

# Assignment Games Maximum Score for the C Block

## PCS Auction

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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  $\text{pop} \cdot \text{eligibility}$  is 1.

Opening Stuff

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## 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 = 0.00000000000000000001;
(* 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["biddercblk_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 Asset 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/BTADData/C Block Form 175s Ali Manning"]; *)
form175data = Import["fccform175nomiss.csv"];
assetsdata = form175data[[All, 2]] / 1000 000 // N;
revenueData = form175data[[All, 3]] / 1000 000 // N;

bidderdata[[67, 4]] = form175data[[67, 4]];
eligibilitydata[[67]] = Rationalize[form175data[[67, 4]], rationals] / 1000 000;
```

## ■ Read in synergy data

```
(L2) In[62]:= (* SetDirectory["/Users/fox/Documents/Phones/FCC/BTADData/Pat_Package_2004_10_05"]; *)
geographicdistancematrix =
  Import["geographic distance population weighted centroid.csv"];
geographicdistancematrixkm = geographicdistancematrix / 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/BTADData/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[{1, marketdata[[1, 2]], {marketdata[[1, 4]]}, {bidderdata[[marketdata[[1, 5]], 3]]},
    marketdata[[1, 5]], bidderdata[[marketdata[[1, 5]], 1]]}, {1, 1, 493}];
```

```
(L2) In[74]:= 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}},
  {{Cellutec}, {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.}},
  {{PCSPlus}, {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[79]:= packageswapsonewayPreRobust =
  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[[packageswapsonewayPreRobust[[1]]]]],
    {1, licenseswapsonewaynumPreRobust}]]];
```

### ■ Compare to eligibility

```
(L2) In[83]:= popLessThanEligPreRobust = Table[
  pack1waypopPreRobust[[1]] < eligibilitydatareal[[ packages1swapwinnerpackPreRobust[[ 1]] ]],
  {1, licenseswapsonewaynumPreRobust}];
Tally[popLessThanEligPreRobust]

(L2) Out[84]= {{True, 73 409}, {False, 148 975}}
```

### ■ Redo key variables

```
(L2) In[85]:= licenseswapsoneway =
  ToPackedArray[Pick[ licenseswapsonewayPreRobust, popLessThanEligPreRobust ]];
licenseswapsonewaynum = Length[licenseswapsoneway]
packageesswapsoneway =
  ToPackedArray[Pick[packageesswapsonewayPreRobust, popLessThanEligPreRobust ]];
packages1swapwinnerpack = ToPackedArray[
  Pick[packages1swapwinnerpackPreRobust, popLessThanEligPreRobust ]];

(L2) Out[85]= 73 409
```

### ■ 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[[ btastouselookupbta[[#[[2]] ]]] ] &];
combinationspackageslicensesdiffpacknum = Length[combinationspackageslicensesdiffpack]

(L2) Out[90]= 40 320
```

#### ■ 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]:= winnerpackladd = combinationspackageslicensesdiffpack[[All, 1]];
winnerpacklsub = enclosingpackage;
```



## ■ Pop, price, pop\*eligibility & density\*pop

### ■ Population

(L2) In[96]:=

```
packlwaypop =
  ToPackedArray[ Table [ Total[ populationdatareal[[packageswapsoneway[[1]] ] ] ],
    {1, licenseswapsonewaynum} ] ];
packwinpop = Table [ Total[ populationdatareal[[winningpackagesusable[[1]] ] ] ],
  {1, winningpackagesusablenum} ];
packldiffpop = packwinpop[[packageslswapwinnerpack]] - packlwaypop;

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

packladddiffpop = packwinpop[[winnerpackladd]] - packladdpop;
packlsubdiffpop = packwinpop[[winnerpacklsub]] - packlsubpop;
```

### ■ Price

(L2) In[103]:=

```
pricedatareal = N[pricedata];
packlwayprice = ToPackedArray[ Table [
  Total[ pricedatareal[[packageswapsoneway[[1]] ] ] ], {1, licenseswapsonewaynum} ] ];
packwinprice = Table [ Total[ pricedatareal[[winningpackagesusable[[1]] ] ] ],
  {1, winningpackagesusablenum} ];
packldiffprice = packwinprice[[packageslswapwinnerpack]] - packlwayprice;

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

packladddiffprice = packwinprice[[winnerpackladd]] - packladdprice;
packlsubdiffprice = packwinprice[[winnerpacklsub]] - packlsubprice;
```

### ■ Pop\*eligibility

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

```
(L2) In[111]:=
packlwayelig = ToPackedArray[
  Table [ eligibilitydatareal[[ uniquewinnersusable[[ packageslswapwinnerpack[[1]]]]],
    {1, licenseswapsonewaynum}]]];
packlwayoptimeselig = packlwaypop packlwayelig;

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

packldiffpopoptimeselig =
  packwinoptimeselig[[packageslswapwinnerpack]] - packlwayoptimeselig;

packladdelig = ToPackedArray[ Table [ eligibilitydatareal[[ uniquewinnersusable[[
  combinationspackageslicensesdiffpack[[1,1]]]]], {1, packagesaddsnum}]]];
packladdpopoptimeselig = packladdpop packladdelig;

packlsubelig = ToPackedArray[
  Table [ eligibilitydatareal[[ marketdata[[ btastouse[[1]],5]]], {1, btastousenum}]]];
packlsubpopoptimeselig = packlsubpop packlsubelig;

packladddiffpopoptimeselig = packwinoptimeselig[[winnerpackladd]] - packladdpopoptimeselig;
packlsubdiffpopoptimeselig = packwinoptimeselig[[winnerpacklsub]] - packlsubpopoptimeselig;
```

#### ■ Sum (density license \* pop license)

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

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

packldiffdensitypop = packwindensitypop[[packageslswapwinnerpack]] - packlwaydensitypop;

packladddensitypop = ToPackedArray[ Table [
  Total[ populationdatareal[[ packagesadds[[1]]]] densityreal[[packagesadds[[1]]]]],
  {1, packagesaddsnum}]]];
packlsubdensitypop = ToPackedArray[ Table [
  Total[ populationdatareal[[ packagesubtracts[[1]]]]
    densityreal[[packagesubtracts[[1]]]]], {1, btastousenum}]]];

packladddiffdensitypop = packwindensitypop[[winnerpackladd]] - packladddensitypop;
packlsubdiffdensitypop = packwindensitypop[[winnerpacklsub]] - packlsubdensitypop;
```

#### ■ 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) ln[133]:=

```

populationdatarealtimes100 = populationdatareal 100;

packlwaygeodist =
  ToPackedArray[ Table [ Total[ populationdatareal[[package swapsone way[[1]] ] ]
    Total[ Transpose[ KroneckerProduct[ populationdatarealtimes100[[
      package swapsone way[[1]] ] ], populationdatarealtimes100[[
      package swapsone way[[1]] ] ] ] / btadistancesdiomilestenforown[[
      package swapsone way[[1]], package swapsone way[[1]] ] ] ] ] /
    Total[ Transpose[ KroneckerProduct[ populationdatarealtimes100[[
      package swapsone way[[1]] ] ], populationdatarealtimes100[[btastouse ] ] ] /
      btadistancesdiomilestenforown[[ package swapsone way[[1]], btastouse ] ] ] ] ] /
    Total[populationdatareal[[package swapsone way[[1]] ] ] ], {1,
    licenseswapsone waynum} ] ];

packwinggeodist = 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} ] ];

packldiffgeodist = packwinggeodist[[packageslswapwinnerpack]] - packlwaygeodist;

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[[packagestracts[[1]]]] Total[ Transpose[
      KroneckerProduct[ populationdatarealtimes100[[packagestracts[[1]]]],
        populationdatarealtimes100[[packagestracts[[1]]]] ] /
      btadistancesdiomilestenforown[[ packagestracts[[1]],
        packagestracts[[1]]]] ] ] /
    Total[ Transpose[ KroneckerProduct[ populationdatarealtimes100[[
      packagestracts[[1]]]], populationdatarealtimes100[[btastouse]] ] ] /
      btadistancesdiomilestenforown[[ packagestracts[[1]], btastouse]] ] ] ] /
    Total[populationdatareal[[packagestracts[[1]]]]], {1,
      btastousenum}]]];

pack1subgeodist = pack1subgeodistpre /. Indeterminate -> 0.0;

pack1ladddiffgeodist = packwinggeodist[[winnerpack1ladd]] - pack1laddgeodist;
pack1subdiffgeodist = packwinggeodist[[winnerpack1sub]] - pack1subgeodist;

```

#### ■ Airline travel synergies

Not fixed to not decrease when adding licenses

```

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

packlwayairtrav =
  ToPackedArray[Monitor[ Table [Total[ populationdatareal[[packageswapsoneway[[1]] ]]]
    Total[Transpose[airlinetravelmatrixreal[[packageswapsoneway[[1]],
      packageswapsoneway[[1]] ]]] ] / Total[Transpose[
      airlinetravelmatrixreal[[packageswapsoneway[[1]], btastouse ]]] ] /
    Total[populationdatareal[[packageswapsoneway[[1]] ]]] ],
    {1, licenseswapsonewaynum}] , 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, winningpackagesusableenum}] ];

packldiffairtrav = packwinairtrav[[packages1swapwinnerpack]] - packlwayairtrav;

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*)

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

packlsubairtrav = packlsubairtravpre /. Indeterminate -> 0.0;

packladddiffairtrav = packwinairtrav[[winnerpackladd]] - packladdairtrav;
packlsubdiffairtrav = packwinairtrav[[winnerpacklsub]] - packlsubairtrav;

```

#### ■ ATS travel survey synergies

Not fixed to not decrease when adding licenses

```

(L2) In[151]:= tripmatrixreal = ToPackedArray[ N[tripmatrix] + 0.00000001 ];

packlwayatstrav = ToPackedArray[
  Monitor[ Table [Total[ populationdatareal[[packageswapsoneway[[1]] ]]] Total[Transpose[
    tripmatrixreal[[packageswapsoneway[[1]], packageswapsoneway[[1]] ]]] ] /
    Total[Transpose[tripmatrixreal[[packageswapsoneway[[1]], btastouse]] ]]] /
    Total[populationdatareal[[packageswapsoneway[[1]] ]]]],
  {1, licenseswapsonewaynum}], 1] ];

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

packldiffatstrav = packwinatstrav[[packages1swapwinnerpack]] - packlwayatstrav;

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

packlsubatstravpre = Quiet[ToPackedArray[
  Table [Total[ populationdatareal[[packagesubtracts[[1]] ]]] Total[Transpose[
    tripmatrixreal[[packagesubtracts[[1]], packagesubtracts[[1]] ]]] ] /
    Total[Transpose[tripmatrixreal[[packagesubtracts[[1]], btastouse]] ]]] ] /
    Total[populationdatareal[[packagesubtracts[[1]] ]]]], {1, btastousenum}] ];

packlsubatstrav = packlsubatstravpre /. Indeterminate -> 0.0;

packladddiffatstrav = packwinatstrav[[winnerpackladd]] - packladdatstrav;
packlsubdiffatstrav = packwinatstrav[[winnerpacklsub]] - packlsubatstrav;

```

## ■ Eligibility \* geographic distance

```

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

packldiffgeodistelig = ToPackedArray[ packldiffgeodist packlwayelig ];

packaddgeodistelig = packladdgeodist packladdelig;
packsubgeodistelig = packlsubgeodist packlsubelig;

packladddiffgeodistelig = packwingeodistelig[[winnerpackladd]] - packaddgeodistelig;
packlsubdiffgeodistelig = packwingeodistelig[[winnerpacklsub]] - packsubgeodistelig;

```

## ■ Pop \* complementarities

### ■ Pop \* geographic distance

```
(L2) In[166]:= packwingedistpop = packwingedist packwinpop;

packldiffgeodistpop = ToPackedArray[ packldiffgeodist packlwaypop ];

packaddgeodistpop = packladdgeodist packladdpop;
packsubgeodistpop = packlsubgeodist packlsubpop;

packladddiffgeodistpop = packwingedistpop[[winnerpackladd]] - packaddgeodistpop;
packlsubdiffgeodistpop = packwingedistpop[[winnerpacklsub]] - packsubgeodistpop;
```

### ■ Pop \* air travel

```
(L2) In[172]:= packwinairtravpop = packwinairtrav packwinpop;

packldiffairtravpop = ToPackedArray[ packldiffairtrav packlwaypop ];

packaddairtravpop = packladdairtrav packladdpop;
packsubairtravpop = packlsubairtrav packlsubpop;

packladddiffairtravpop = packwinairtravpop[[winnerpackladd]] - packaddairtravpop;
packlsubdiffairtravpop = packwinairtravpop[[winnerpacklsub]] - packsubairtravpop;
```

### ■ Pop \* ATS

```
(L2) In[178]:= packwinatstravpop = packwinatstrav packwinpop;

packldiffatstravpop = ToPackedArray[ packldiffatstrav packlwaypop ];

packaddatstravpop = packladdatstrav packladdpop;
packsubatstravpop = packlsubatstrav packlsubpop;

packladddiffatstravpop = packwinatstravpop[[winnerpackladd]] - packaddatstravpop;
packlsubdiffatstravpop = packwinatstravpop[[winnerpacklsub]] - packsubatstravpop;
```

## ■ Put variables into toolkit data array

### ■ 1 way swaps

```
(L2) In[184]:= dataarraylway = ToPackedArray[ {packldiffprice, packldiffpop, packldiffpoptimeselig,
    packldiffdensitypop, packldiffgeodist, packldiffgeodistelig, packldiffairtrav,
    packldiffatstrav, packldiffgeodistpop, packldiffairtravpop, packldiffatstravpop}];
ByteCount[dataarraylway] / 1024.^2
```

```
(L2) Out[185]=
6.16085
```



### ■ 1 license adds

```
(L2) In[186]:= dataarrayladd =
  ToPackedArray[ {packladddiffprice, packladddiffpop, packladddiffpoptimeselig,
    packladddiffdensitypop, packladddiffgeodist, packladddiffgeodistelig,
    packladddiffairtrav, packladddifffatstrav, packladddiffgeodistpop,
    packladddiffairtravpop, packladddifffatstravpop}];
  ByteCount[dataarrayladd] / 1024.^2

(L2) Out[187]=
  3.38391
```

### ■ 1 license substractions

```
(L2) In[188]:= dataarraylsub =
  ToPackedArray[ {packlsubdiffprice, packlsubdiffpop, packlsubdiffpoptimeselig,
    packlsubdiffdensitypop, packlsubdiffgeodist, packlsubdiffgeodistelig,
    packlsubdiffairtrav, packlsubdifffatstrav, packlsubdiffgeodistpop,
    packlsubdiffairtravpop, packlsubdifffatstravpop}];
  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, btatousenum} ]];
```

### ■ 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, packwinpoptimeselig,
                                     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, 13 428}, {False, 21 531}}

(L2) Out[223]=
  13 428
```

### ■ For additions, find corresponding subtraction

```
(L2) In[225]:= addstosubtracts =
  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]] ]];
pack2diffpoptimeselig = pack1diffpoptimeselig[[ licenseswapstwowaydatapos[[All, 1]] ] +
  pack1diffpoptimeselig[[ 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]] ]];
pack2difffatstrav = pack1difffatstrav[[ licenseswapstwowaydatapos[[All, 1]] ] +
  pack1difffatstrav[[ licenseswapstwowaydatapos[[All, 2]] ]];
pack2diffgeodistpop = pack1diffgeodistpop[[ licenseswapstwowaydatapos[[All, 1]] ] +
  pack1diffgeodistpop[[ licenseswapstwowaydatapos[[All, 2]] ]];
pack2diffairtravpop = pack1diffairtravpop[[ licenseswapstwowaydatapos[[All, 1]] ] +
  pack1diffairtravpop[[ licenseswapstwowaydatapos[[All, 2]] ]];
pack2difffatstravpop = pack1difffatstravpop[[ licenseswapstwowaydatapos[[All, 1]] ] +
  pack1difffatstravpop[[ 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[[ licenseswapstwaway[[1, 1]] ] ] ],
    enclosingpackage[ [btatouselookupbta[[ licenseswapstwaway[[1, 2]] ] ] ] } ,
    {1, licenseswapstwawaynum} ] ];
```

Terms of winning licenses

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

## ■ Adds

Winning packages

```
(L2) In[254]:= datamap2add = datamap1add;
```

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 × 10-15, 5.72364 × 10-19, 8.61364 × 10-6, -1.52644 × 10-17, 0.0313777,
      0.000775067, 0.000310215, 0.0025149, 0.000190179, 9.03657 × 10-7, 0.0000226012}
```

```
(L2) Out[265]=
      {5.12596 × 10-15, 1.29898 × 10-18, 0.0000527769, 5.56963 × 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 × 10-14, 3.86828 × 10-19, 0.000739647, -1.6815 × 10-14, 0.0213145,
      0.00263436, 0.00216345, 0.00574934, 0.00134276, 0.000780605, 0.00100475}
```

```
(L2) Out[267]=
      {1.59101 × 10-13, 8.95295 × 10-18, 0.00333922, 6.30628 × 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]:= obj2waygeosynergyselignpopneg[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]:= obj2waygeosynergyselignpop[dataarray2add, 1.] // Timing
```

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

```
(L2) In[276]:= Timing[ans = pairwiseMSE[obj2waygeosynergyselignpop, 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[obj2waygeosynergyselignpop, 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[pointcrou1 = 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[pointcrou1 = 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}, {-1.02388, -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, -0.00832624, -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

```

estimateway3
estimateway3a = Join[{1}, estimateway3]

{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 estimateway3a
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 = mtapopmaxeligwinners;
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 [mtapopmtageodist] ,
  Total [mtapopmtaairtrav] , Total [mtapopmtaatstrav] }
packwincovarsparams = packwincovars estimateaway3a
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[
  airlinetravmatrixreal[[btasfourregions[[1]], btasfourregions[[1]] ]]] ] ] /
  Total[Transpose[airlinetravmatrixreal[[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

```
objleliggeo[data_, belig_, bgeo_] :=
  Module[ {values, onesorzeros},
    values = data[[1]] / 1000 000.0 + belig * data[[3]] + bgeo * data[[9]] + 0.000001;
    onesorzeros = values / Abs[values] + 1.0;
    Total[onesorzeros] / 2. / Length[data[[1]] ]
  ];

objleliggeoneg[data_, belig_, bgeo_] :=
  Module[ {values, onesorzeros},
    values = -data[[1]] / 1000 000.0 + belig * data[[3]] + bgeo * data[[9]] + 0.000001;
    onesorzeros = values / Abs[values] + 1.0;
    Total[onesorzeros] / 2. / Length[data[[1]] ]
  ];
```

### ■ Maximize, swaps

```
Dimensions[dataarraylway]

{11, 73 409}

objleliggeo[dataarraylway, 1., 1.] // Timing

{0.011998, 0.830756}

objleliggeo[dataarraylway, 10.^5, 10.^5] // Timing

{0.024997, 0.824027}

objleliggeo[dataarraylway, 10.^9, 10.^9] // Timing

{0.024996, 0.824027}

Do[ Print[Timing[ ans = pairwiseMSE[objleliggeo, dataarraylway,
  { belig, bgeodist}, nMaximizeOptions → {Method → {"DifferentialEvolution",
    "SearchPoints" → 75, "RandomSeed" → 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[objleliggeoneg, dataarraylway,
    { 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[objleliggeoneg, dataarraylway,
    { 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

```

estimateway2 = {belig, bgeodist} /. {belig → 0.36, bgeodist → 0.12}
{0.36, 0.12}

```

```
Timing[pointcrout1 = pointIdentifiedCR[25, 200, estimateway2,
  objleliggeoneg, {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, 0.535222}, {2.25171, 0.688274},
  {0.00417851, -0.062711}, {-0.0382223, -0.0201841}, {1.43369, 0.432906},
  {6.38899, -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}}}}}
```

0.914

## Swaps, air and ats

### ■ Objective function

```
objleliggeotrav[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]]]
];

objleliggeonegtrav[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

```
objleliggeonegtrav[dataarraylway, 3., 3., 3., 3.] // Timing

{0.034995, 0.877249}

Timing[ans = pairwiseMSE[objleliggeonegtrav, dataarraylway,
  {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[objleliggeonegtrav, dataarraylway, {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[objleliggeonegtrav, dataarraylway, { 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, dataarraylway,
  {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[pointcrout1 = pointIdentifiedCR[25, 200, estimateway1,
  objleliggeonegtrav, {belig, bgeodist, bair, bats}, datamaplway, dataarraylway,
  asymptotics → coalitions, nMaximizeOptions → {Method → {"DifferentialEvolution",
    "SearchPoints" → 150, "RandomSeed" → Floor[SessionTime[]] } } ] ]
{42002.9,
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