 15}]

```

```
{193.074, {0.863382, {belig → -0.037774, bgeodist → 53.4407}}}
{195.505, {0.863382, {belig → -0.0376957, bgeodist → 53.5689}}}
{193.302, {0.863382, {belig → -0.0377486, bgeodist → 53.673}}}
{193.572, {0.863382, {belig → -0.0375896, bgeodist → 53.6334}}}
{193.676, {0.863382, {belig → -0.0377759, bgeodist → 50.4842}}}
{196.232, {0.863382, {belig → -0.0379065, bgeodist → 70.6536}}}
{193.206, {0.863382, {belig → -0.0375579, bgeodist → 53.6286}}}
{174.981, {0.863382, {belig → -0.0377324, bgeodist → 70.6884}}}
{195.186, {0.863382, {belig → -0.0380718, bgeodist → 70.1054}}}
{194.119, {0.863382, {belig → -0.0376739, bgeodist → 70.2975}}}
{194.134, {0.863382, {belig → -0.0380255, bgeodist → 70.2452}}}
{195.39, {0.862932, {belig → -0.0223049, bgeodist → 38.5714}}}
{194.31, {0.863382, {belig → -0.0374363, bgeodist → 53.7861}}}
{194.388, {0.83675, {belig → 1.15902, bgeodist → 0.443438}}}
{195.126, {0.863382, {belig → -0.0379286, bgeodist → 53.6602}}}
```

■ Negative, swaps

```
Do[Print[Timing[ans = pairwiseMSE[obj1eliggeoneg, dataarray1way,
  {belig, bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ] ]
 , {k, 1, 5}]
{216.62, {0.913212, {belig → 0.362756, bgeodist → 0.118881}}}
{213.731, {0.913212, {belig → 0.362718, bgeodist → 0.118901}}}
{217.291, {0.913076, {belig → 0.367385, bgeodist → 0.115621}}}
{217.438, {0.913212, {belig → 0.361357, bgeodist → 0.115814}}}
{214.62, {0.913185, {belig → 0.364177, bgeodist → 0.119753}}}

Do[Print[Timing[ans = pairwiseMSE[obj1eliggeoneg, dataarray1way,
  {belig, bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 150, "RandomSeed" → Floor[SessionTime[]]} } ] ]
 , {k, 1, 15}]
```

```

{427.818, {0.913185, {belig → 0.363948, bgeodist → 0.119104}}}
{424.857, {0.913199, {belig → 0.385143, bgeodist → 0.127042}}}
{422.717, {0.913199, {belig → 0.362927, bgeodist → 0.119192}}}
{424.581, {0.913171, {belig → 0.360837, bgeodist → 0.117487}}}
{424.237, {0.913199, {belig → 0.362609, bgeodist → 0.116329}}}
{424.129, {0.913171, {belig → 0.361044, bgeodist → 0.117504}}}
{425.577, {0.913185, {belig → 0.386628, bgeodist → 0.127648}}}
{425.44, {0.913171, {belig → 0.363655, bgeodist → 0.116519}}}
{423.019, {0.913199, {belig → 0.36381, bgeodist → 0.116713}}}
{423.166, {0.913185, {belig → 0.362524, bgeodist → 0.119032}}}
{424.694, {0.913199, {belig → 0.362508, bgeodist → 0.118913}}}
{423.257, {0.913199, {belig → 0.360918, bgeodist → 0.115883}}}
{424.125, {0.913212, {belig → 0.36262, bgeodist → 0.118893}}}
{423.848, {0.913171, {belig → 0.386152, bgeodist → 0.127666}}}
{427.839, {0.913171, {belig → 0.361314, bgeodist → 0.117898}}}

Do[Print[Timing[ans = pairwiseMSE[obj1eliggeoneg, dataarray1way,
  {belig, bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
    "SearchPoints" → 500, "RandomSeed" → Floor[SessionTime[]]} } ] ] ]
 , {k, 1, 3}]

{1413.81, {0.913212, {belig → 0.362595, bgeodist → 0.118717}}}
{1404.68, {0.913212, {belig → 0.385059, bgeodist → 0.127048}}}
{1405.52, {0.913185, {belig → 0.363819, bgeodist → 0.118971}}}

```

■ Standard errors, geo only

```

estimateaway2 = {belig, bgeodist} /. {belig → 0.36, bgeodist → 0.12}
{0.36, 0.12}

```

```

Timing[pointcrout1 = pointIdentifiedCR[25, 200, estimateaway2,
  obj1eliggeoneg, {belig, bgeodist}, datamaplway, dataarraylway,
  asymptotics → coalitions, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 100, "RandomSeed" → Floor[SessionTime[]]} } ]]

{18075.5, {{{{-0.132536, 0.411893}, {-0.22818, 0.151314}}, {0.0143215, -0.00377836}, {-0.414974, -0.170881}, {-0.0055361, -0.0241438}, {4.46586, 1.51396}, {1.2411, 0.370204}, {4.43683, 1.50753}, {1.43376, 0.433462}, {4.50665, 1.53417}, {0.129362, 0.0210682}, {0.169698, 0.0630507}, {4.43674, 1.50597}, {2.20386, 0.67375}, {1.27712, 0.380707}, {-0.115983, -0.0765063}, {0.302225, 0.030232}, {-0.235896, -0.113906}, {0.00409133, -0.0134582}, {4.47765, 1.42587}, {1.632, 0.506291}, {4.17654, -0.307669}, {4.34157, 1.44862}, {-0.297286, -0.138907}, {4.46355, 1.51364}, {0.309144, 0.0355494}, {1.91026, -0.456588}, {4.43032, 1.47573}, {4.32348, 1.46824}, {1.43297, 0.469899}, {0.174713, -4.54309 × 10^-6}, {-0.609708, -0.0842288}, {0.00377569, -0.010402}, {1.28019, 0.397759}, {0.177084, -0.0134165}, {-0.376836, -0.14667}, {1.04116, 0.302342}, {-0.125214, -0.0770048}, {0.00480693, -0.00225659}, {4.29789, 1.39176}, {-0.208425, -0.140571}, {-0.18422, -0.110942}, {0.0353615, 3.72733}, {-0.045728, -0.0322443}, {4.30529, 1.5542}, {1.37298, 0.411489}, {6.4157, -0.124173}, {1.40901, 0.425581}, {1.93283, 0.629405}, {0.0144199, -0.00386974}, {0.0031861, -0.0142486}, {4.48402, 1.52078}, {4.30272, 1.56918}, {4.46615, 1.51148}, {4.43637, 1.43631}, {-0.217242, -0.0893921}, {0.0143199, -0.00407813}, {4.44107, 1.50895}, {-0.124816, -0.0749633}, {-0.403143, -0.288699}, {4.43638, 1.47795}, {0.12553, 0.0368657}, {0.169657, 0.0629704}, {-0.401345, -0.179308}, {-0.187883, -0.105934}, {5.19525, 1.67142}, {2.02954, 0.655124}, {-0.478426, 3.35316}, {4.36311, 1.60386}, {1.25261, 0.373673}, {-0.48527, 3.21006}, {1.39598, 0.438399}, {0.125984, 0.0351608}, {4.58279, 1.52314}, {4.47967, 1.51776}, {4.34909, 1.47818}, {-0.599513, -0.0490223}, {2.06487, 0.746645}, {0.129306, 13.2182}, {-0.473836, -0.217817}, {-0.477039, 3.35518}, {-0.0629008, -0.0440105}, {4.32337, 1.46887}, {1.26464, 0.377377}, {1.65116, 0.525871}, {-0.22704, -0.111199}, {0.122816, 0.0368565}, {4.62433, 1.57942}, {4.43303, 1.4334}, {1.6312, 0.514929}, {0.151595, -0.0182434}, {4.43633, 1.51085}, {4.33667, 1.42933}, {0.168478, 0.0511895}, {4.54095, 1.51366}, {4.43232, 1.50263}, {-0.503074, -0.205574}, {2.41875, -0.398908}, {0.00487172, -0.0209981}, {-0.217261, -0.0914953}, {4.45024, 1.61547}, {4.47754, 1.52559}, {1.81963, 0.561395}, {-0.401979, -0.180306}, {2.54412, 0.787322}, {1.59053, 0.488064}, {1.27289, 0.378876}, {1.91494, 0.64082}, {1.25454, 0.374479}, {-0.401823, -0.179371}, {4.32883, 1.46364}, {1.64473, 0.50852}, {-0.401354, -0.198579}, {-0.285626, -0.128451}, {-0.126059, -0.0763857}, {1.32765, 0.380503}, {4.36487, 1.60608}, {1.59042, 0.463738}, {1.58686, 0.463595}, {1.93382, 0.640007}, {0.313984, 0.0367634}, {4.45999, 1.51709}, {4.44039, 1.51122}, {4.30513, 1.57228}, {1.42962, 0.427246}, {4.46376, -0.295082}, {0.125916, 0.0354191}, {1.22942, 0.359501}, {4.46541, 1.51402}, {4.43686, 1.51022}, {0.00403021, -0.0219367}, {4.53953, 1.51339}, {4.46536, 1.52577}, {1.63463, 0.481316}, {4.30182, 1.56939}, {-0.43169, -0.174106}, {0.0159351, -0.00287887}, {1.43746, 0.430237}, {-0.485776, 3.20338}, {1.51164, 0.438055}, {4.47917, 1.49268}, {0.698177, 0.171969}, {4.43646, 1.50552}, {4.46137, 1.51741}, {1.67367, 0.53522}, {2.25171, 0.688274}, {0.00417851, -0.062711}, {-0.0382223, -0.0201841}, {1.43369, 0.432906}, {6.3899, -0.126153}, {1.28082, 0.397889}, {4.4112, 1.61689}, {1.27433, 0.3739}, {4.45407, 1.43652}, {4.42477, 1.43245}, {2.22841, 0.725078}, {4.31019, 1.46418}, {4.43328, 1.54102}, {1.27573, 0.379539}, {1.63204, 0.513883}, {1.26584, 0.376207}, {4.36445, 1.48514}, {4.33064, 1.47903}, {-0.36733, -0.187288}, {0.0212137, -0.0604841}, {4.46842, 1.51308}, {1.43071, 0.431919}, {2.21274, 0.670892}, {0.0140601, -0.00393629}, {-0.183115, -0.111046}, {4.2058, -0.339675}, {1.43256, 0.432642}, {0.0244683, -0.0575503}, {4.44462, 1.51333}, {-0.364221, -0.148342}, {0.317889, 0.0877246}, {0.0208804, -0.0000879187}, {-0.122393, -0.0769071}, {4.46388, 1.51857}, {-0.197039, -0.113703}, {-0.401873, -0.179349}, {4.46642, 1.51457}, {0.145994, 0.0422153}, {0.172238, -0.0110305}, {2.3445, 0.733257}, {-0.213259, -0.145951}, {0.86525, 0.232474}, {-0.363958, -0.147982}, {1.43105, 0.426335}, {4.4529, 1.51669}, {0.168064, 13.8449}, {-0.471768, -0.216322}, {-0.405916, -0.197918}, {1.43631, 0.431312}, {4.34143, 1.47731}, {-0.414772, -0.171001}, {4.44237, 1.60908}, {4.30592, 1.45412}, {0.170338, 0.0583403}, {4.44304, 1.60121}, {-0.0978039, -0.0513955}, {0.1696, -0.00106088}}}}}

```

Swaps, air and ats

■ Objective function

```

obj1eliggeotrav[data_, belig_, bgeo_, bair_, bats_] :=
Module[{values, onesorzeros},
  values = data[[1]] / 1000000. + belig * data[[3]] +
    bgeo * data[[9]] + bair * data[[10]] + bats * data[[11]] + 0.000001;
  onesorzeros = values / Abs[values] + 1.0;
  Total[onesorzeros] / 2. / Length[data[[1]]]
];

```

```

obj1eliggeonegtrav[data_, belig_, bgeo_, bair_, bats_] :=
Module[{values, onesorzeros},
  values = -data[[1]] / 1000000. + belig * data[[3]] +
    bgeo * data[[9]] + bair * data[[10]] + bats * data[[11]] + 0.000001;
  onesorzeros = values / Abs[values] + 1.0;
  Total[onesorzeros] / 2. / Length[data[[1]]]
];

```

■ Swaps

```

obj1eliggeonegtrav[dataarray1way, 3., 3., 3., 3.] // Timing
{0.034995, 0.877249}

Timing[ans = pairwiseMSE[obj1eliggeonegtrav, dataarray1way,
  {belig, bgeodist, bair, bats}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ] ]
{306.767,
{0.913485, {belig → 0.37125, bgeodist → 0.11975, bair → -0.0783443, bats → 0.0392136}}}

Do[Print[
Timing[ans = pairwiseMSE[obj1eliggeonegtrav, dataarray1way, {belig, bgeodist, bair, bats},
nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 150,
"RandomSeed" → Floor[SessionTime[]]} } ] ]
, {k, 1, 15}]

```

```

{602.546, {0.913594, {belig → 0.373281, bgeodist → 0.123893, bair → -0.07054, bats → 0.0354246}}}
{601.734, {0.91343, {belig → 0.370403, bgeodist → 0.121291, bair → -0.102469, bats → 0.0457675}}}
{601.631, {0.913539, {belig → 0.362167, bgeodist → 0.11865, bair → -0.090557, bats → 0.00465784}}}
{605.505, {0.913566, {belig → 0.368075, bgeodist → 0.118932, bair → -0.0765356, bats → 0.0174612}}}
{601.27, {0.913553, {belig → 0.384165, bgeodist → 0.131868, bair → -0.115727, bats → 0.0444309}}}
{603.574, {0.91358, {belig → 0.366857, bgeodist → 0.124657, bair → -0.0863608, bats → 0.0280298}}}
{605.669, {0.913457, {belig → 0.370726, bgeodist → 0.126684, bair → -0.110664, bats → 0.0362624}}}
{609.156, {0.913485, {belig → 0.386771, bgeodist → 0.130304, bair → -0.0563828, bats → 0.0383066}}}
{608.036, {0.91358, {belig → 0.367843, bgeodist → 0.121215, bair → -0.0943255, bats → 0.0419041}}}
{605.047, {0.913485, {belig → 0.374258, bgeodist → 0.119371, bair → -0.069502, bats → 0.0461132}}}
{610.24, {0.913526, {belig → 0.370228, bgeodist → 0.120164, bair → -0.0705257, bats → 0.0466106}}}
{606.504, {0.913457, {belig → 0.366352, bgeodist → 0.124046, bair → -0.0658645, bats → 0.0534366}}}
{601.998, {0.913648, {belig → 0.364589, bgeodist → 0.120027, bair → -0.0932646, bats → 0.0150624}}}
{607.127, {0.91358, {belig → 0.369195, bgeodist → 0.120318, bair → -0.0778146, bats → 0.043809}}}
{609.952, {0.913485, {belig → 0.359544, bgeodist → 0.119936, bair → -0.0866295, bats → 0.00885955}}}

Do[Print[
  Timing[ans = pairwiseMSE[obj1eliggeonegtrav, dataarray1way, {belig, bgeodist, bair, bats},
    nMaximizeOptions → {Method → {"DifferentialEvolution", "SearchPoints" → 500,
      "RandomSeed" → Floor[SessionTime[]]} } ] ]
  , {k, 1, 15}]

{2010.54, {0.913648, {belig → 0.367274, bgeodist → 0.120843, bair → -0.0895706, bats → 0.0210347}}}
{2001.21, {0.913621, {belig → 0.36795, bgeodist → 0.123155, bair → -0.0810312, bats → -0.00659101}}}
{2010.51, {0.913648, {belig → 0.361152, bgeodist → 0.121164, bair → -0.0812036, bats → 0.0266173}}}
{2012.31, {0.913594, {belig → 0.367373, bgeodist → 0.11818, bair → -0.0751573, bats → 0.0142619}}}
{2009.6, {0.913526, {belig → 0.370479, bgeodist → 0.119962, bair → -0.0704632, bats → 0.0260378}}}
{2012.06, {0.913635, {belig → 0.365353, bgeodist → 0.11988, bair → -0.0872374, bats → 0.0269993}}}
{2001.72, {0.913703, {belig → 0.364048, bgeodist → 0.122742, bair → -0.0882209, bats → 0.0299039}}}
{2009.24, {0.913498, {belig → 0.367475, bgeodist → 0.123976, bair → -0.0734892, bats → 0.0344969}}}
{1998.48, {0.913635, {belig → 0.366323, bgeodist → 0.119325, bair → -0.0944618, bats → 0.0265674}}}
{2005.16, {0.913621, {belig → 0.364642, bgeodist → 0.121927, bair → -0.076983, bats → 0.0287531}}}
{2001.22, {0.913566, {belig → 0.369872, bgeodist → 0.118474, bair → -0.0707595, bats → 0.041613}}}
{2003.26, {0.913621, {belig → 0.364424, bgeodist → 0.122065, bair → -0.0826764, bats → -0.00140275}}}
{2006.04, {0.913635, {belig → 0.361632, bgeodist → 0.118391, bair → -0.0927488, bats → 0.0115281}}}
{2014.18, {0.913621, {belig → 0.368499, bgeodist → 0.124142, bair → -0.0795896, bats → 0.0242268}}}
{1993.95, {0.913635, {belig → 0.365154, bgeodist → 0.118187, bair → -0.0918248, bats → 0.0470319}}}

```

- Positive

```
Timing[ans = pairwiseMSE[objleliggeotrav, dataarray1way,
  {belig, bgeodist, bair, bats}, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 75, "RandomSeed" → Floor[SessionTime[]]} } ]]
{287.593, {0.874974, {belig → 0.200574, bgeodist → 193.191, bair → 5.343, bats → 1.86974}}}
```

- Standard errors, geo+ travel

```
estimateway1 =
{belig, bgeodist, bair, bats} /. {belig → 0.36, bgeodist → 0.12, bair → -0.09, bats → 0.03}
{0.36, 0.12, -0.09, 0.03}

Timing[pointcroul1 = pointIdentifiedCR[25, 200, estimateway1,
  objleliggeonegtrav, {belig, bgeodist, bair, bats}, datamaplway, dataarray1way,
  asymptotics → coalitions, nMaximizeOptions → {Method → {"DifferentialEvolution",
  "SearchPoints" → 150, "RandomSeed" → Floor[SessionTime[]]} } ]]
{42002.9,
 {{{-0.153318, 0.416753}, {-4.81772, 0.152841}, {-0.222855, 0.039845}, {-0.805426, 0.189503}}, {-0.407302, -0.183029, 0.26408, -0.449391}, {0.352652, 0.0451702, 0.23112, 0.00465794}, {0.054864, 0.0190027, 0.0777568, 0.500538}, {1.43787, 0.428368, 0.25572, -0.21243}, {4.31631, 1.45178, -0.115086, -0.5309}, {4.30529, 1.4315, 0.0528796, -0.698078}, {2.47794, 0.953827, -1.2655, 1.65476}, {4.33346, 1.50933, -0.113388, 0.943856}, {4.51045, 1.50374, 0.166979, -0.84027}, {1.58564, 0.486709, 0.743816, 0.113868}, {-0.119422, -0.068416, 0.0994445, -0.0682922}, {7.04691, -0.108335, 1.24184, -0.391151}, {1.7388, 0.616757, -0.675779, -0.466783}, {4.55953, 1.51146, 0.229073, -0.710636}, {1.58459, 54.1275, 2.64155, -0.830851}, {1.40742, 0.419954, 0.205278, -0.0634113}, {0.155493, 0.0268308, 0.420006, -0.649933}, {-0.412752, -0.165416, 0.227556, 0.0527296}, {-0.0150927, 0.156442, -0.167257, 1.35914}, {1.57844, 1.87636, -1.55802, -1.27647}, {4.32305, 1.44742, 0.018111, -0.932781}, {1.51826, 0.475983, 0.928828, -0.110973}, {1.44199, 0.438942, -0.166804, -0.237697}, {1.6159, 0.508256, -0.153417, 0.0598641}, {4.4099, -0.223484, 1.22486, -0.989679}, {-0.417182, -0.196189, 0.175742, -0.479784}, {4.21205, 1.39679, 0.409328, -1.23406}, {1.52219, 0.515755, 0.747731, -0.277799}, {4.33873, 1.46298, 0.16538, -1.39728}, {-0.147383, -0.0334498, -0.0658136, 0.354362}, {4.48556, 1.5097, 0.0646347, -1.71956}, {1.29579, 0.389017, 0.662061, -0.140872}, {-0.600514, -0.192026, 0.1357, 0.262381}, {1.56061, 0.489921, 0.691124, -1.04114}, {4.33176, 1.45909, 0.157378, -0.122542}, {0.0243707, -0.0138399, -0.00227129, 0.436168}, {-0.126411, -0.034501, -0.0943018, -0.288632}, {-0.411966, -0.146508, 0.106961, 0.146726}, {-0.0852587, 2.90966, -0.424339, 1.34965}, {4.32221, 1.45467, 0.149503, -0.51483}, {-0.0919082, -0.0226124, -0.101104, -0.231984}, {4.30853, 1.45163, 0.0949485, -1.37031}, {1.64575, 0.571169, -0.726187, -0.281289}, {-0.465277, 3.23655, 0.334352, 0.241304}, {-0.121693, -0.0849372, -0.1416, 0.0372217}, {4.96632, 2.29884, -0.231812, 17.5906}, {4.30659, 1.39352, 0.140713, -0.0784436}, {4.4392, 1.43344, 0.131112, 0.259725}, {4.41248, 1.45761, 0.119429, -0.931113}, {0.274553, 0.160959, -0.668673, 0.617419}, {-0.150884, -0.04771, -0.0567933, 0.0784021}, {-0.144322, -0.0377289, 0.0207521, 0.336545}, {1.57358, 0.482723, 0.880484, 0.085618}, {0.0138246, 0.0171869, 0.0406295, 0.00110589}, {1.4956, 0.487669, -0.0871496, -0.791784},
```

```

{2.09621, 0.660805, -0.223478, -0.0647325}, {1.27373, 2.1075, -1.78222, 5.23462},
{1.26638, 0.376752, 0.514064, -0.231285}, {-0.0314041, -0.0116796, 0.230149, -0.0401466},
{4.43672, 1.48498, 0.0411754, -1.615}, {1.60926, 49.6388, 2.754, -0.307621},
{4.45334, 1.50845, 0.452546, 0.257073}, {1.57541, 0.461274, -0.606775, 0.156388},
{1.4132, 0.429337, 0.631037, -0.842153}, {0.386378, 0.123086, 0.103339, -0.35372},
{1.67537, 0.77548, -0.11876, 6.38472}, {1.57535, 0.483244, 0.539831, -0.818314},
{0.0399521, 0.0273513, -0.303406, 0.11466}, {-0.101981, -0.0730748, 0.0594819, -0.270843},
{1.63506, 0.508726, -0.0471561, 0.165475}, {4.4125, 1.45832, 0.11919, -0.970526},
{4.45338, -0.164509, 0.348228, -0.973117}, {1.62746, 0.505202, 0.259008, -0.441828},
{0.0764776, 3.39814, 0.304573, 1.42654}, {1.63434, 50.946, 2.67202, -0.441219},
{1.82992, 0.821037, -0.874632, 7.15298}, {-0.0679124, -0.0391669, -0.513102, -0.0637414},
{4.44323, 1.63122, 0.508811, -0.0509003}, {0.0556002, 0.00716308, -0.272125, 0.0680498},
{4.45707, 1.51267, 0.405887, 0.358443}, {-0.371186, -0.127642, 0.228041, 0.268968},
{-0.057673, 2.98569, 0.139688, 1.17418}, {1.63297, 0.503982, 0.305581, -0.668364},
{-0.66575, 0.152396, -0.291227, 0.278477}, {-0.399686, 0.242426, -0.514248, 0.802885},
{4.42265, 1.45785, 0.137905, -1.17509}, {1.49509, 0.455243, -0.0896952, 0.0434317},
{4.31003, 1.43144, 0.445894, -1.44233}, {4.45889, -0.325614, 0.653863, -0.141473},
{4.43027, 1.50962, 0.1537, 0.265605}, {0.00366113, 0.0131032, -0.0704925, 0.246807},
{-0.188486, -0.0325085, 0.0644465, 0.940465}, {1.42282, 0.51885, -0.660949, -0.313692},
{2.14954, -0.33496, -0.0882071, -0.739392}, {0.102056, 0.0566908, -0.395132, -0.0414638},
{4.42514, 1.50205, -0.0396055, -1.38956}, {2.31642, 0.745633, 0.254867, -0.538111},
{4.37195, -0.291512, 0.604013, -0.17279}, {4.4293, 1.46205, 0.145284, 0.379579},
{-0.499211, -0.181391, 0.0619166, -0.441011}, {4.47085, 1.47732, -0.00737887, -0.320186},
{1.18436, 0.346026, -0.164087, 0.106099}, {4.38537, 1.46853, -0.00796439, -1.41968},
{2.17816, -0.302777, -0.0735855, -0.996515}, {-0.454797, -0.143704, 0.0399325, 0.481125},
{4.46451, 1.44926, 0.10449, -0.125841}, {-0.0675971, 0.0422442, -0.116828, 1.01088},
{1.4227, 0.431598, 0.485325, -0.219254}, {0.172344, 0.0596894, -0.117291, 0.202177},
{-0.0510201, -0.049044, 0.371692, -0.468984}, {2.20427, 0.705813, 0.241508, -0.829322},
{1.80394, 0.643127, -0.800903, 0.118}, {0.133247, 3.2842, 0.170244, 1.61795},
{6.58922, 0.03444402, 0.108731, -1.01986}, {1.40614, 0.420526, -0.125442, 0.139677},
{2.06112, 51.6767, -0.636636, 3.31565}, {-0.144482, -0.0853388, 0.0635054, 0.390362},
{-0.173313, -0.107014, 0.232003, -0.528295}, {4.46415, 1.46223, 0.117971, 0.0430568},
{4.32383, 1.43233, 0.180002, -1.22719}, {-0.213272, -0.0903979, -0.0210333, -0.431849},
{2.59365, 1.25348, -1.0094, 9.12422}, {0.168194, 0.978404, -1.31372, 2.35016},
{-0.599496, -0.205584, -0.530634, -0.0454282}, {-0.00971221, -0.0365408,
0.00127594, -0.0465751}, {1.56998, 0.484603, 0.834463, -0.882184},
{4.43019, -0.15736, 0.27112, -0.975164}, {-0.523234, -0.198845, 0.142098, -0.460713},
{-0.573644, -0.236251, -0.519501, -0.0173229},
{4.56136, 1.49805, 0.107076, -1.15912}, {0.00737828, -0.053671, -0.0601231, 0.163379},
{1.94332, 0.971049, -0.480268, 8.34032}, {-0.164132, -0.0865463, 0.199043, -0.576818},
{-0.166569, -0.0938149, 0.249121, -0.578239}, {4.43311, 1.49351, 0.142002, -1.5216},
{1.40568, 0.443456, 0.480841, -0.117741}, {1.57794, 15.935, 0.983862, 2.18896},
{4.53671, 1.49927, 0.176557, -1.16951}, {-0.23658, -0.102313, 0.0199063, -0.516961},
{4.46998, 1.5176, 0.454116, 0.0926292}, {1.53186, 0.477045, 0.672143, -1.06384},
{4.41817, 1.45753, 0.245328, -1.24602}, {0.0339199, 0.0439102, -0.555801, 0.311461},
{0.868868, 0.200762, 0.626515, -0.172193}, {4.46206, 1.5125, 0.447426, 0.329314},
{4.2931, 1.45157, 0.14312, -1.71362}, {1.91169, 0.668277, -0.582986, 0.218633},
{1.94462, -0.428913, 0.828992, -0.595705}, {0.128367, 3.27168, 0.189025, 1.72875},
{4.32225, 1.44134, 0.583597, -1.47055}, {1.93791, 0.900031, -0.602208, 7.26948},
{1.29233, 2.0247, -1.19711, 5.281}, {-0.48458, -0.192407, 0.153363, -0.400357},
{4.32662, 1.45951, 0.0886266, -0.14338}, {2.2013, 0.705962, 0.316815, -0.827208},

```

```
{1.56588, 0.484586, 0.725621, -0.838421}, {1.28445, 0.387545, 0.386266, -0.326606},  
{4.29668, 1.43217, 0.256536, -0.514281}, {4.22695, 1.39819, 0.0193985, -0.455277},  
{-0.477128, -0.145066, 0.105612, 0.487599}, {4.73255, 2.16712, 0.158865, 13.9383},  
{-0.114794, -0.0243393, -0.121475, 0.440084}, {0.047901, 0.0805471, 0.0102614, 1.8352},  
{0.530901, -0.464623, 0.869952, 1.55}, {-0.0801862, -0.0359589, 0.00840922, -0.328976},  
{0.0142303, 2.93682, 0.0336155, 1.27494}, {4.39562, -0.171481, 0.35032, -0.966773},  
{-0.185, -0.0799419, 0.288242, -0.503056}, {-0.0101986, 0.00998262, 0.0214192, 0.323224},  
{-0.447803, -0.183699, 0.143782, -0.295968}, {1.91671, 69.1892, -0.577457, 0.249745},  
{5.38487, -0.0839568, 0.384251, -1.05139}, {4.3287, 1.44695, 0.577103, -1.36449},  
{2.25794, 0.724113, 0.27683, -0.835477}, {1.89797, 1.04174, -1.37096, 7.70224},  
{4.7528, 2.15475, -0.163187, 15.6286}, {4.42446, 1.4984, 0.0080515, -0.0687516},  
{0.0254101, 0.0336381, -0.198897, -0.026316}, {1.41967, 0.433048, 0.678598, -0.841559},  
{4.42785, 1.47845, 0.593405, -1.5787}, {-0.102622, -0.0563767, -0.269564, -0.12297},  
{-0.0518801, 3.03242, 0.144669, 1.782}, {0.658563, 0.157789, 0.355479, -0.209201},  
{-0.113793, 2.92426, -0.173713, 1.15931}, {-0.528735, -0.193085, 0.266189, 0.240889},  
{1.57904, 0.549166, -0.623544, 0.133686}, {-0.0422697, 3.00009, 0.118075, 1.21408},  
{1.29347, 0.364907, -0.313854, 0.387236}, {4.43361, 1.44018, 0.152222, -0.375391},  
{1.96889, -0.448319, 0.543824, -0.372064}, {-0.103244, -0.0748669, 0.21707, -0.527121},  
{1.54286, 0.462162, -0.0529618, 0.120343}, {0.65557, 0.154164, 0.410448, -0.192205},  
{1.94714, 0.692522, 0.991077, 0.375934}, {2.07921, 0.767024, -0.0941637, 2.42757},  
{4.43094, 1.49645, 0.0400789, -1.22274}, {4.4214, 1.50659, -0.0912397, -0.628304},  
{1.24655, 0.37555, 0.524463, -0.493163}, {1.59723, 45.5235, 1.54902, 0.288784},  
{0.0362492, 0.0479065, -0.340824, 0.410904}}}}
```