

AIR | FORUM 2017

**Visualizing Major Change
Using an Interactive Sankey
Diagram**

Who am I?

- Mark Davenport – Sr Research Associate, IR, UNCG
- I started computer programming in 1982; BASIC and COBOL
- My programming career lasted 6 months
- This fact will become relevant by the end of the presentation

Why am I here?

- Analytics and visualization are becoming increasingly important in higher ed
 - Patterns of major change from application through graduation are one important example
- IR must learn to do more with less
 - For every costly software solution, there is likely an open-source (free) alternative

Why major change?

- Can be an indicator of program viability
- Can provide predictive metrics for monitoring growth/decline, changing need for resources
- Can provide insights into changes in student interests/needs
- Can provide insights into retention/graduation anomalies

Monitoring program viability/change

- Do the students that start in a program stay with that program?
- How long does it take them to graduate?
- Do programs have unknown 'feeder' programs?
- Which programs loose the most students between Fall 1 and Fall 2? Fall 2 and Fall 3?

Change in student interest

- If students leave the program, where do they go (e.g., pre-professional majors that don't make the cut)?
- Is interest in particular majors dwindling/ballooning?
- Stop-out/drop-out patterns?

Outcome anomalies: An example

- Geography program at UNCG
- Fewer than 5 start in Geography as FT-FY new students but 20 of 30 may graduate
- Grad rate based only on the FT-FY cohort may swing wildly due to low numbers
- Geography picks up many 2nd- and 3rd-year from other data-intensive majors like computer science

An early attempt to map major change

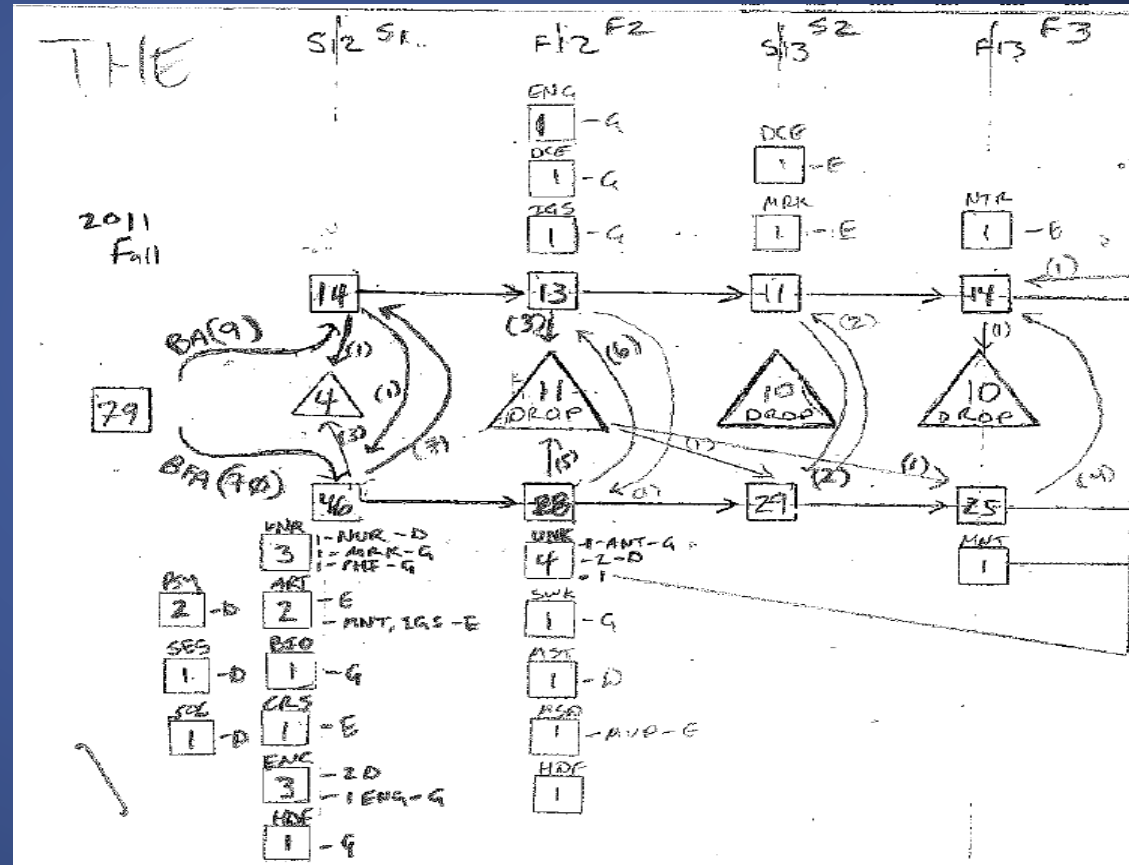
The raw data

	E	H	I	J	K	L	M	N
	GRADTERM	CONCDEG_STRING	DEPTF1_CNT	CONC_F1	CONCF1_CNT	DEG_F1	DEGF1_CNT	CONCDEGF1_CNT
1	201501	U104BAU104BAU104BAU104BAU104BAU104BAU104BAU104BAGGGGGGGG	84	U104	5	BA	26	5
2	201501	U104BAU104BAU104BAU104BAU155BAU155BAU155BAU155BAGGGGGGGG	84	U104	5	BA	26	5
3	201508	U104BAU104BAU189BAU190BAU190BAU190BAU190BAU190BAGGGG	84	U104	5	BA	26	5
4		U104BAU105BAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA	84	U104	5	BA	26	5
5	201508	U104BAU331BSU331BSU331BSU331BSU331BSU331BSU331BSG	84	U104	5	BA	26	5
6		U105BAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA	84	U105	21	BA	26	21
7		U105BAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA	84	U105	21	BA	26	21
8		U105BAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA	84	U105	21	BA	26	21
9		U105BAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA	84	U105	21	BA	26	21

An early attempt to map major change

The visualization

- Fall 2011 – 79 FT-FY new Theater students in 2 programs
- Boxes contain major headcounts in a fall term; triangles are stop/drop headcounts
- Arrows show flow between box/triangle elements



An early attempt to map major change

The problem?

- Tedious to create
- Impossible to explain

So, how do you visualize change

Visualization must show change as an aspect of resource flow through a system

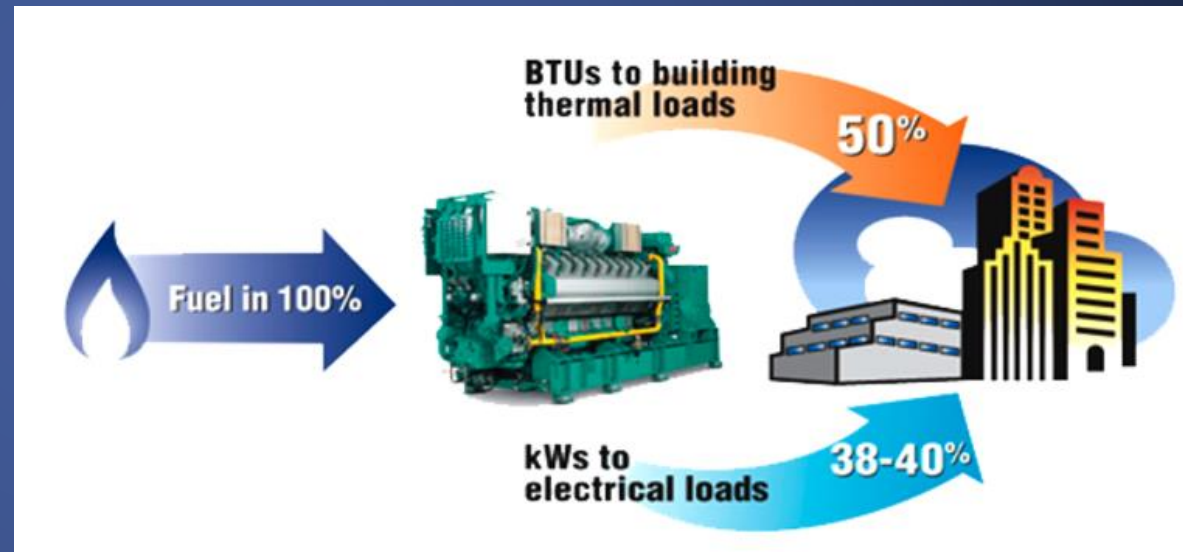


Image source: <http://aselca.com.co/en/environment/>

So, how do you visualize change

This subway chart shows many groups (as colored subway lines), but traffic might have been better represented making the lines larger/smaller between stops rather than inserting dots of various size.

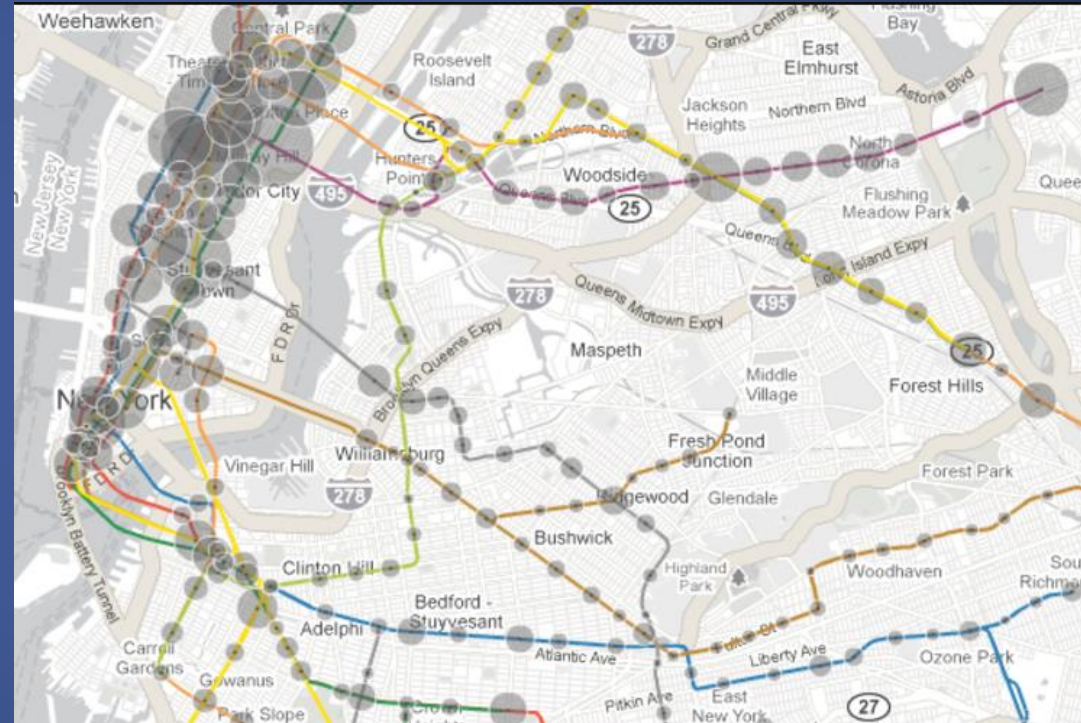


Image source: <http://research.prattsils.org/blog/coursework/information-visualization/visualizing-mta-subway-ridership-on-subway-map/>

So, how do you visualize major change

Our requirements:

- Linear time dimension
- Many, many groups at once
- Groups change in size from one time period to another
- Viz must document movement from group-to-group
- Ideally, viz can be scaled to show school/department-level changes

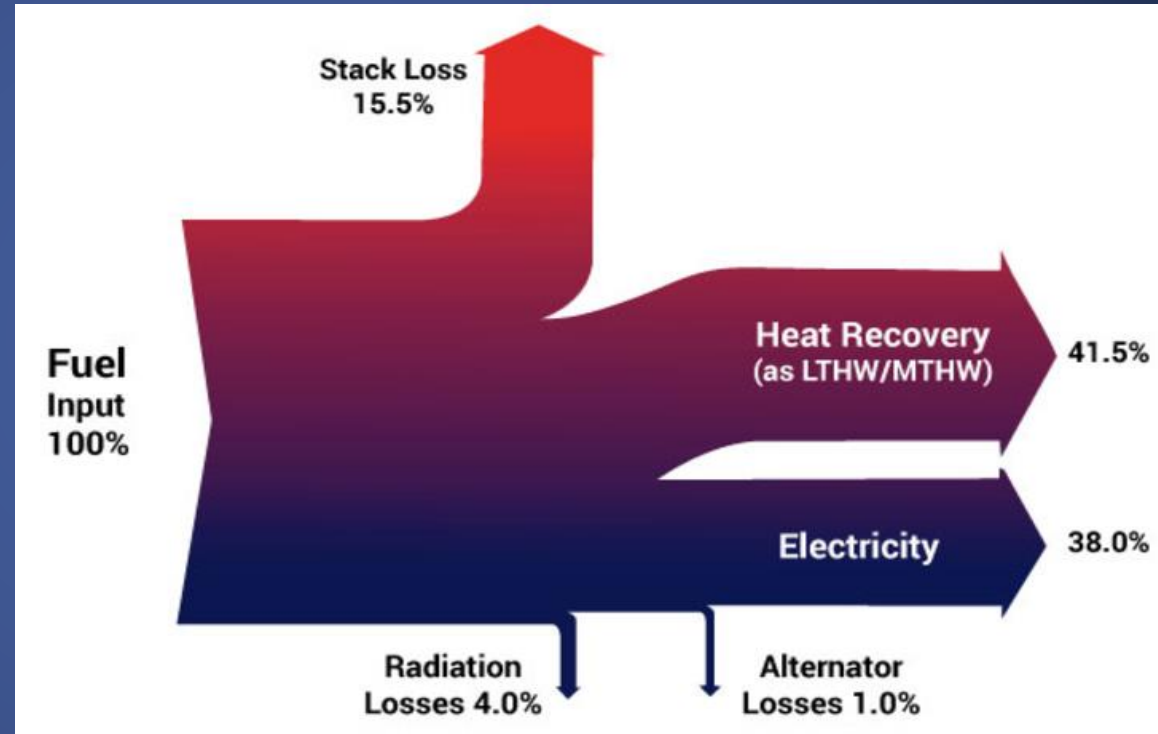


Image source: <http://aselca.com.co/en/environment/>

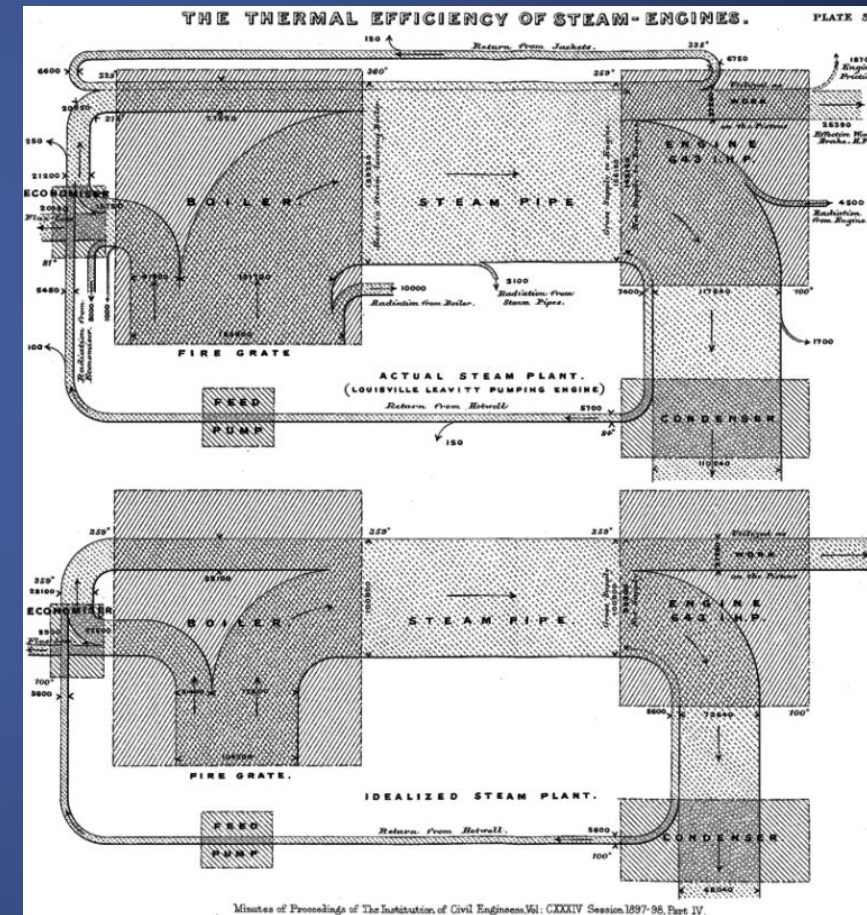
M-O-A-D-F-V*: The Sankey Diagram

Takes its name from Matthew Sankey and his diagram demonstrating the efficiency of a steam engine

The defining characteristics:

- 1) greater flow = wider path
- 2) lesser flow = narrower path
- 3) Paths indicate direction of flow

* Mother of all dynamic flow visualizations



The Prototypic Sankey Diagram

Charles Joseph Minard (1781-1870) French civil engineer and early pioneer of data visualization created this graphic to describe Napoleon's troop losses in Russia in 1812-13.

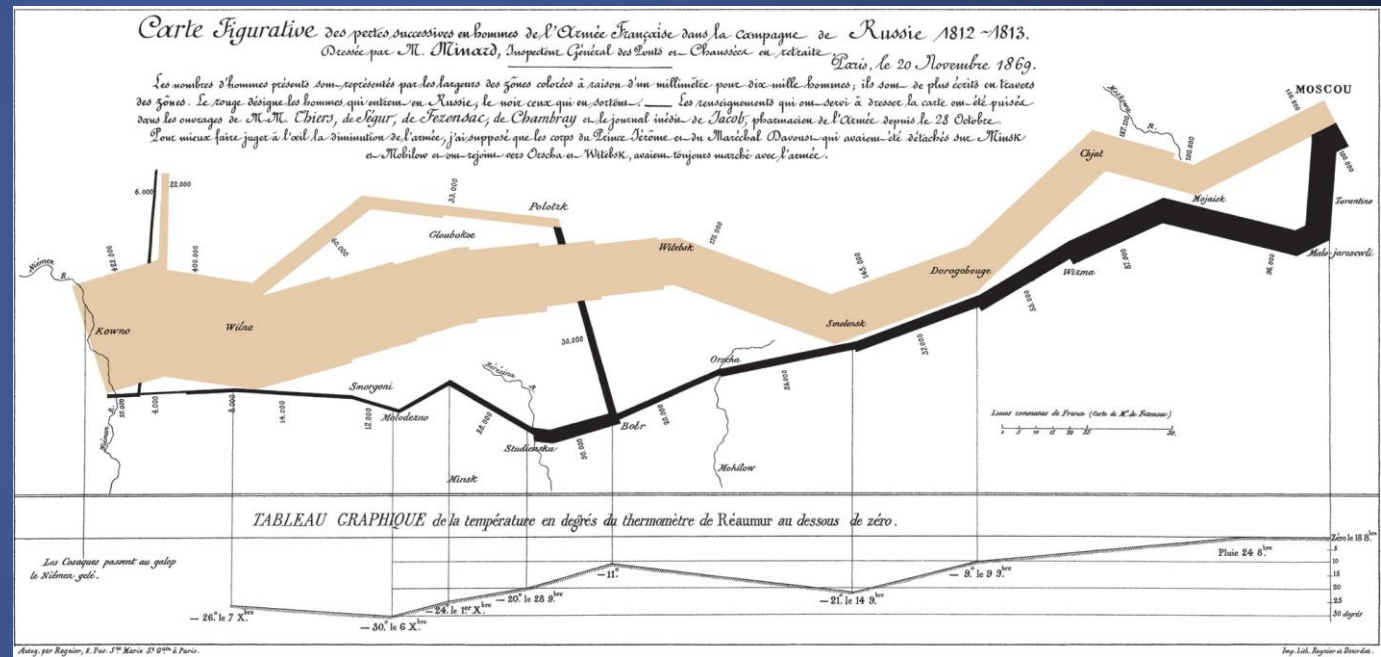


Image source: https://en.wikipedia.org/wiki/Charles_Joseph_Minard

The chart body represents a conceptual map of the route of the march from the Neiman river to Moscow, and back.

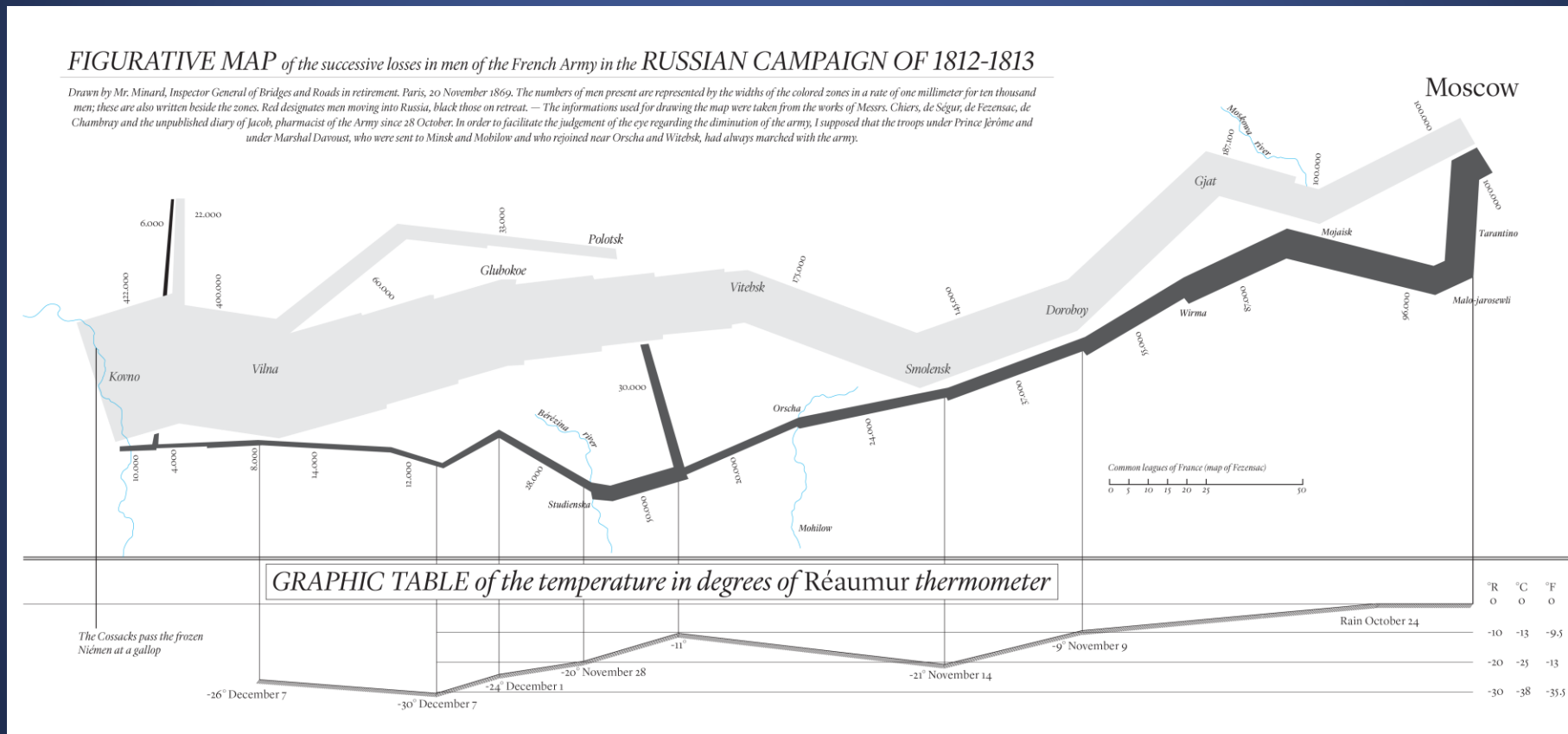


Image source: https://en.wikipedia.org/wiki/Charles_Joseph_Minard

Line size changes as troop strength shrinks as L'Armee de Nord moves into Russia and soldiers drop from battle, disease and cold. The light line shows movement into Russia, the dark line shows the retreat.

Minard added a line graph at the bottom that shows the relationship between the death rate and the temperature drop during the retreat.

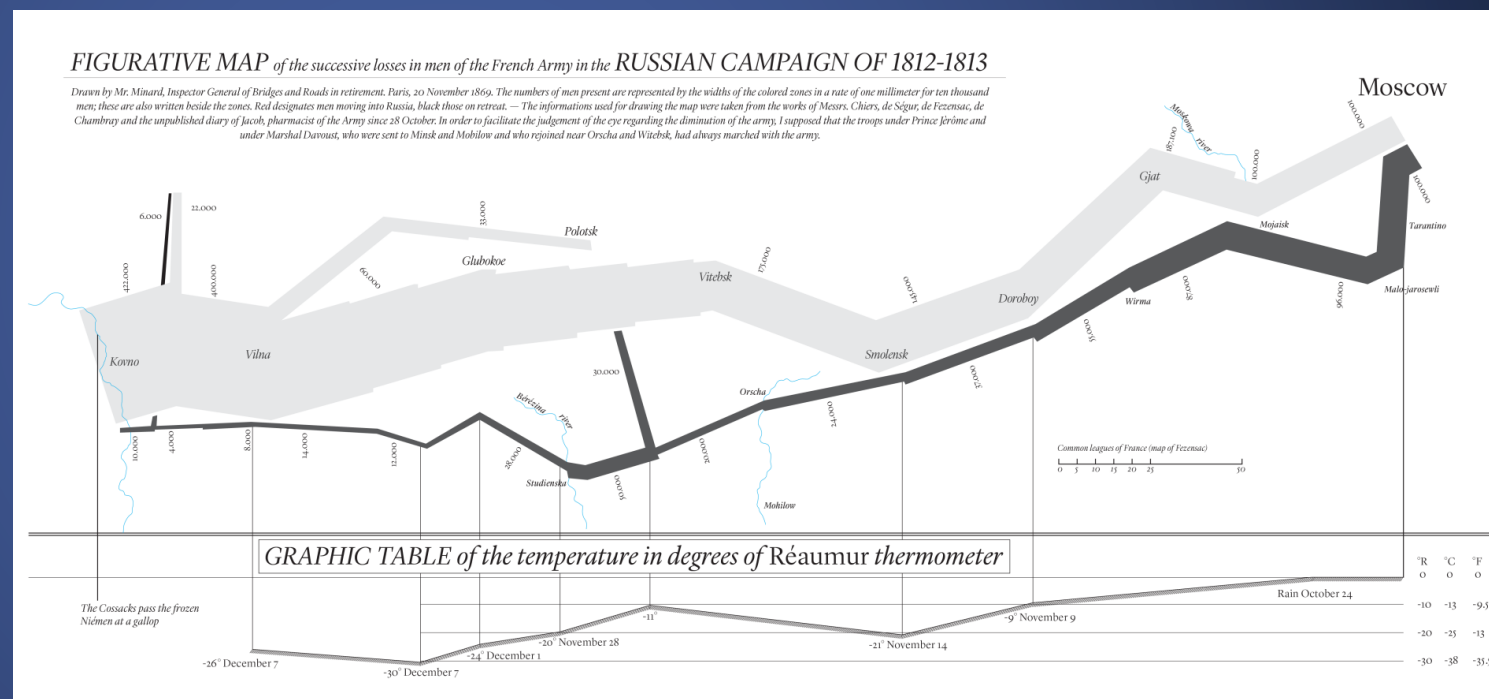


Image source: https://en.wikipedia.org/wiki/Charles_Joseph_Minard

Sankey diagram software

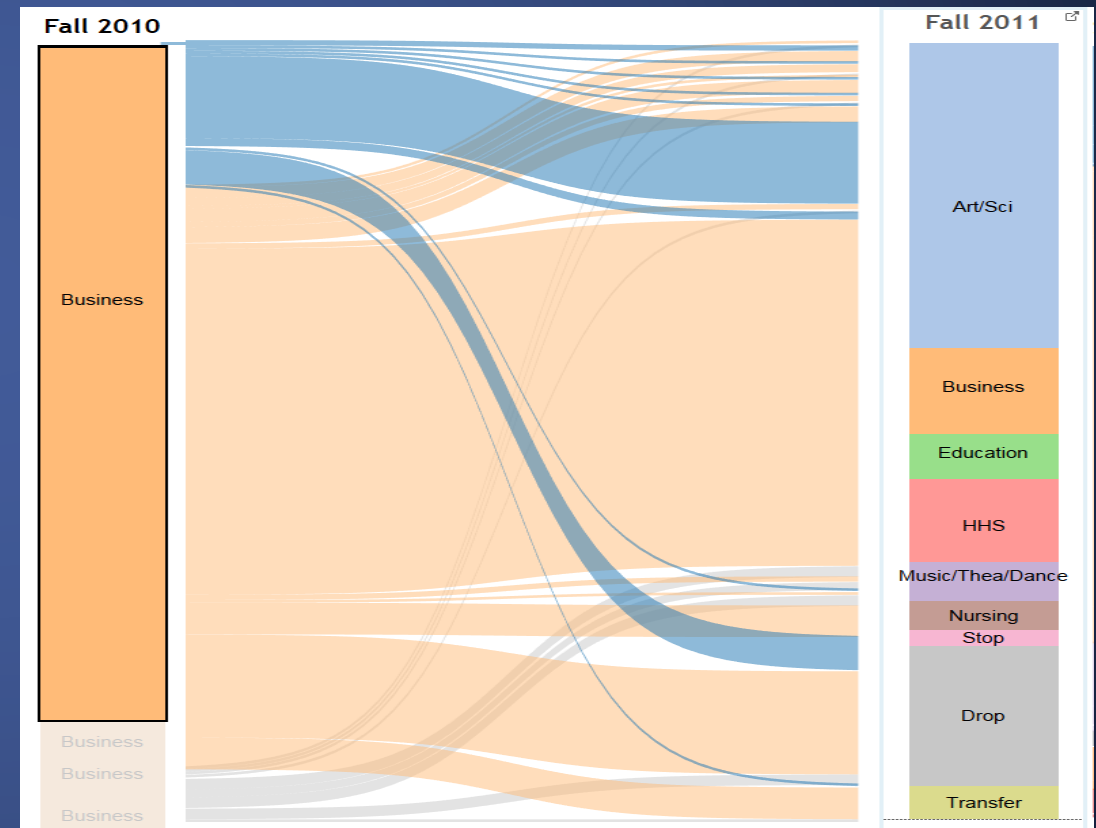
- **Google** <https://developers.google.com/chart/interactive/docs/gallery/sankey>
- **R packages: 'riverplot' 'googleVis'**
- **Tableau** <https://community.tableau.com/thread/152115>
- **D3** <https://bost.ocks.org/mike/sankey/>

Sankey diagram Tableau

Creating Sankey diagrams in Tableau can be complex and I found the interactivity options were limited.

You can find more here:

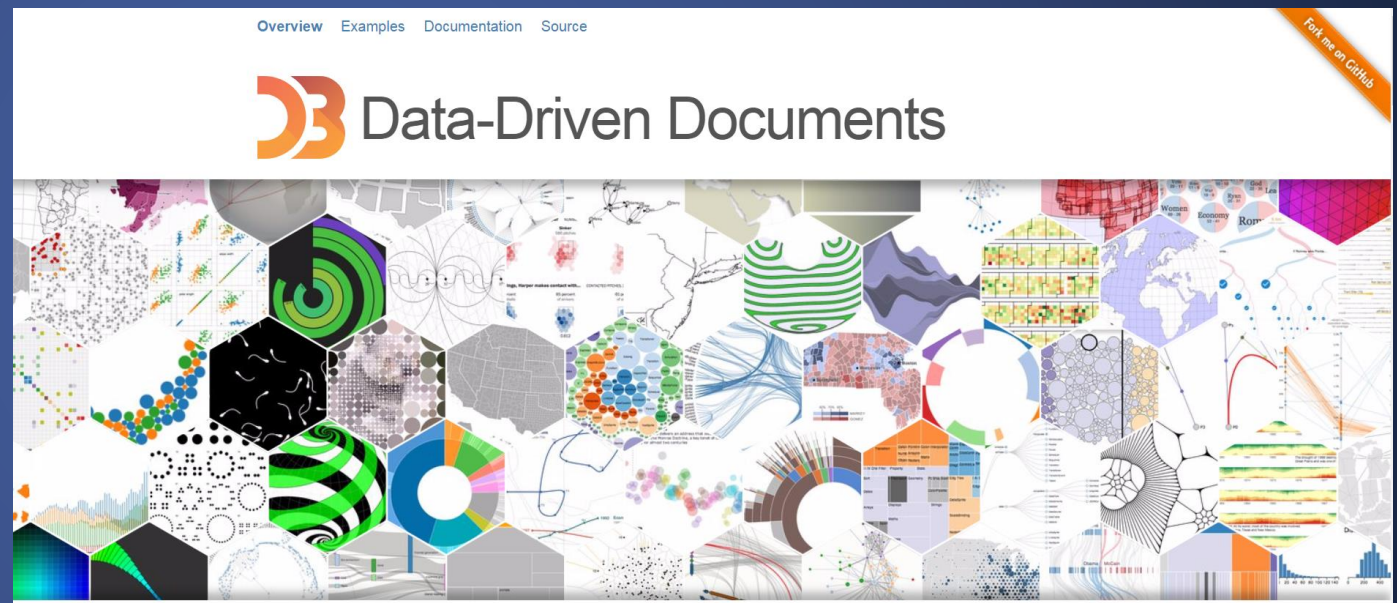
<https://community.tableau.com/thread/152115>



Sankey diagram D3

D3 is a javascript library designed to ease the process of making interactive web-visualizations

Steep learning curve but well worth the trip



The Interactive Major Movement Map (Imap)

Five-year IMap for the Bryan School of Business:

- http://ire.uncg.edu/research/Air-2017-Mark-Davenport/IMap_BE_Demo_5.html

Applied—Accepted—Enrolled IMap:

- http://ire.uncg.edu/research/Air-2017-Mark-Davenport/web_index_app.html

Data setup: Raw

PIDM	TERMCODE	DEGREE	MAJOR_F1	MAJOR_F2	MAJOR_F3	MAJOR_F4	MAJOR_F5	MAJOR_F6	COLL_F1	COLL_F2	COLL_F3	COLL_F4	COLL_F5	COLL_F6	GRADTERM	GRAD
1031109	201608	3	PSYC	SOCI	SOCI	DDDD	BADM	BADM	AS	AS	AS	ZZ	BE	BE		
1031102	201501	3	PSPE	PELM	ELED	ELED	GGGG	GGGG	ED	ED	ED	ED	AA	AA	201501	ED
1031094	201301	3	PHLT	PSWK	DDDD	DDDD	DDDD	DDDD	HH	HH	ZZ	ZZ	ZZ	ZZ		
1031093	201601	3	CHEM	UNDC	PSWK	SOWK	SOWK	GGGG	AS	AS	HH	HH	HH	AA	201601	HH
1031091	201508	3	DRAM	DRAM	DRAM	DRAM	DRAM	GGGG	VP	VP	VP	VP	VP	AA	201508	MT
1031089	201501	3	PELM	PELM	ELED	ELED	GGGG	GGGG	ED	ED	ED	ED	AA	AA	201501	ED
1031087	201201	3	PELM	DDDD	DDDD	DDDD	DDDD	DDDD	ED	ZZ	ZZ	ZZ	ZZ	ZZ		
1031082	201501	3	SOCI	SOCI	SOCI	SOCI	GGGG	GGGG	AS	AS	AS	AS	AA	AA	201501	AS
1031040	201301	3	PNUR	PHLT	DDDD	DDDD	DDDD	DDDD	NU	HH	ZZ	ZZ	ZZ	ZZ		
1031037	201501	3	PSCI	PSCI	PSCI	PSCI	GGGG	GGGG	AS	AS	AS	AS	AA	AA	201501	AS
1031036	201108	3	BADM	DDDD	DDDD	DDDD	DDDD	DDDD	BE	ZZ	ZZ	ZZ	ZZ	ZZ		
1031025	201501	3	UNDC	PSYC	PSYC	PSYC	GGGG	GGGG	AS	AS	AS	AS	AA	AA	201501	AS
1031018	201601	3	NUTR	NUTR	NUTR	NUTR	NUTR	GGGG	HH	HH	HH	HH	HH	AA	201601	HH
1031016	201501	3	PKIN	PKIN	PKIN	KINE	GGGG	GGGG	HH	HH	HH	HH	AA	AA	201505	HH
1031012	201508	3	ACCT	ACCT	HIST	HIST	HIST	GGGG	BE	BE	AS	AS	AS	AA	201508	AS
1031011	201408	3	PRDF	PRDF	PRDF	PRDF	GGGG	GGGG	ED	ED	ED	ED	AA	AA	201408	ED
1031005	201601	3	CMPS	CMPS	CMPS	CMPS	BIOL	GGGG	AS	AS	AS	AS	AS	AA	201601	AS
1031004	201308	3	PHLT	BIOL	BIOL	DDDD	DDDD	DDDD	HH	AS	AS	ZZ	ZZ	ZZ		
1031002	201308	3	PELM	BIOL	BIOL	DDDD	DDDD	DDDD	ED	AS	AS	ZZ	ZZ	ZZ		
1030998	201501	3	PHLT	PHLT	HDFS	HDFS	GGGG	GGGG	HH	HH	HH	HH	AA	AA	201501	HH
1030995	201501	3	DRAM	UNDC	ANTH	ANTH	GGGG	GGGG	VP	AS	AS	AS	AA	AA	201501	AS
1030989	201508	3	CHEM	BCHE	KINE	KINE	KINE	GGGG	AS	AS	HH	HH	HH	AA	201508	HH
1030978	201108	3	PSYC	DDDD	DDDD	DDDD	DDDD	DDDD	AS	ZZ	ZZ	ZZ	ZZ	ZZ		
1030976	201301	3	CHEM	SOCI	DDDD	DDDD	DDDD	DDDD	AS	AS	ZZ	ZZ	ZZ	ZZ		
1030927	201501	3	BADM	ECON	ECON	ECON	GGGG	GGGG	BE	BE	BE	BE	AA	AA	201501	BE

Step 1: Create Parent/Child pairs

MAJOR_STRING	MAJOR_STR_12	MAJOR_STR_23	MAJOR_STR_34	MAJOR_STR_45	MAJOR_STR_56	MAJORN_F1	MAJORN_F2
PSYCSOCISOCIDDDDBADM	PSYCSOCI	SOCISOCI	SOCIDDDD	DDDDBADM	BADMBADM	Psycholoav	Socioloav
PSPEPELMELEDELEDGGGGGGGG	PSPEPELM	PELMELED	ELEDELED	ELEDGGGG	GGGGGGGG	Social Ed - Elem Ed-Pre M...	Elementarv Ed-Pre Ma
PHLTPSWKDDDDDDDDDDDDDDDD	PHLTPSWK	PSWKDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Pre-Health Studies-Sciences	Pre-Social Work
CHEMUNDCPSWKSOWKSOWKGGGG	CHEMUNDC	UNDCPSWK	PSWKSOWK	SOWKSOWK	SOWKGGGG	Chemistrv	Undecided on Maior
DRAMDRAMDRAMDRAMGGGG	DRAMDRAM	DRAMDRAM	DRAMDRAM	DRAMDRAM	DRAMGGGG	Drama	Drama
PELMEPELMELEDELEDGGGGGGGG	PELPELM	PELMELED	ELEDELED	ELEDGGGG	GGGGGGGG	Elementarv Ed-Pre Maior	Elementarv Ed-Pre Ma
PELMDDDDDDDDDDDDDDDDDDD	PELMDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Elementarv Ed-Pre Maior	Dropped-Stopped-Tra
SOCISOCISOCISOCIGGGGGGGGG	SOCISOCI	SOCISOCI	SOCISOCI	SOCIGGGG	GGGGGGGG	Socioloav	Socioloav
PNURPHLTDDDDDDDDDDDDDDDD	PNURPHLT	PHLTDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Pre-Nursina	Pre-Health Studies-Sci
PSCIPSCIPSCIPSCIGGGGGGGGG	PSCIPSCI	PSCIPSCI	PSCIPSCI	PSCIGGGG	GGGGGGGG	Political Science	Political Science
BADMDDDDDDDDDDDDDDDDDDDD	BADMDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Business Administration	Dropped-Stopped-Tra
UNDCPSYCPYCPYCGGGGGGGGG	UNDCPSYC	PSYCPYCP	PSYCPYCP	PSYCGGGG	GGGGGGGG	Undecided on Maior	Psycholoav
NUTRNUTRNUTRNUTRGGGG	NUTRNUTR	NUTRNUTR	NUTRNUTR	NUTRNUTR	NUTRGGGG	Nutrition	Nutrition
PKINPKINPKINKINEGGGGGGGG	PKINPKIN	PKINPKIN	PKINKINE	KINEGGGG	GGGGGGGG	Pre-Kinesioloav	Pre-Kinesioloav
ACCTACCTHISTHISTHISTGGGG	ACCTACCT	ACCTHIST	HISTHIST	HISTHIST	HISTGGGG	Accountina	Accountina
PRDFPRDFPRDFPRDFGGGGGGGG	PRDFPRDF	PRDFPRDF	PRDFPRDF	PRDFGGGG	GGGGGGGG	Professions in Deafness	Professions in Deafnes
CMPSCMPSCMPSCMPSBIOGGGG	CMPSCMPS	CMPSCMPS	CMPSCMPS	CMPSBIO	BIOGGGG	Computer Science	Computer Science
PHLTBIOLBIOLDDDDDDDDDDDD	PHLTBIOL	BIOLBIOL	BIOLDDDD	DDDDDDDD	DDDDDDDD	Pre-Health Studies-Sciences	Bioloav
PELMBIOLBIOLDDDDDDDDDDDD	PELMBIOL	BIOLBIOL	BIOLDDDD	DDDDDDDD	DDDDDDDD	Elementarv Ed-Pre Maior	Bioloav
PHLTPHLTHDFSHDFSGGGGGGGGG	PHLTPHLT	PHLTHDFS	HDFSHDFS	HDFSGGGG	GGGGGGGG	Pre-Health Studies-Sciences	Pre-Health Studies-Sci
DRAMUNDCANTHANTHGGGGGGGG	DRAMUNDC	UNDCANTH	ANTHANTH	ANTHGGGG	GGGGGGGG	Drama	Undecided on Maior
CHEMBCHEKINEKINEKINEGGGG	CHEMBCHE	BCHEKINE	KINEKINE	KINEKINE	KINEGGGG	Chemistrv	Biochemistrv
PSYCDDDDDDDDDDDDDDDDDDD	PSYCDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Psycholoav	Dropped-Stopped-Tra
CHEMSOCIDDDDDDDDDDDDDDD	CHEMSOCI	SOCIDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Chemistrv	Socioloav
BADMECONECONECONGGGGGGGG	BADMECON	ECONECON	ECONECON	ECONGGGG	GGGGGGGG	Business Administration	Economics

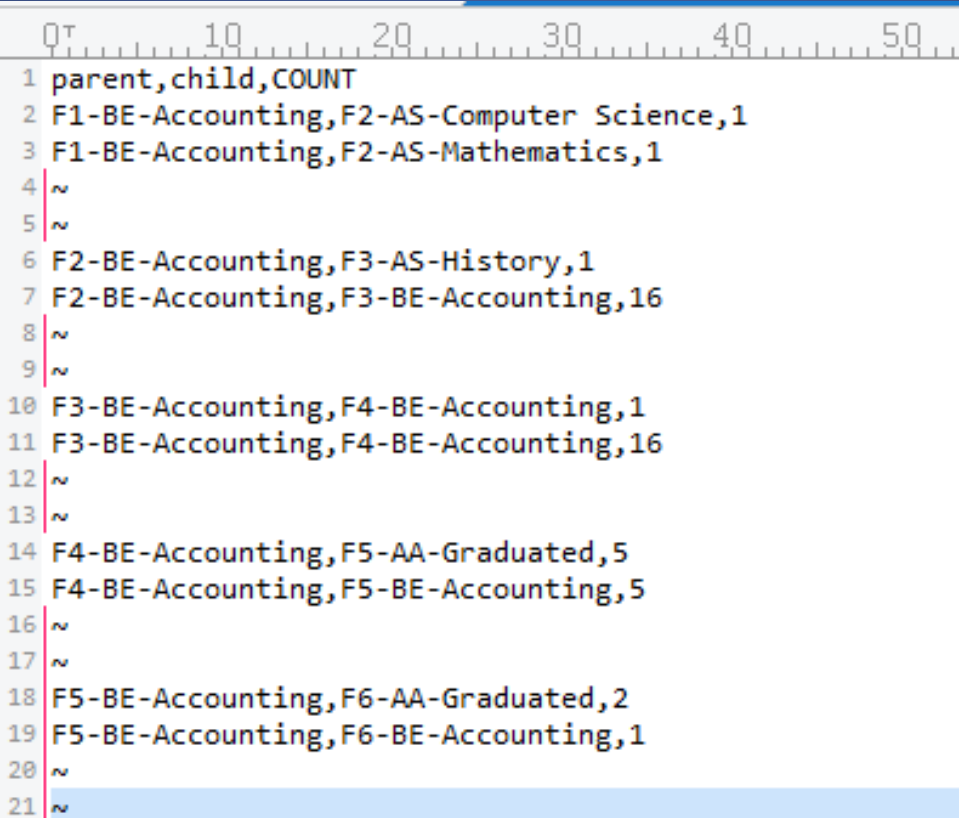
Step 2: Sort Parent/Child pairs

MAJOR_STRING	MAJOR_STR_12	MAJOR_STR_23	MAJOR_STR_34	MAJOR_STR_45	MAJOR_STR_56	MAJORN_F1	MAJORN_F2
AADSAADSAAADSAAAAADDDDDDDDD	AADSAADS	AADSAADS	AADSAADS	AADSDDDD	DDDDDDDD	Afr Amn-Afr Diaspora Studies	Afr Amn-Afr Diaspora Studies
ACCTACCTACCTACCTACCTDDDDDD	ACCTACCT	ACCTACCT	ACCTACCT	ACCTACCT	ACCTDDDD	Accountina	Accountina
ACCTACCTACCTACCTACCTGGGGG	ACCTACCT	ACCTACCT	ACCTACCT	ACCTACCT	ACCTGGGG	Accountina	Accountina
ACCTACCTACCTACCTGGGGGGGG	ACCTACCT	ACCTACCT	ACCTACCT	ACCTGGGG	GGGGGGGG	Accountina	Accountina
ACCTACCTACCTDDDDDDDDDDDDDD	ACCTACCT	ACCTACCT	ACCTDDDD	DDDDDDDD	DDDDDDDD	Accountina	Accountina
ACCTACCTACCTENTRETRGGGGG	ACCTACCT	ACCTACCT	ACCTENTR	ENTRETR	ENTRGGGG	Accountina	Accountina
ACCTACCTACCTFINCBADMGGGG	ACCTACCT	ACCTACCT	ACCTFINC	FINCBADM	BADMGGGG	Accountina	Accountina
ACCTACCTACCTFINCGGGGGGGG	ACCTACCT	ACCTACCT	ACCTFINC	FINCGGGG	GGGGGGGG	Accountina	Accountina
ACCTACCTARTARTARTGGGG	ACCTACCT	ACCTART	ARTART	ARTART	ARTGGGG	Accountina	Accountina
ACCTACCTBADMBADMBADMGGGGG	ACCTACCT	ACCTBADM	BADMBADM	BADMBADM	BADMGGGG	Accountina	Accountina
ACCTACCTBADMBADMGGGGGGGG	ACCTACCT	ACCTBADM	BADMBADM	BADMGGGG	GGGGGGGG	Accountina	Accountina
ACCTACCTDDDDDDDDDDDDDDDD	ACCTACCT	ACCTDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Accountina	Accountina
ACCTACCTECONECONECONGGGG	ACCTACCT	ACCTECON	ECONECON	ECONECON	ECONGGGG	Accountina	Accountina
ACCTACCTFINCFINCFINCDDDD	ACCTACCT	ACCTFINC	FINCFINC	FINCFINC	FINCDDDD	Accountina	Accountina
ACCTACCTHISTHISTHISTGGGG	ACCTACCT	ACCTHIST	HISTHIST	HISTHIST	HISTGGGG	Accountina	Accountina
ACCTACCTNUTRDDDDFINCFINC	ACCTACCT	ACCTNUTR	NUTRDDDD	DDDDFINC	FINCFINC	Accountina	Accountina
ACCTBADMBADMBADMGGGGGGGG	ACCTBADM	BADMBADM	BADMBADM	BADMGGGG	GGGGGGGG	Accountina	Business Administration
ACCTBADM SOCISOCIGGGGGGGG	ACCTBADM	BADM SOCI	SOCISOCI	SOCIGGGG	GGGGGGGG	Accountina	Business Administration
ACCTCMPS C MPSC MP SISS I S S C	ACCTCMPS	CMPS CMPS	CMPS CMPS	CMPS I S S C	ISS I S S C	Accountina	Computer Science
ACCTDDDDDDDDDDDDACCTACCT	ACCTDDDD	DDDDDDDD	DDDDDDDD	DDDDACCT	ACCTACCT	Accountina	Dropped-Stopped-Transferr...
ACCTDDDDDDDDDDDDDDDDDD	ACCTDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Accountina	Dropped-Stopped-Transferr...
ACCTFINCFINCINTBGGGGGGGGG	ACCTFINC	FINCFINC	FINCINTB	INTBGGGG	GGGGGGGG	Accountina	Finance
ACCTKINEACCTACCTACCTDDDD	ACCTKINE	KINEACCT	ACCTACCT	ACCTACCT	ACCTDDDD	Accountina	Kinesiolov
ACCTMATHMATHDDDDDDDDGGGG	ACCTMATH	MATHMATH	MATHDDDD	DDDDDDDD	DDDDGGGG	Accountina	Mathematics
ACCTUNDCDDDDDDDDDDDDDDDD	ACCTUNDC	UNDCDDDD	DDDDDDDD	DDDDDDDD	DDDDDDDD	Accountina	Undecided on Maior

Step 3: Make labels, aggregate, and count

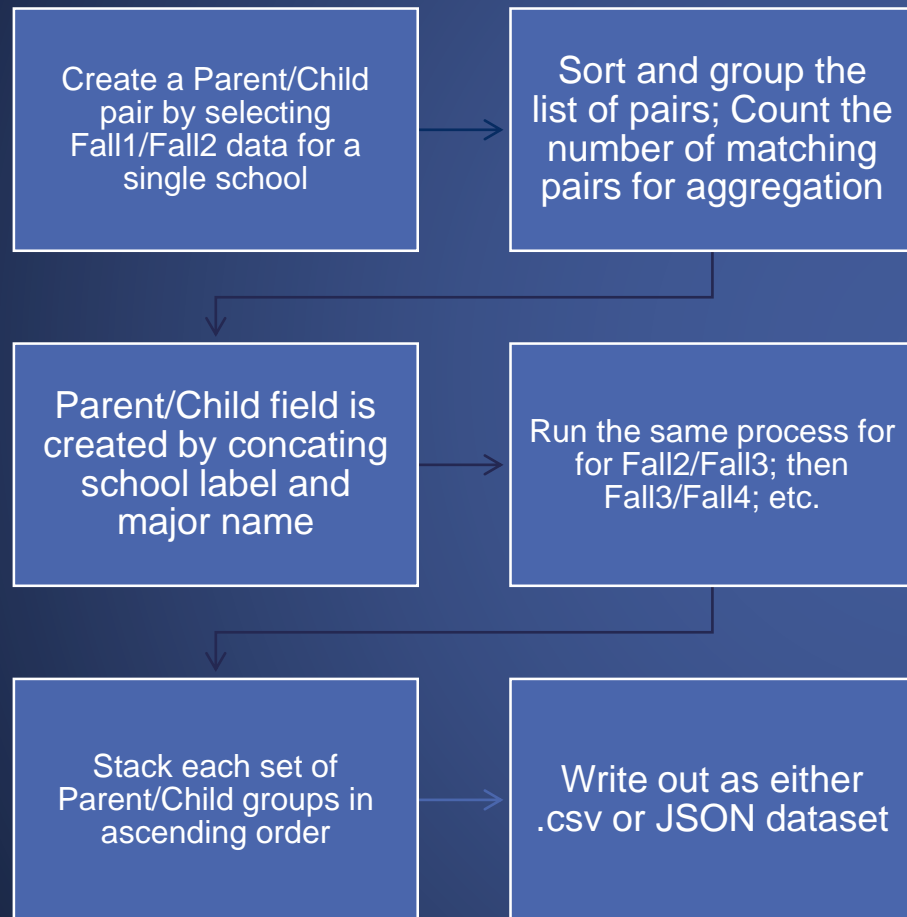
PARENT	CHILD	MAJOR_STR_12	F1_F2_COUNT
BE--Accounting	BE--Accounting	ACCTACCT	24
BE--Accounting	BE--Business Administration	ACCTBADM	2
BE--Accounting	AS--Computer Science	ACCTCMPS	1
BE--Accounting	ZZ--Dropped-Stopped-Transferred	ACCTDDDD	12
BE--Accounting	BE--Finance	ACCTFINC	1
BE--Accounting	HH--Kinesiology	ACCTKINE	1
BE--Accounting	AS--Mathematics	ACCTMATH	1
BE--Accounting	AS--Undecided on Major	ACCTUNDC	1
BE--Business Administration	BE--Accounting	BADMACCT	5
BE--Business Administration	BE--Business Administration	BADMBADM	48
BE--Business Administration	AS--Biology	BADMBIOL	1
BE--Business Administration	AS--Computer Science	BADMCMPS	1
BE--Business Administration	VP--Dance	BADMDANC	1
BE--Business Administration	ZZ--Dropped-Stopped-Transferred	BADMDDDD	31
BE--Business Administration	BE--Economics	BADMECON	2

Steps 1-3 are repeated for every parent/child pair. For six terms, it is run five times



```
0 10 20 30 40 50
1 parent,child,COUNT
2 F1-BE-Accounting,F2-AS-Computer Science,1
3 F1-BE-Accounting,F2-AS-Mathematics,1
4 ~
5 ~
6 F2-BE-Accounting,F3-AS-History,1
7 F2-BE-Accounting,F3-BE-Accounting,16
8 ~
9 ~
10 F3-BE-Accounting,F4-BE-Accounting,1
11 F3-BE-Accounting,F4-BE-Accounting,16
12 ~
13 ~
14 F4-BE-Accounting,F5-AA-Graduated,5
15 F4-BE-Accounting,F5-BE-Accounting,5
16 ~
17 ~
18 F5-BE-Accounting,F6-AA-Graduated,2
19 F5-BE-Accounting,F6-BE-Accounting,1
20 ~
21 ~
```

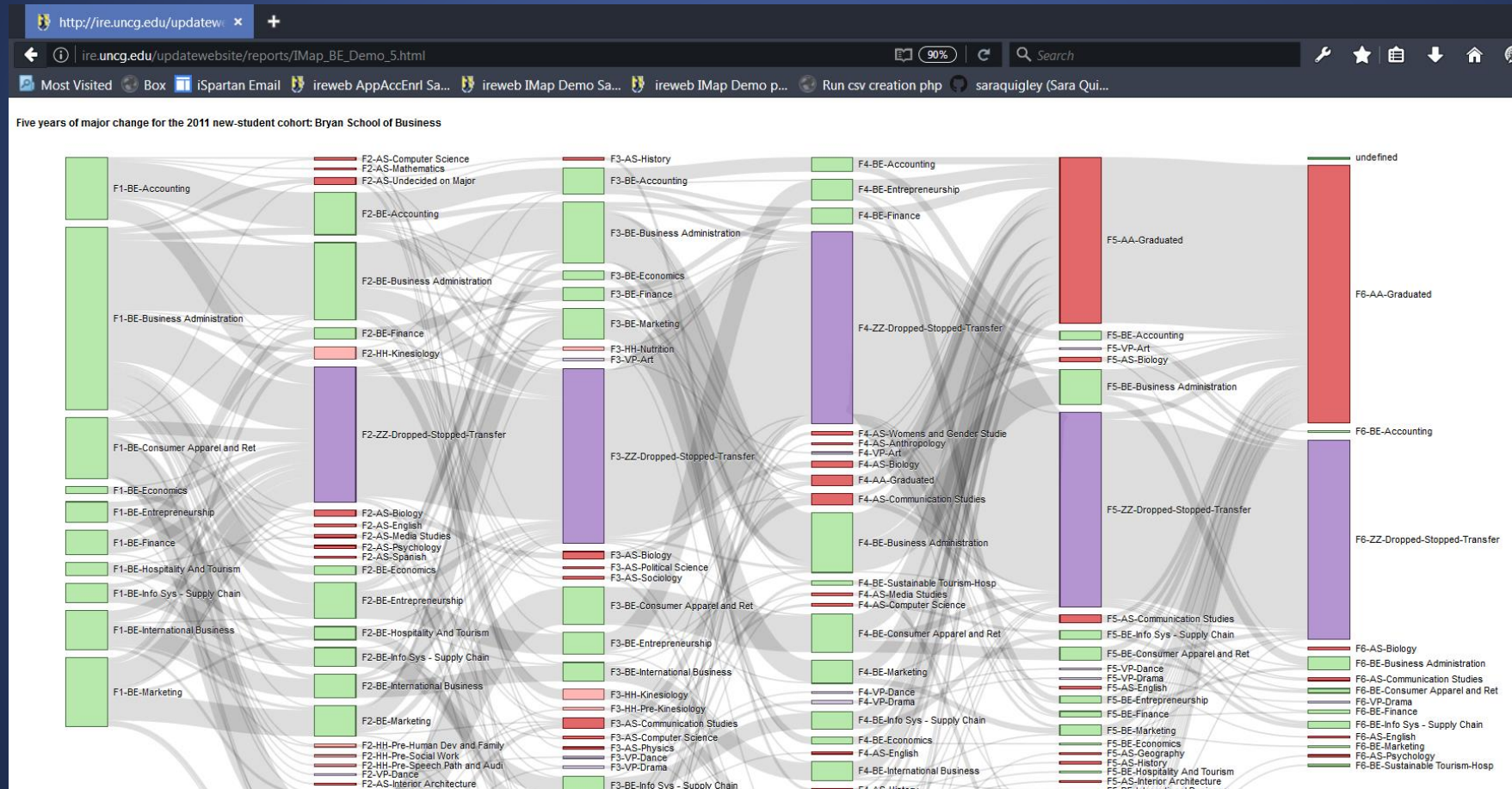
Summary of data steps



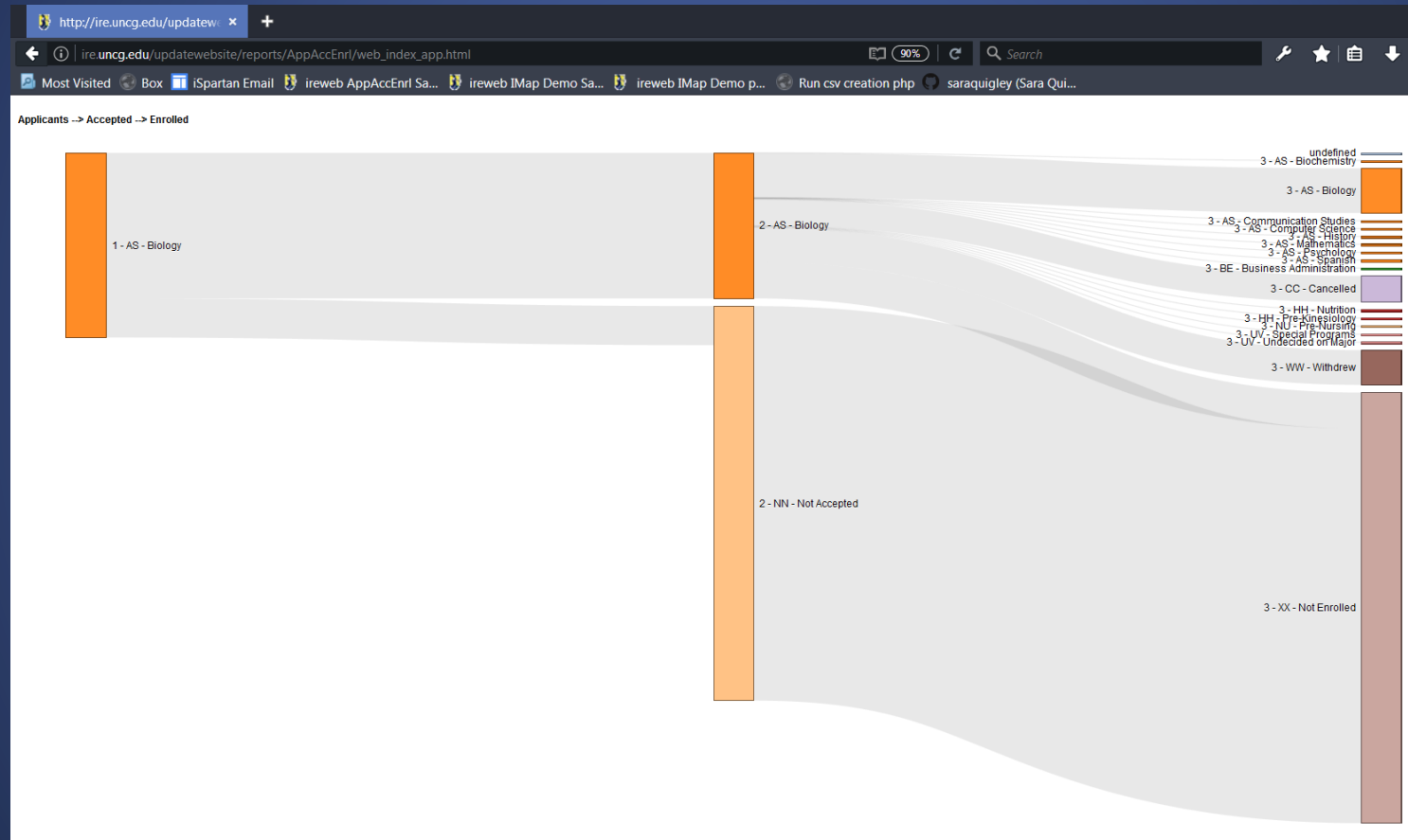
```

10 // Attempt select query execution
11 $sql = "SELECT
12 'F12 ' AS Term,
13 CONCAT(`COLL_F1`,`--`,`MAJORN_F1`) AS 'Parent',
14 CONCAT(`COLL_F2`,`--`,`MAJORN_F2`) AS 'Child',
15 `MAJOR_STR_12` AS MAJOR_STR,
16 COUNT(PIDM) AS Count
17 FROM `master_1b3`
18 WHERE COLL_F1 = 'BE'
19 GROUP BY `MAJOR_STR_12`
20 UNION ALL
21 SELECT
22 .
23 .
24
25 'F56 ' AS Term,
26 CONCAT(`COLL_F5`,`--`,`MAJORN_F5`) AS 'Parent',
27 CONCAT(`COLL_F6`,`--`,`MAJORN_F6`) AS 'Child',
28 `MAJOR_STR_56` AS MAJOR_STR,
29 COUNT(PIDM) AS Count
30 FROM `master_1b3`
31 WHERE COLL_F1 = 'BE'
32 GROUP BY `MAJOR_STR_56`;
33
  
```

The IMap



Another example: Applied-Accepted-Enrolled IMap



Future improvements

- Fully functional webpage that allows schools and departments to drill down to their own students
- PHP/MySQL functionality that runs the entire process from raw data at the click of a button
- Programs to be posted on my GitHub site when complete

Acknowledgements

Much of the code used in this project was produced by others and posted on GitHub. My gratitude to:

Sara Quigley -- <https://github.com/saraquigley>

Mike Bostock – <https://d3js.org/> Creator of D3

AIR | FORUM 2017

Please remember to submit
your evaluation for this session
through the MyForum app