

# Data Visualization (CSCI 627/490)

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Data

Dr. David Koop

# Functional Programming in JavaScript

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- Functions are first-class objects in JavaScript
- You can pass a function to a method just like you can pass an integer, string, or object
- Instead of writing loops to process data, we can instead use a `map/filter/reduce/forEach` function on the data that runs our logic for each data item
- `map`: transform each element of an array
- `filter`: check each element of an array and keep only ones that pass
- `forEach`: run the function for each element of the array
- `reduce`: collapse an array to a single object

# Example: JavaScript and the DOM

- Start with no real content, just divs:

```
<div id="firstSection"></div>
<div id="secondSection"></div>
<div id="finalSection"></div>
```

- Get existing elements:

- `document.querySelector/querySelectorAll`
- `document.getElementById`

- Programmatically add elements:

- `document.createElement`
- `document.createTextNode`
- `Element.appendChild`
- `Element.setAttribute`

## Bears

Chicago, IL

**2018-2019 NFC North Champions**



What will happen this year?

# Observable's HTML Templating

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- Allows JavaScript expressions to be **inlined** in HTML (or SVG content)
- Use `${...}`
- Example:
  - [JavaScript] `name = "Prof. Koop"`
  - [HTML] `<p>Hello, my name is ${name}</p>`



# Using Observable's HTML Templating

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```
<div id="firstSection">
  <h1>Bears</h1><p>Chicago, IL</p>
</div>
<div id="secondSection">
  <h2>2018-2019 NFC North Champions</h2>
</div>
<div id="finalSection">
  ${scores.map( (game) => html`<p>${game.date} :  

    ${game.win ? "Win" : "Loss"} (${game.score})</p>` ) }
  </img>
  <p>What will happen this year?</p>
</div>
```

## Notebook

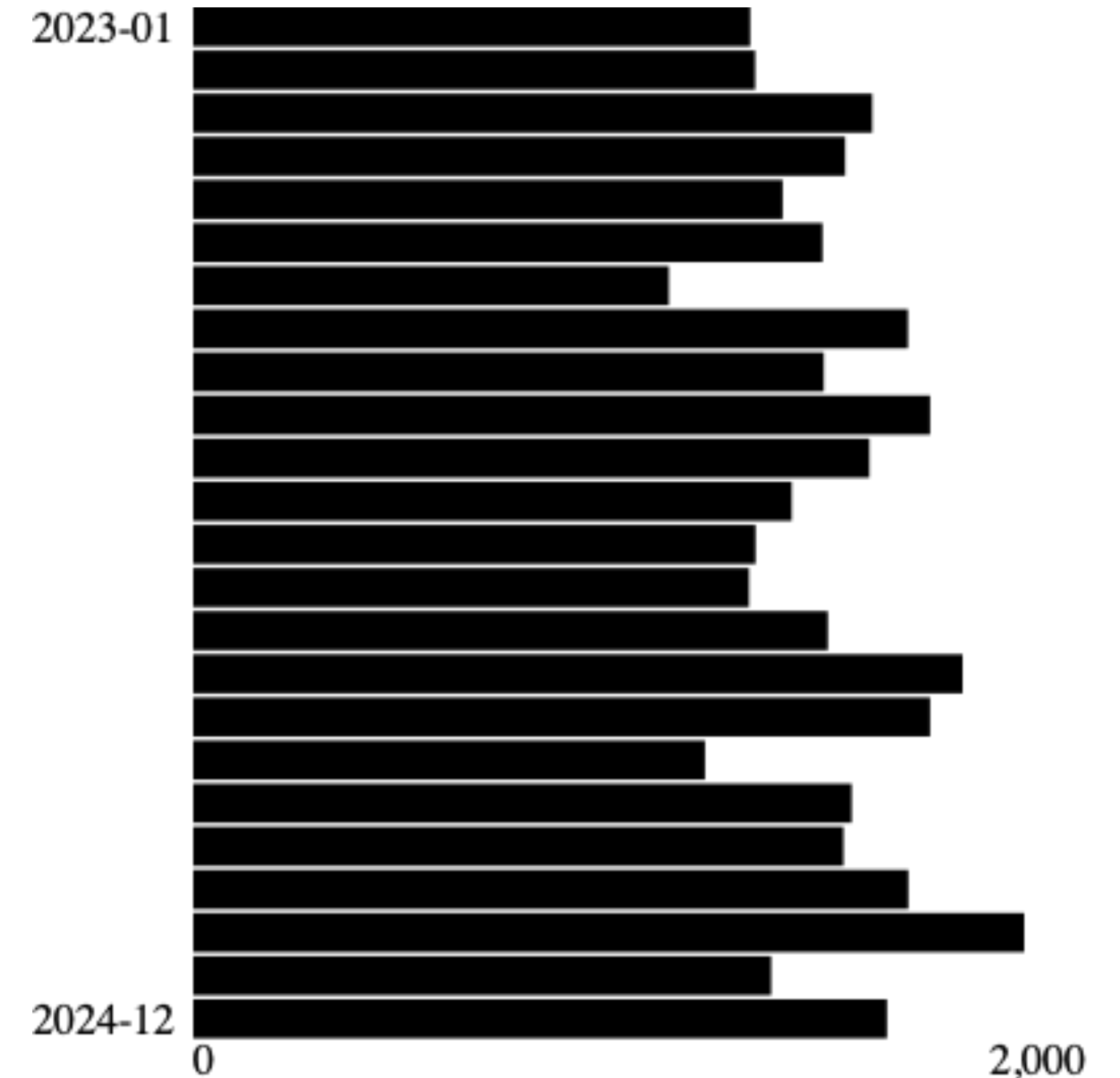
# SVG Manipulation Example

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- Draw a horizontal bar chart
  - `var a = [6, 2, 6, 10, 7, 18, 0, 17, 20, 6];`
- Steps:
  - Programmatically create SVG
  - Create individual rectangle for each item
  - ...or use templating
- Notebook

# Assignment 2

- Chicago Food Inspections
- Data Processing in JavaScript
- Create Bar Charts using SVGs and JavaScript
- **Do not sort** the data for Parts 2 & 3
- [CSCI 627] Add Interaction

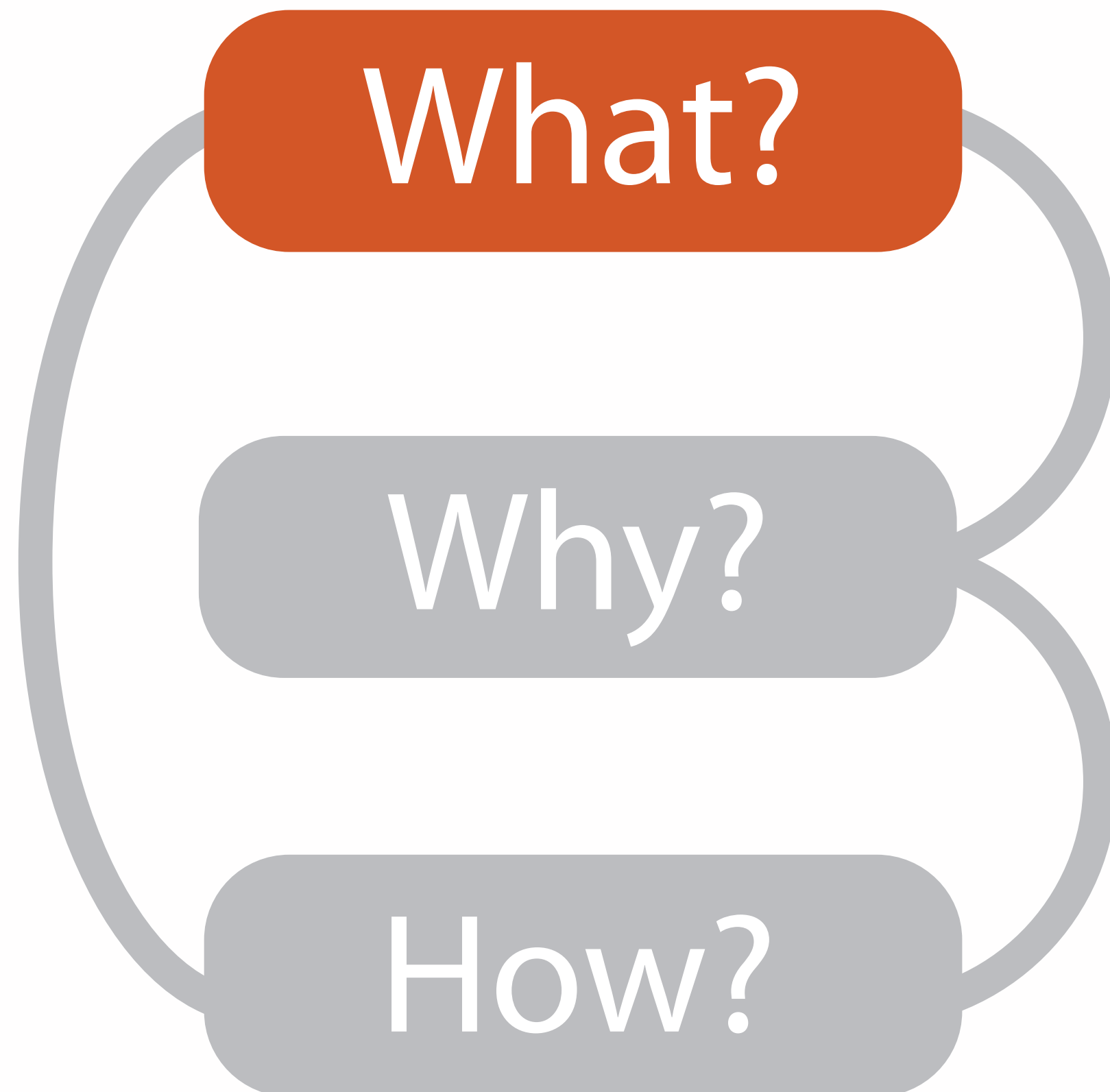


“Computer-based visualization systems provide visual representations of **datasets** designed to help people carry out tasks more effectively.”

— T. Munzner

# Data

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- What? the data
  - Why? the tasks
  - How? the techniques
- 
- Data visualization begins with data

[Munzner (ill. Maguire), 2014]



# Data

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- What is this data?

R011	42ND STREET & 8TH AVENUE	00228985	00008471	00000441	00001455	00000134	00033341	00071255
R170	14TH STREET-UNION SQUARE	00224603	00011051	00000827	00003026	00000660	00089367	00199841
R046	42ND STREET & GRAND CENTRAL	00207758	00007908	00000323	00001183	00003001	00040759	00096613

- **Semantics**: real-world meaning of the data
- **Type**: structural or mathematical interpretation
- Both often require **metadata**
  - Sometimes we can infer some of this information
  - Line between data and metadata isn't always clear

# Semantics

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- The meaning of the data
- Example: 94023, 90210, 02747, 60115

# Semantics

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- Example: 94023, 90210, 02747, 60115
  - Attendance at college football games?

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  - Attendance at college football games?
  - Salaries?

# Semantics

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- The meaning of the data
- Example: 94023, 90210, 02747, 60115
  - Attendance at college football games?
  - Salaries?
  - Zip codes?
- Cannot always infer based on what the data looks like
- Often require semantics to better understand data
- Column names help with semantics
- May also include rules about data: a zip code is part of an address that uniquely identifies a residence
- Useful for asking good questions about the data



# Data

	REMOTE	STATION	FF ▼	SEN/DIS	7-D AFAS UNL	D AFAS/RMF I	JOINT RR TKT	7-D UNL	30-D UNL
1	R011	42ND STREET & 8TH AVENUE	00228985	00008471	00000441	00001455	00000134	00033341	00071255
2	R170	14TH STREET-UNION SQUARE	00224603	00011051	00000827	00003026	00000660	00089367	00199841
3	R046	42ND STREET & GRAND CENTRAL	00207758	00007908	00000323	00001183	00003001	00040759	00096613
4	R012	34TH STREET & 8TH AVENUE	00188311	00006490	00000498	00001279	00003622	00035527	00067483
5	R293	34TH STREET - PENN STATION	00168768	00006155	00000523	00001065	00005031	00030645	00054376
6	R033	42ND STREET/TIMES SQUARE	00159382	00005945	00000378	00001205	00000690	00058931	00078644
7	R022	34TH STREET & 6TH AVENUE	00156008	00006276	00000487	00001543	00000712	00058910	00110466
8	R084	59TH STREET/COLUMBUS CIRCLE	00155262	00009484	00000589	00002071	00000542	00053397	00113966
9	R020	47-50 STREETS/ROCKEFELLER	00143500	00006402	00000384	00001159	00000723	00037978	00090745
10	R179	86TH STREET-LEXINGTON AVE	00142169	00010367	00000470	00001839	00000271	00050328	00125250
11	R023	34TH STREET & 6TH AVENUE	00134052	00005005	00000348	00001112	00000649	00031531	00075040
12	R029	PARK PLACE	00121614	00004311	00000287	00000931	00000792	00025404	00065362
13	R047	42ND STREET & GRAND CENTRAL	00100742	00004273	00000185	00000704	00001241	00022808	00068216

# Data Terminology

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- Items
  - An **item** is an individual discrete entity
  - e.g. row in a table, node in a network
- Attributes
  - An **attribute** is some specific property that can be measured, observed, or logged
  - a.k.a. variable, (data) dimension
  - e.g. a column in a table



# Items & Attributes

A	B	C	S	T	U
Order ID	Order Date	Order Priority	Product Container	Product Base Margin	Ship Date
3	10/14/06	5-Low	Large Box	0.8	10/21/06
6	2/21/08	4-Not Specified	Small Pack	0.55	2/22/08
32	7/16/07	2-High	Small Pack	0.79	7/17/07
32	7/16/07	2-High	Jumbo Box		7/17/07
32	7/16/07	2-High	Medium Box		7/18/07
32	7/16/07	2-High	Medium Box	0.65	7/18/07
35	10/23/07	4-Not Specified	Wrap Bag	0.52	10/24/07
35	10/23/07	4-Not Specified	Small Box	0.58	10/25/07
36	11/3/07	1-Urgent	Small Box	0.55	11/3/07
65	3/18/07	1-Urgent	Small Pack	0.49	3/19/07
66	1/20/05	5-Low	Wrap Bag	0.56	1/20/05
69	5	4-Not Specified	Small Pack	0.44	6/6/05
69	5	4-Not Specified	Wrap Bag	0.6	6/6/05
70	12/18/06	5-Low	Small Box	0.59	12/23/06
70	12/18/06	5-Low	Wrap Bag	0.82	12/23/06
96	4/17/05	2-High	Small Box	0.55	4/19/05
97	1/29/06	3-Medium	Small Box	0.38	1/30/06
129	11/19/08	5-Low	Small Box	0.37	11/28/08
130	5/8/08	2-High	Small Box	0.37	5/9/08
130	5/8/08	2-High	Medium Box	0.38	5/10/08
130	5/8/08	2-High	Small Box	0.6	5/11/08
132	6/11/06	3-Medium	Medium Box	0.6	6/12/06
132	6/11/06	3-Medium	Jumbo Box	0.69	6/14/06
134	5/1/08	4-Not Specified	Large Box	0.82	5/3/08
135	10/21/07	4-Not Specified	Small Pack	0.64	10/23/07
166	9/12/07	2-High	Small Box	0.55	9/14/07
193	8/8/06	1-Urgent	Medium Box	0.57	8/10/06
194	4/5/08	3-Medium	Wrap Bag	0.42	4/7/08

attribute

item

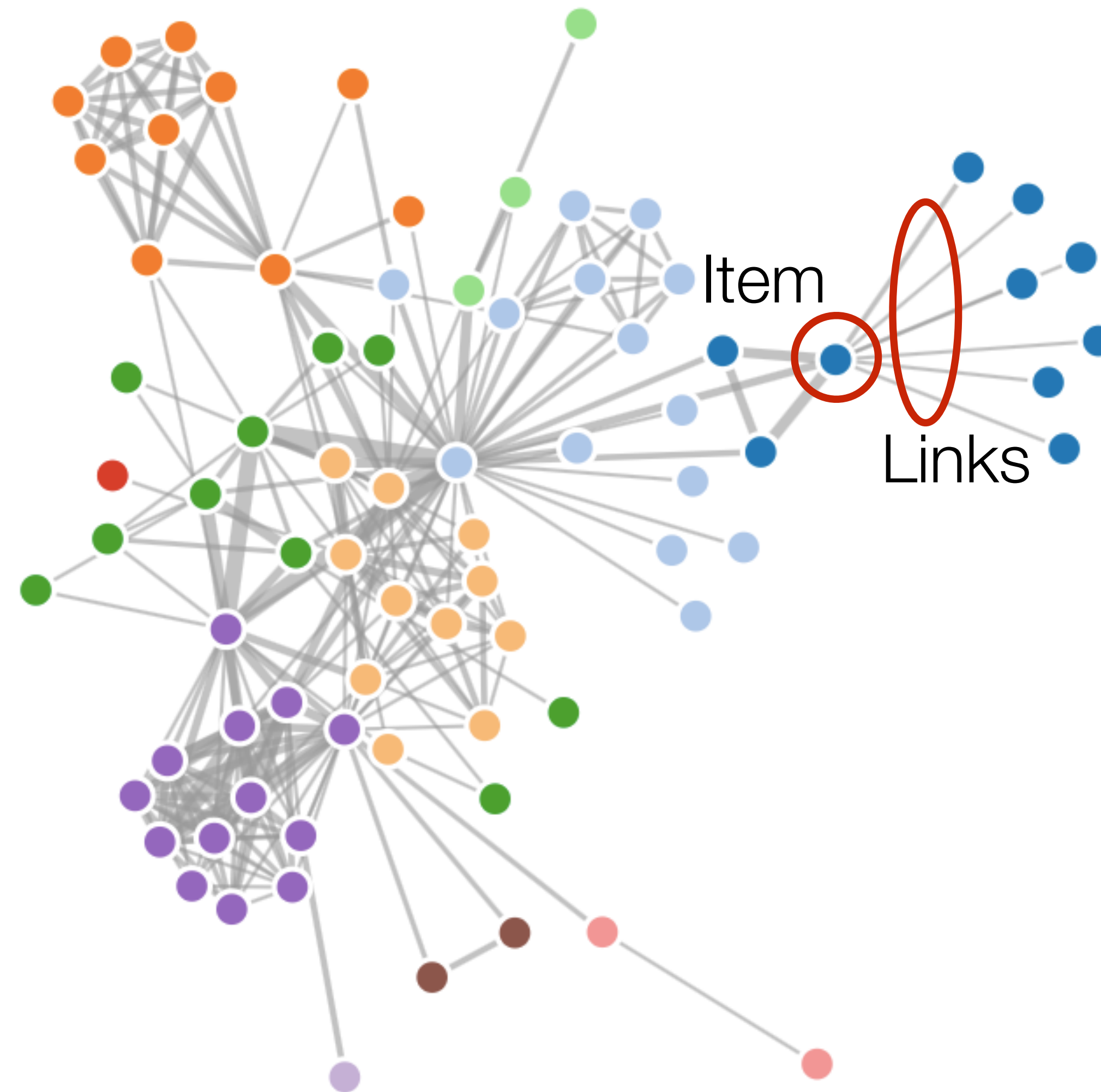
# Data Types

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- Nodes
  - Synonym for item but in the context of networks (graphs)
- Links
  - A **link** is a relation between two items
  - e.g. social network friends, computer network links



# Items & Links



[Bostock, 2011]

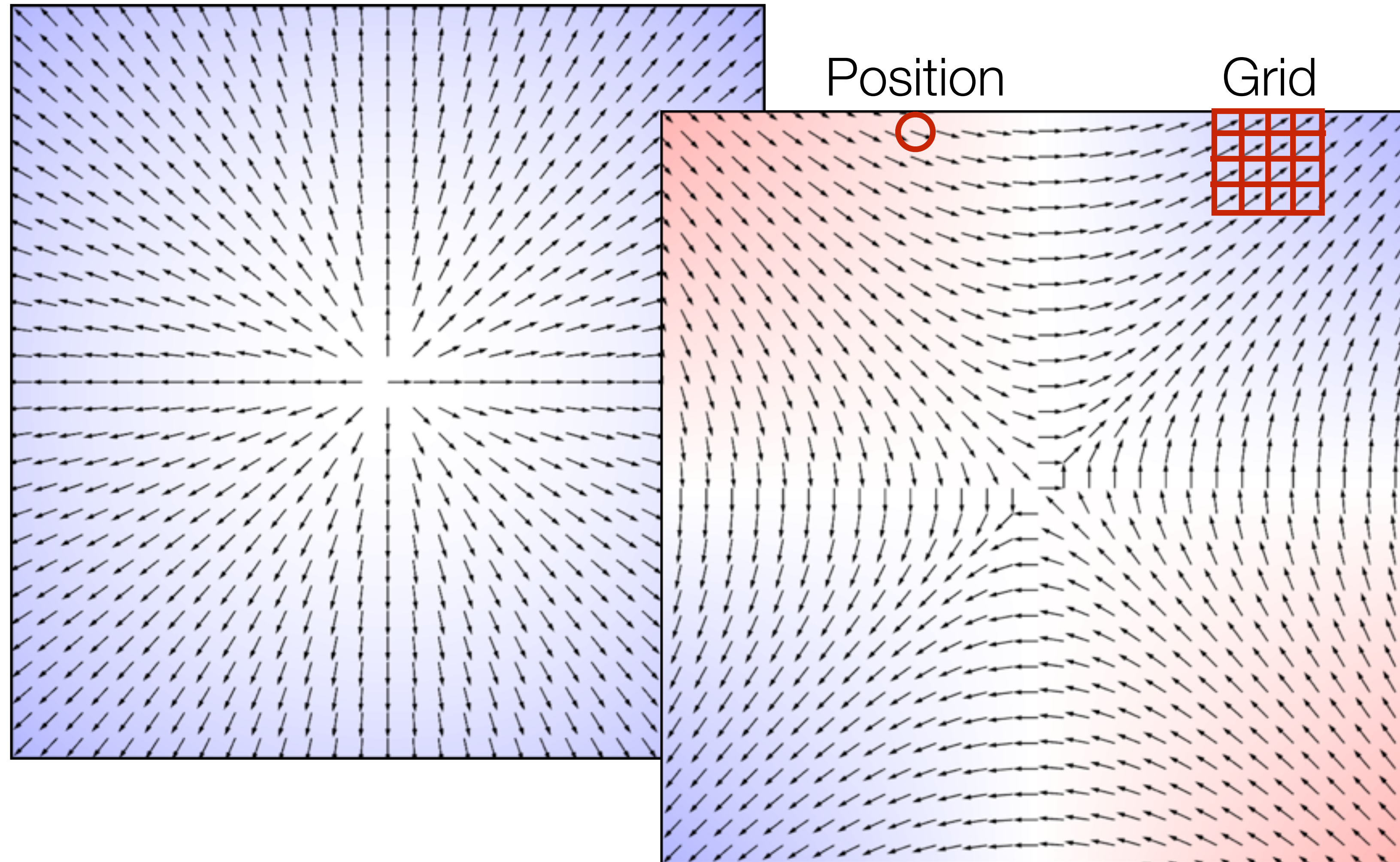


# Data Types

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- Positions:
  - A **position** is a location in space (usually 2D or 3D)
  - May be subject to projections
  - e.g. cities on a map, a sampled region in an CT scan
- Grids:
  - A **grid** specifies how data is sampled both geometrically and topologically
  - e.g. how CT scan data is stored

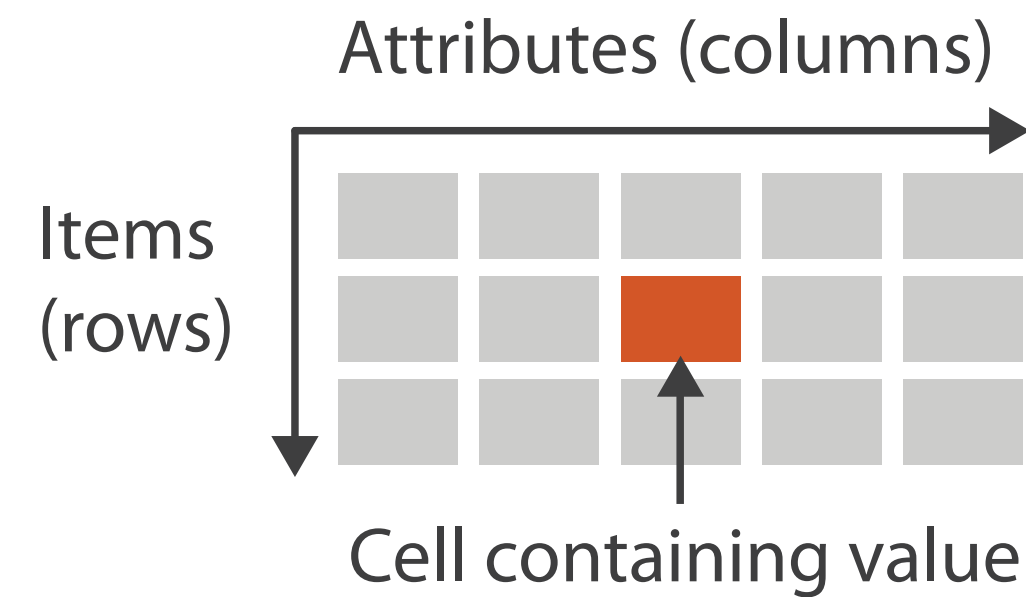
# Positions and Grids



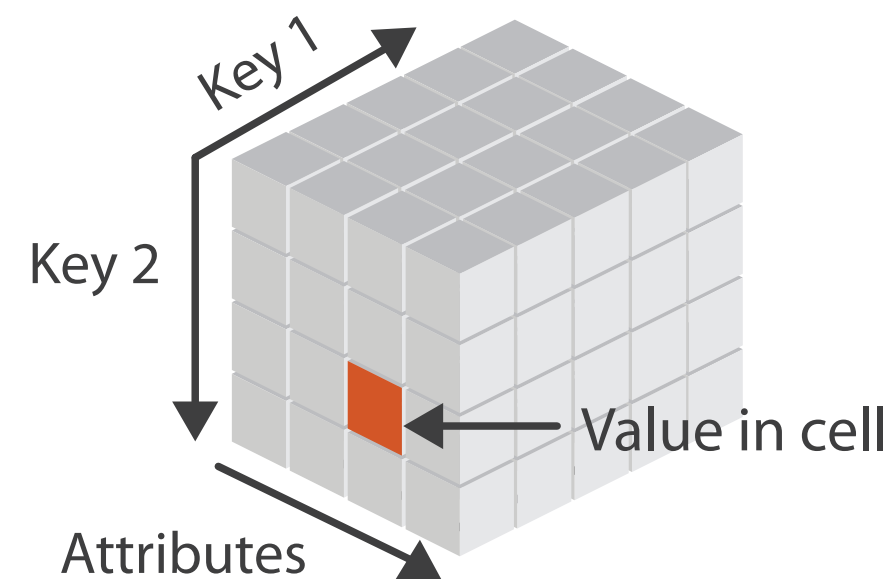


# Dataset Types

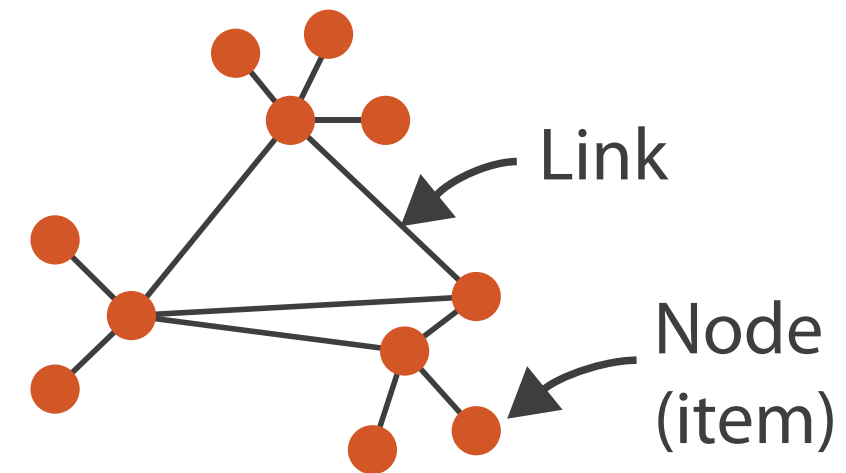
## → Tables



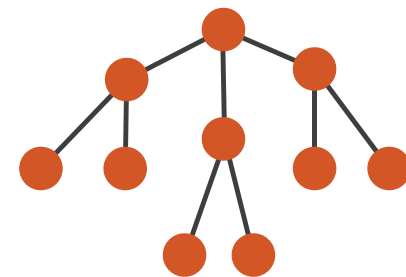
## → *Multidimensional Table*



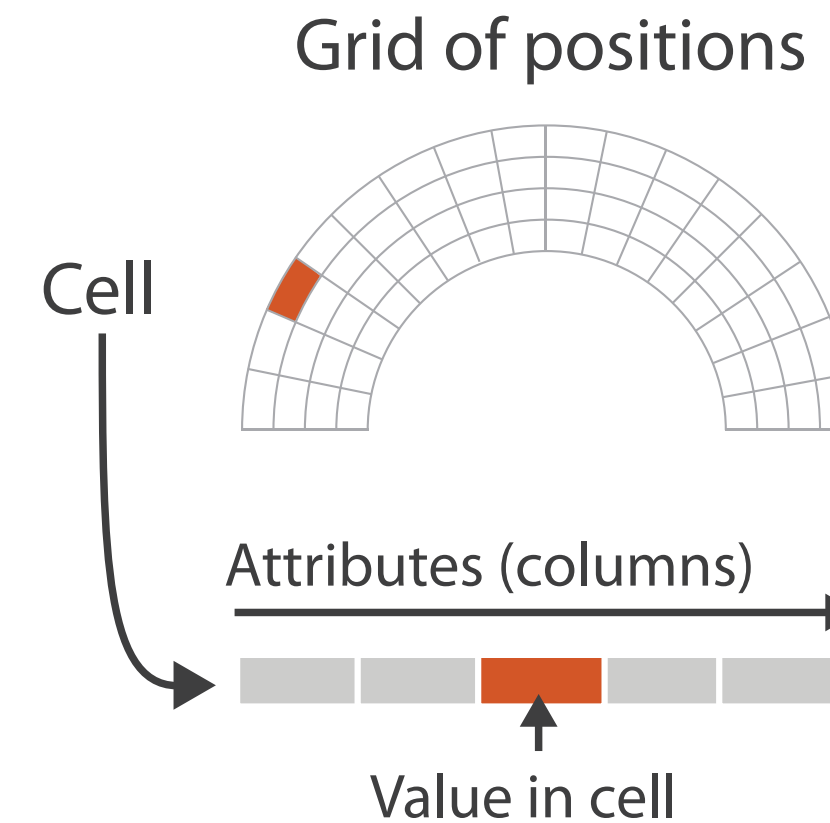
## → Networks



## → Trees



## → Fields (Continuous)



## → Geometry (Spatial)



[Munzner (ill. Maguire), 2014]



# Tables

A	B	C	S	T	U
Order ID	Order Date	Order Priority	Product Container	Product Base Margin	Ship Date
3	10/14/06	5-Low	Large Box	0.8	10/21/06
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130	5/8/08	2-High	Small Box	0.6	5/11/08
132	6/11/06	3-Medium	Medium Box	0.6	6/12/06
132	6/11/06	3-Medium	Jumbo Box	0.69	6/14/06
134	5/1/08	4-Not Specified	Large Box	0.82	5/3/08
135	10/21/07	4-Not Specified	Small Pack	0.64	10/23/07
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193	8/8/06	1-Urgent	Medium Box	0.57	8/10/06
194	4/5/08	3-Medium	Wrap Bag	0.42	4/7/08

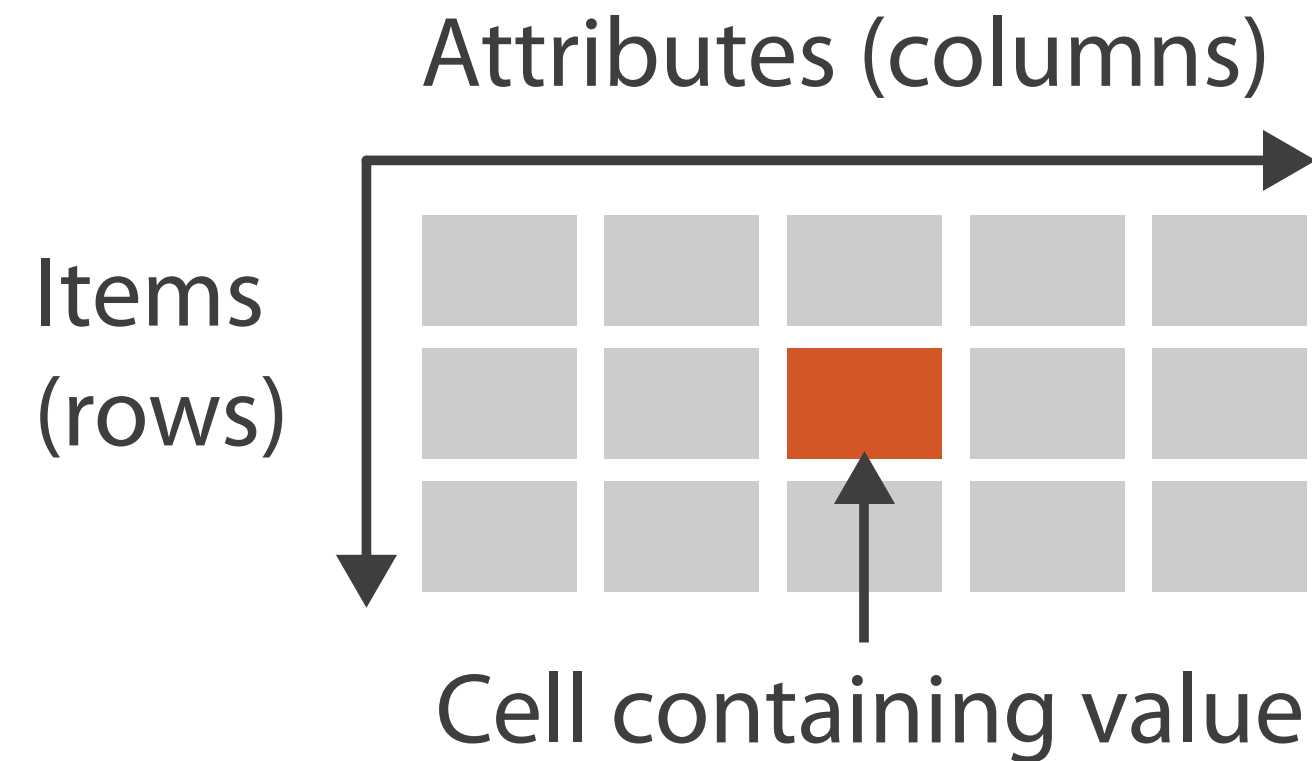
attribute

cell

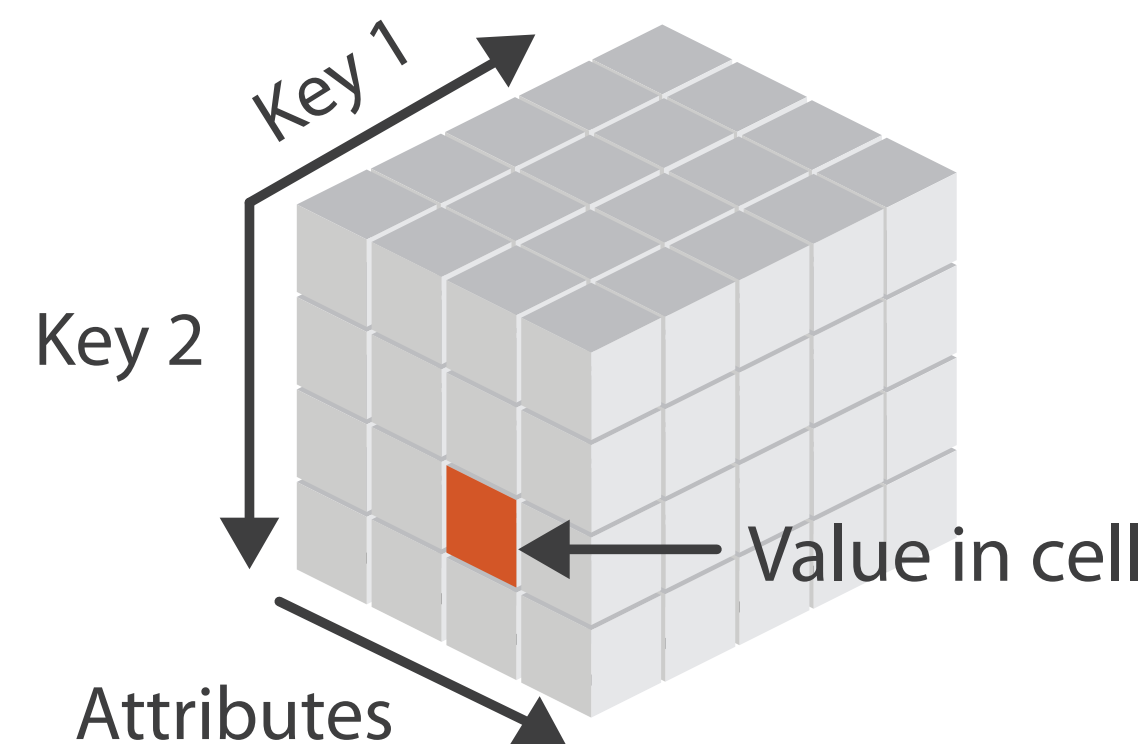
item



# Tables



→ *Multidimensional Table*

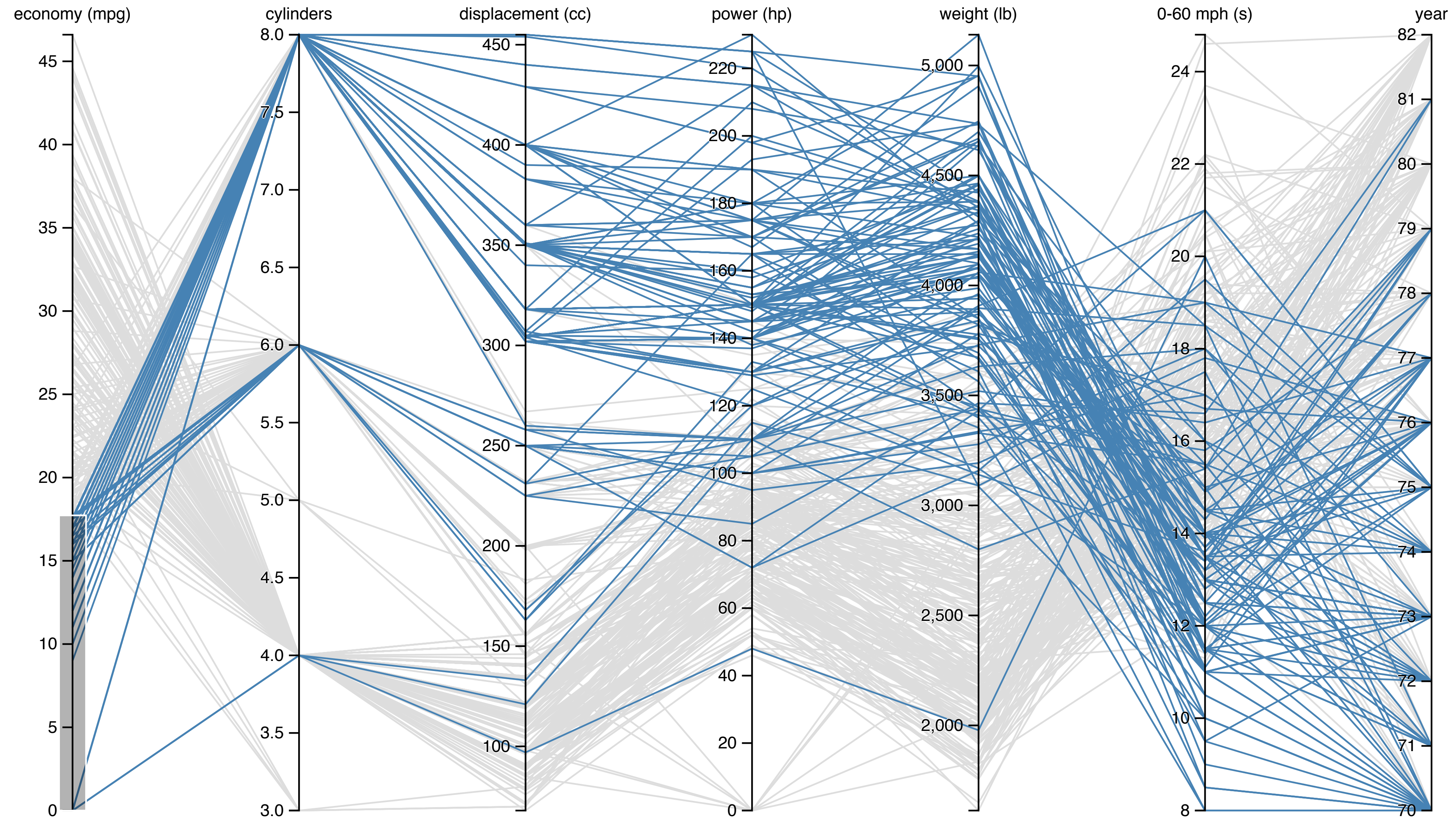


- Data organized by rows & columns
  - row ~ item (usually)
  - column ~ attribute
  - label ~ attribute name
- Key: identifies each item (row)
  - Usually **unique**
  - Allows **join** of data from 2+ tables
  - Compound key: key split among multiple columns, e.g. (state, year) for population
- Multidimensional:
  - Split compound key: data cube with (state, year)

[Munzner (ill. Maguire), 2014]



# Table Visualizations



[M. Bostock, 2011]



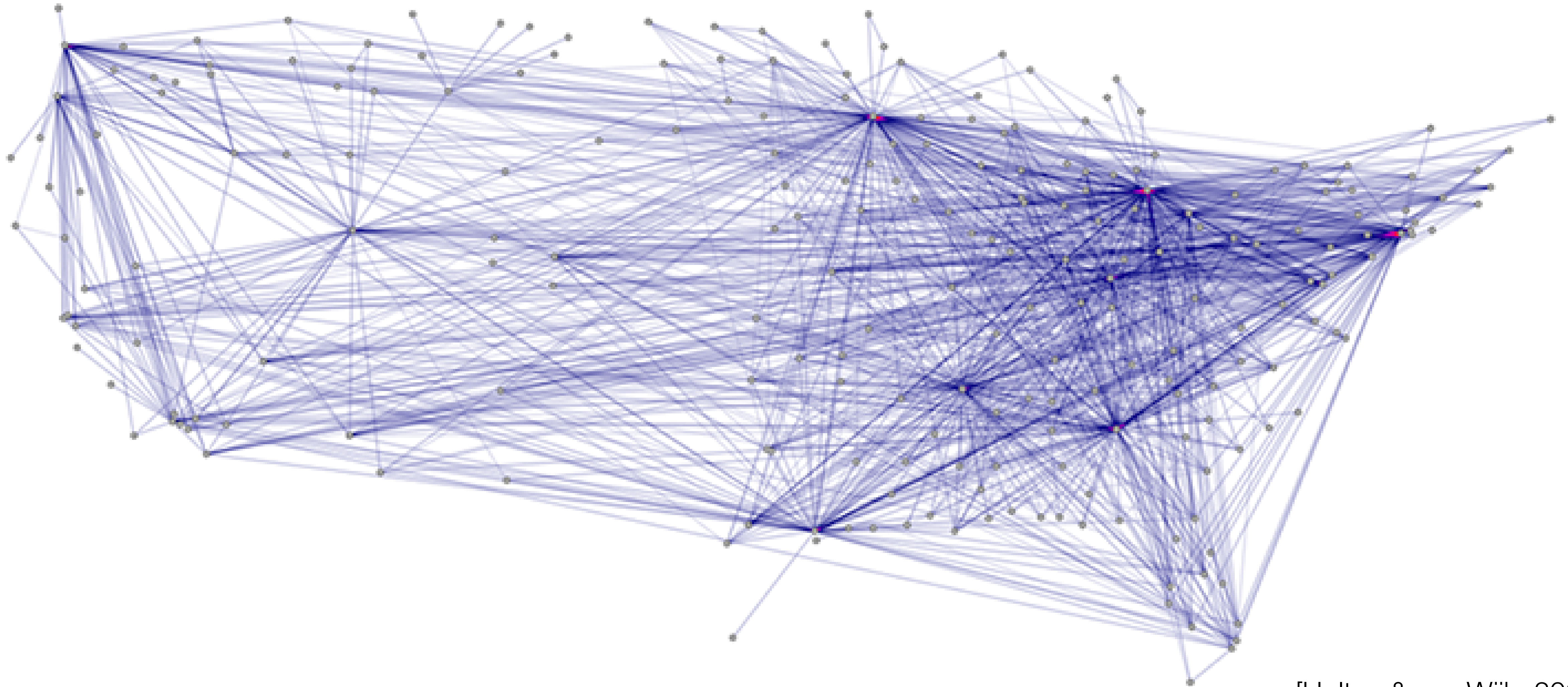
# Networks

- Why networks instead of graphs?
- Tables can represent networks
  - Many-many relationships
  - Also can be stored as specific graph databases or files



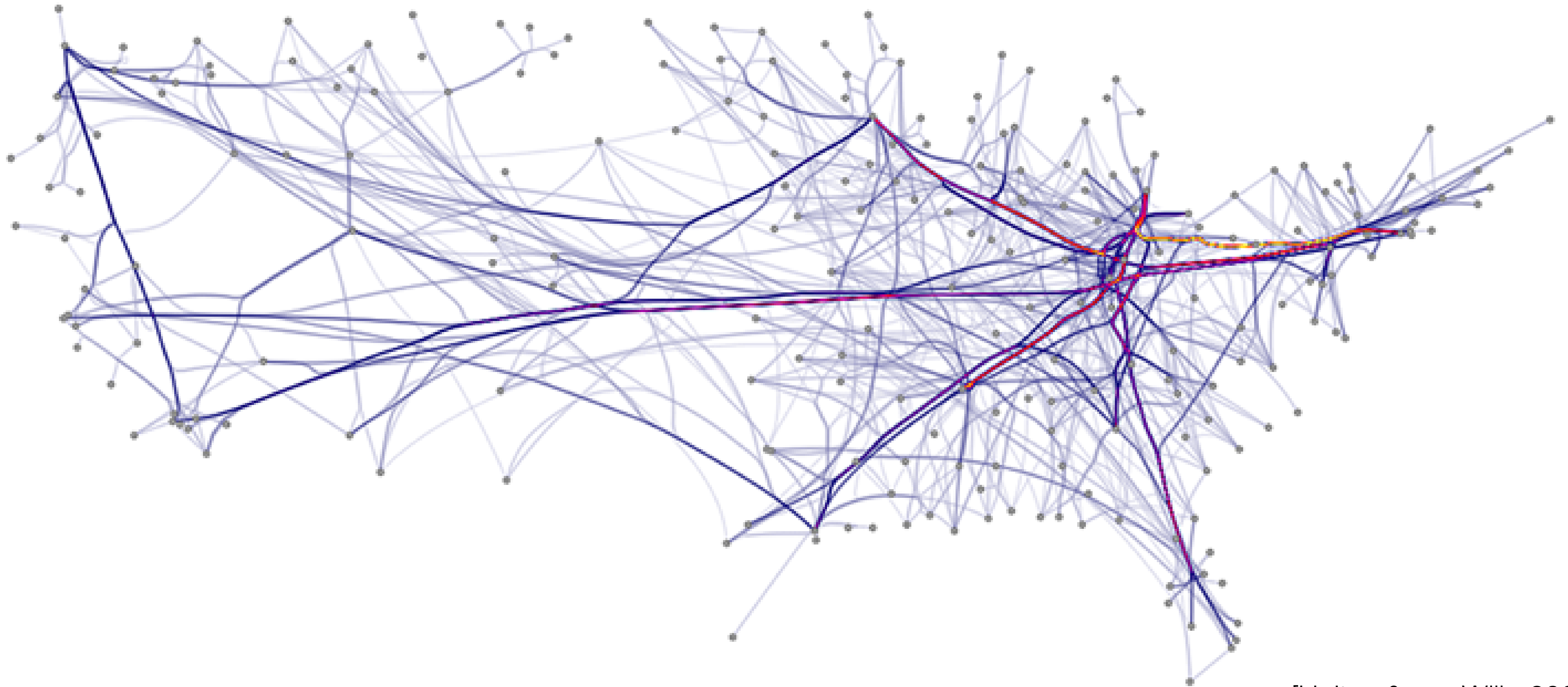
# Networks

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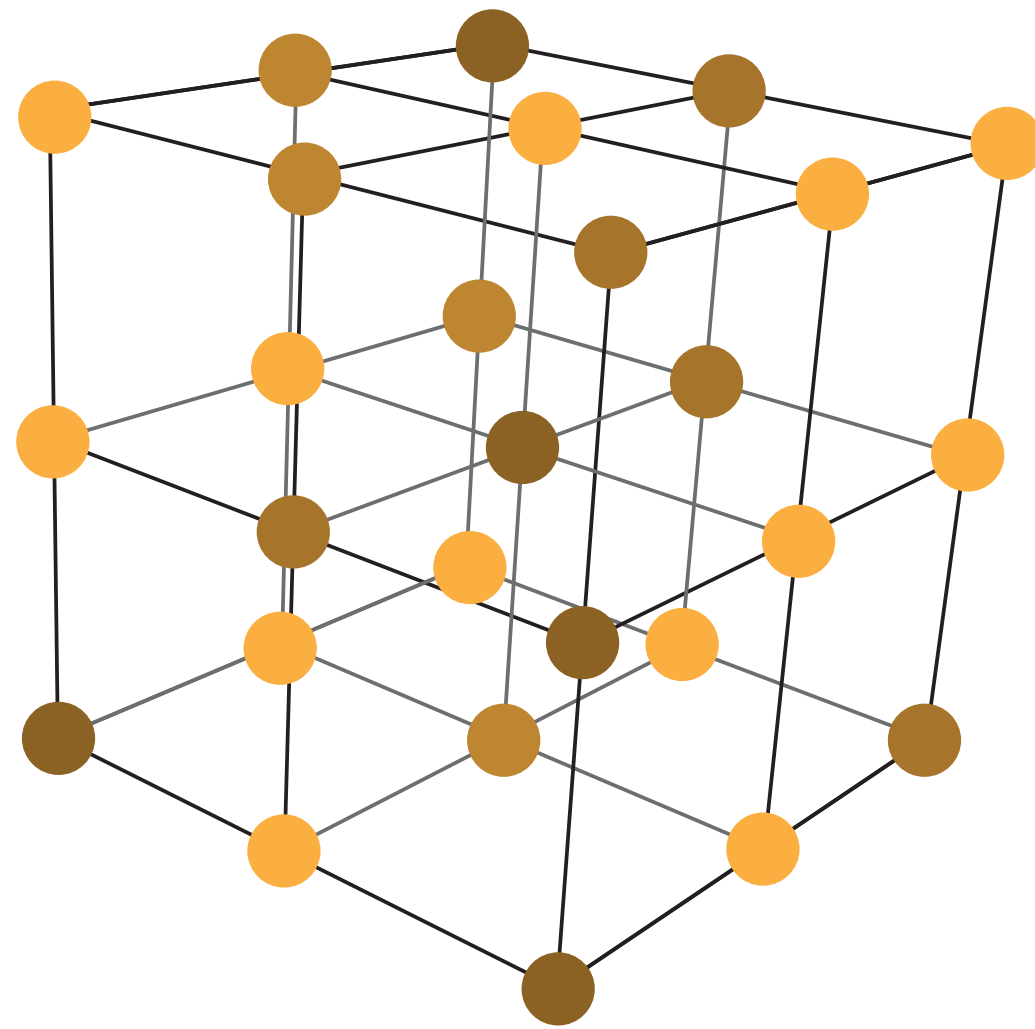
[Holten & van Wijk, 2009]

# Networks



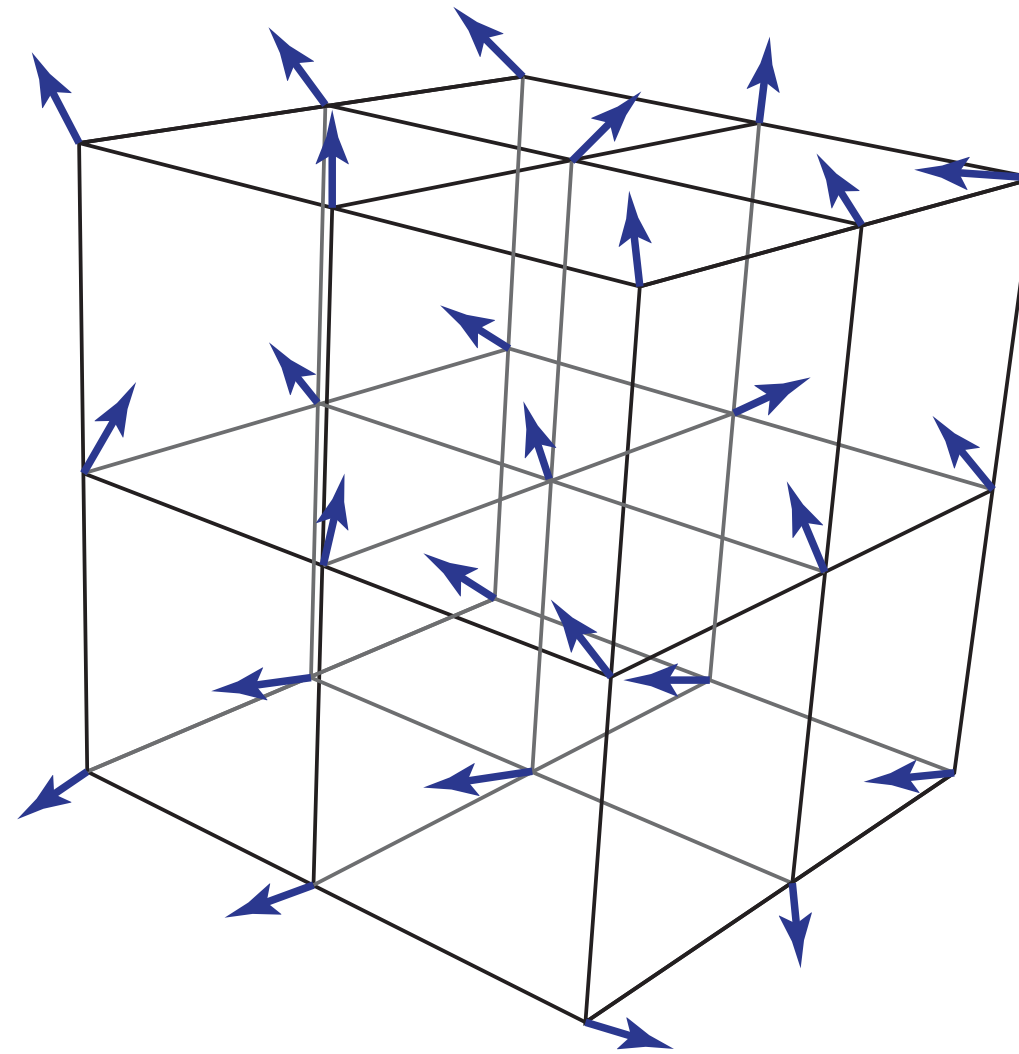
[Holten & van Wijk, 2009]

# Fields



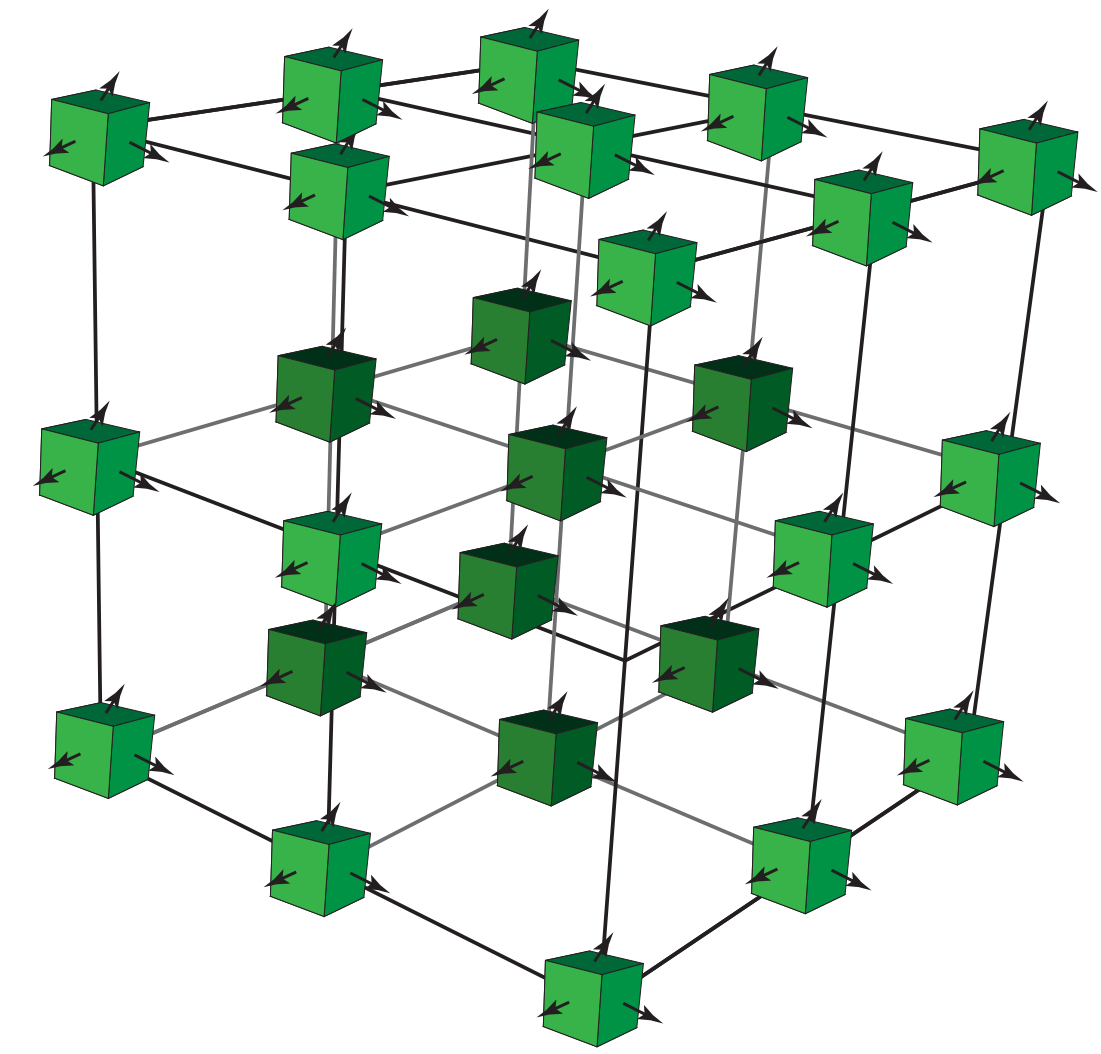
Scalar Fields

(Order-0 Tensor Fields)



Vector Fields

(Order-1 Tensor Fields)



Tensor Fields

(Order-2+)

Each point in space has an associated...

$s_0$

Scalar

$$\begin{bmatrix} v_0 \\ v_1 \\ v_2 \end{bmatrix}$$

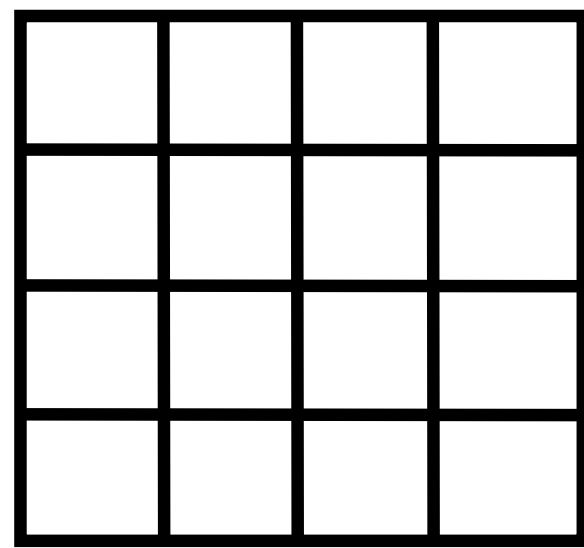
Vector

$$\begin{bmatrix} \sigma_{00} & \sigma_{01} & \sigma_{02} \\ \sigma_{10} & \sigma_{11} & \sigma_{12} \\ \sigma_{20} & \sigma_{21} & \sigma_{22} \end{bmatrix}$$

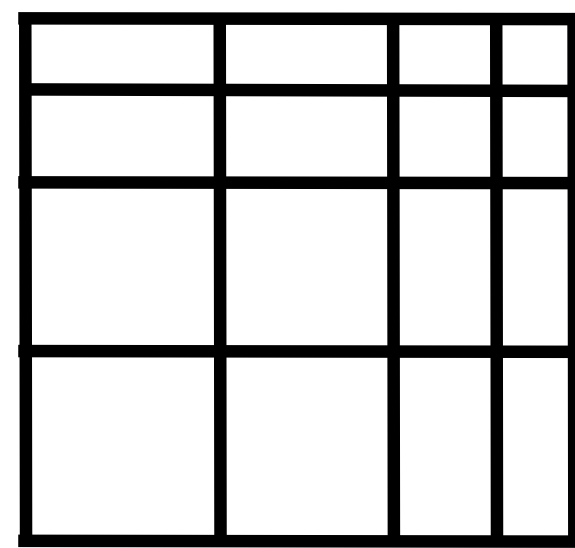
Tensor

# Fields

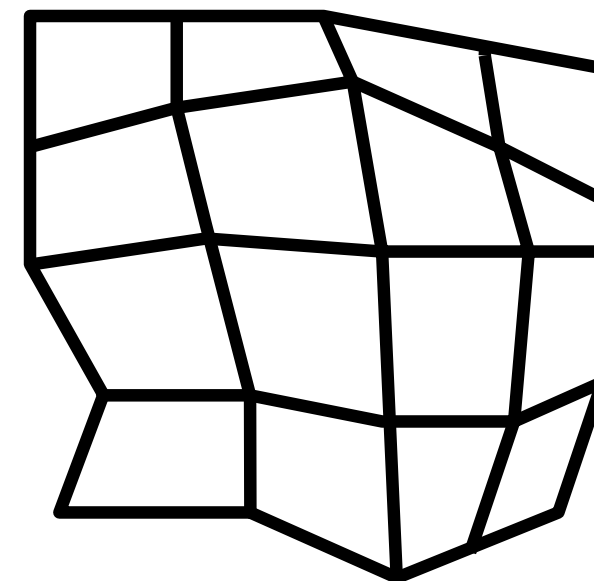
- Difference between **continuous** and **discrete** values
- Examples: temperature, pressure, density
- **Grids** necessary to sample continuous data:



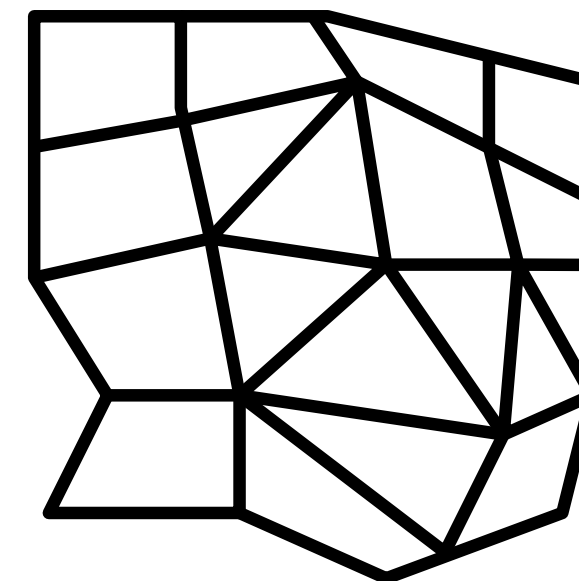
uniform



rectilinear



structured



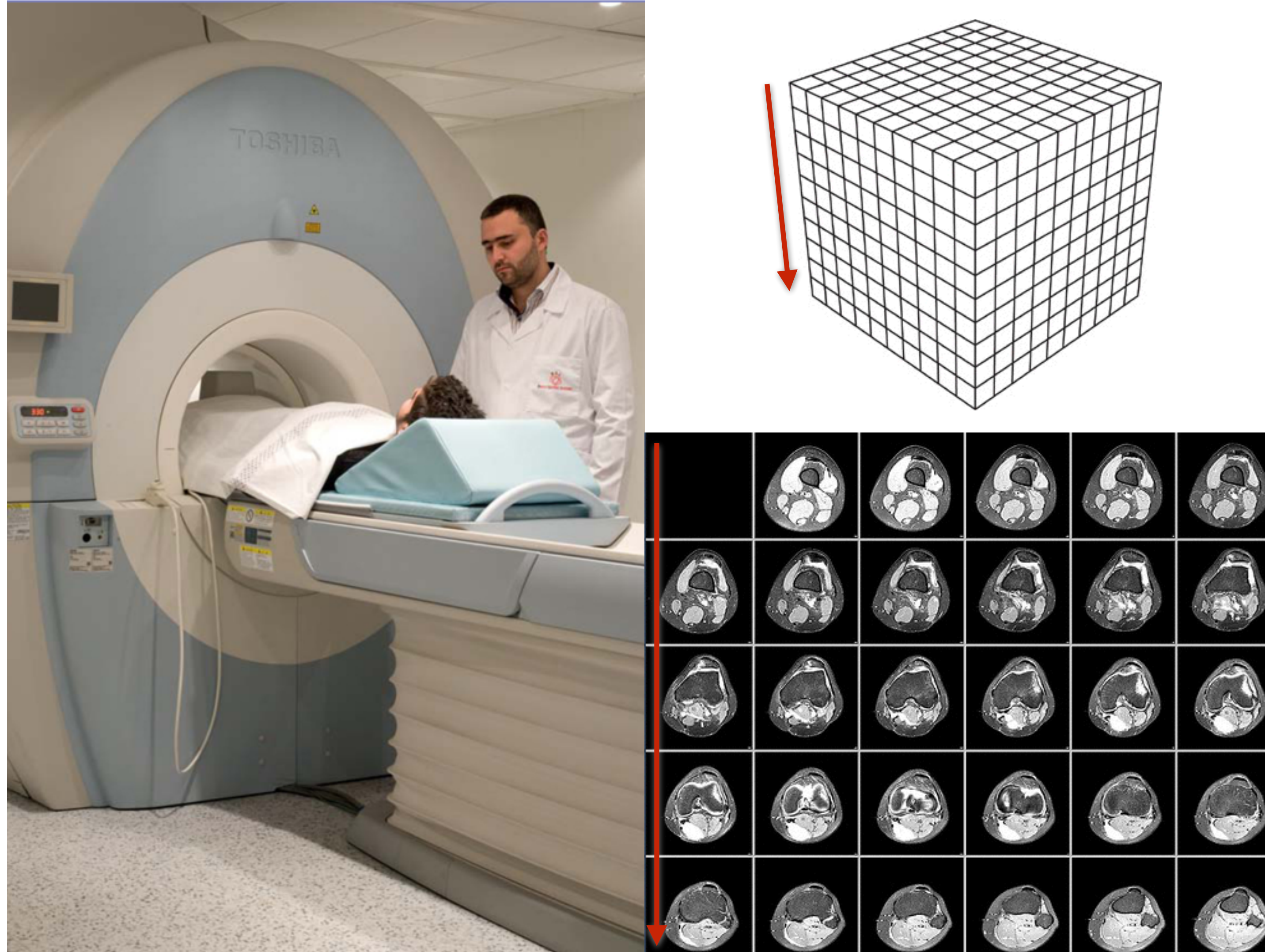
unstructured

[Weiskopf, Machiraju, Möller]

- **Interpolation:** “how to show values between the sampled points in ways that do not mislead”



# Spatial Data Example: MRI



[via Levine, 2014]

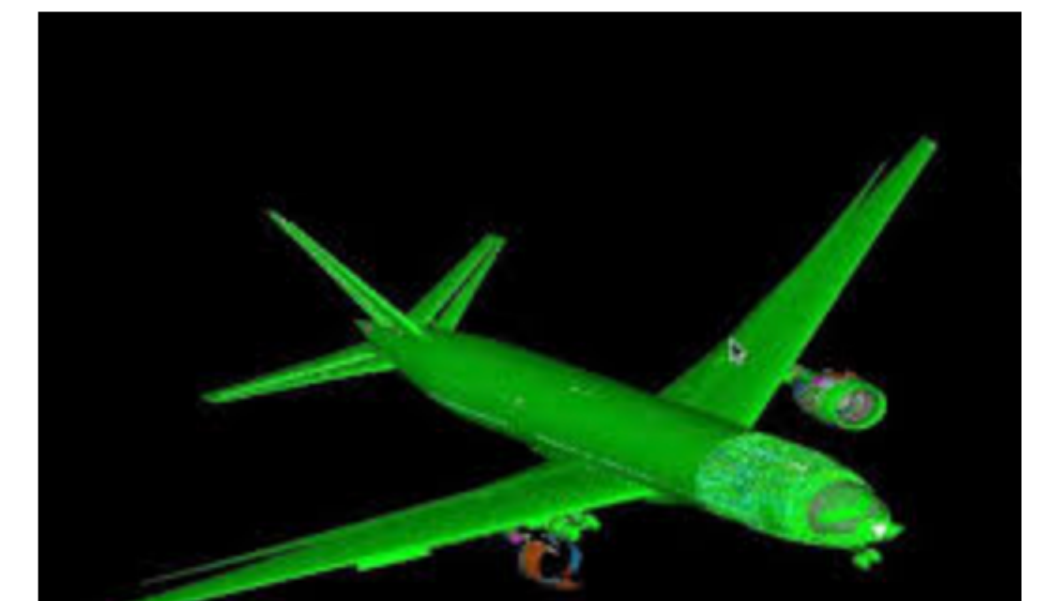
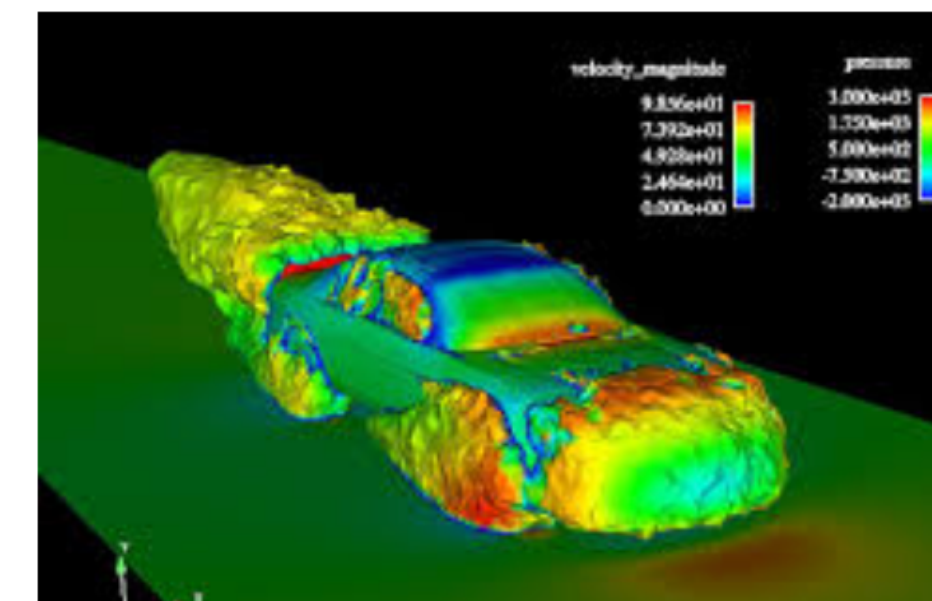
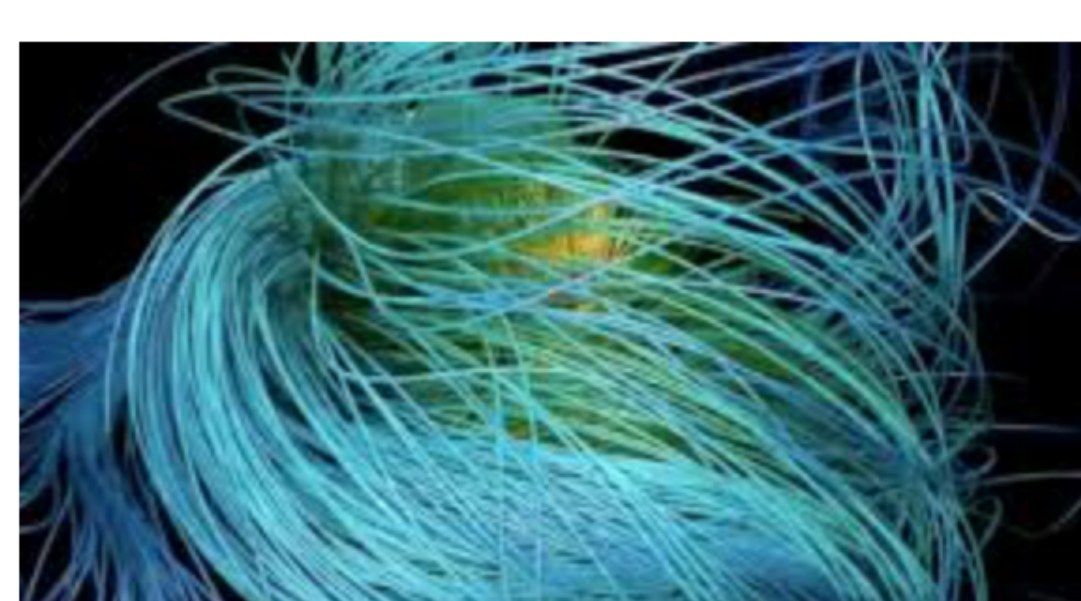
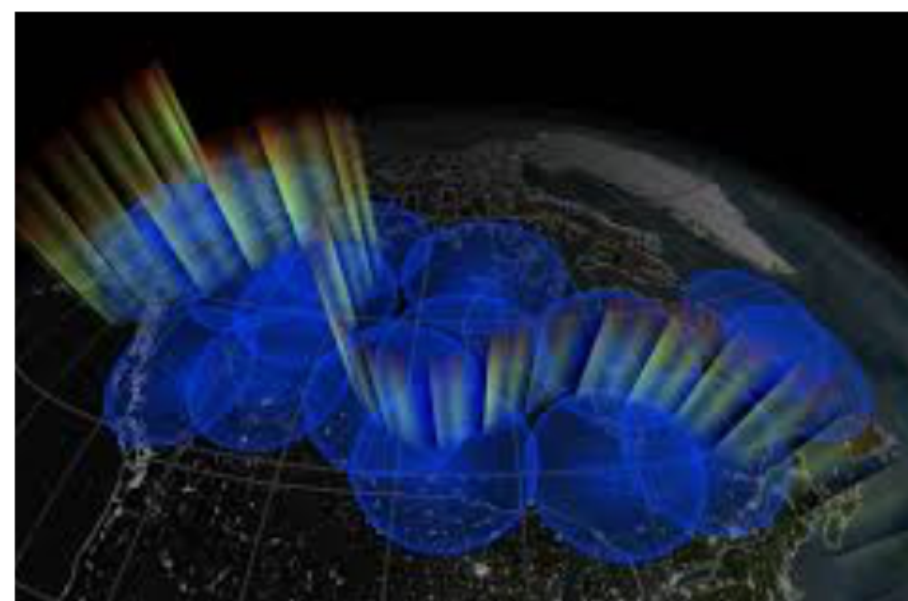
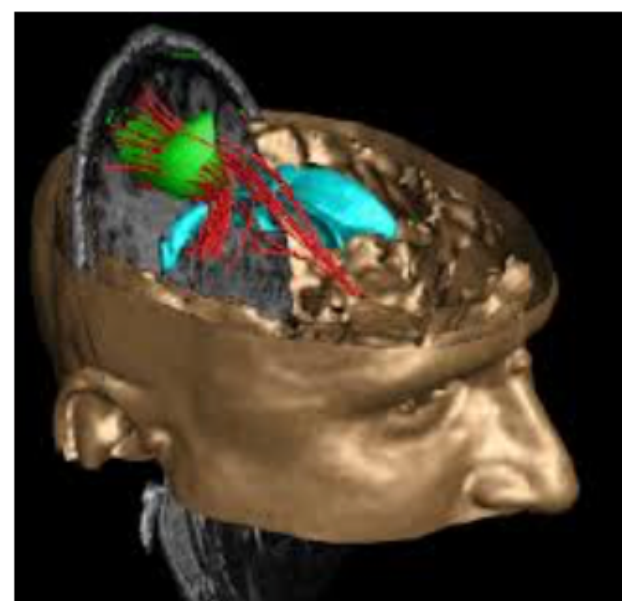
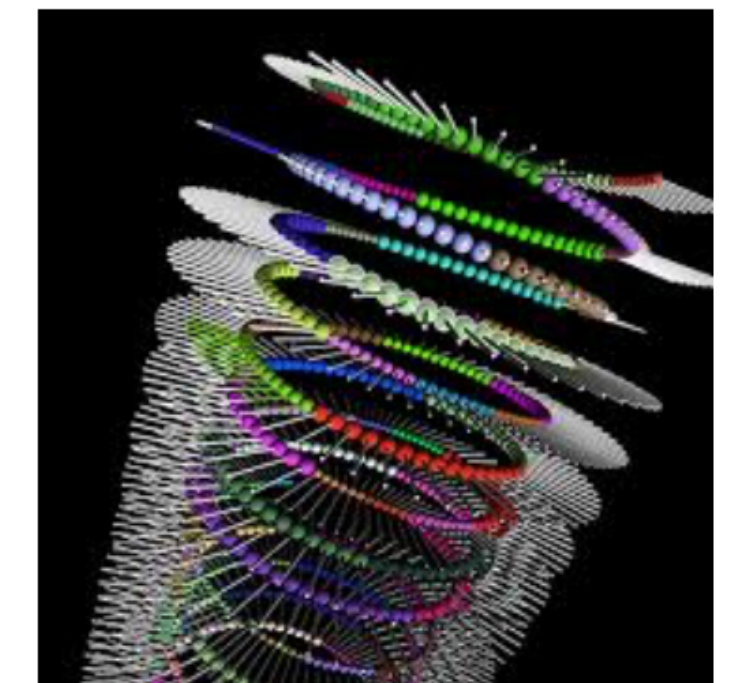
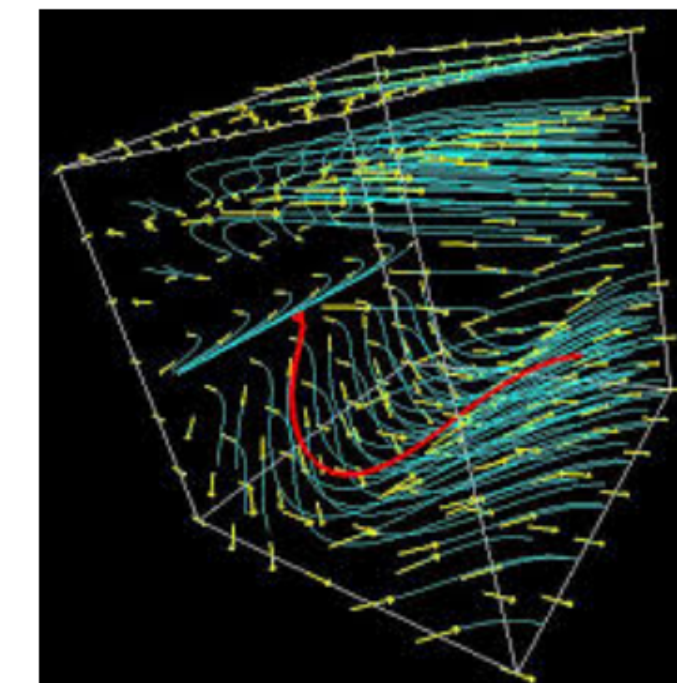
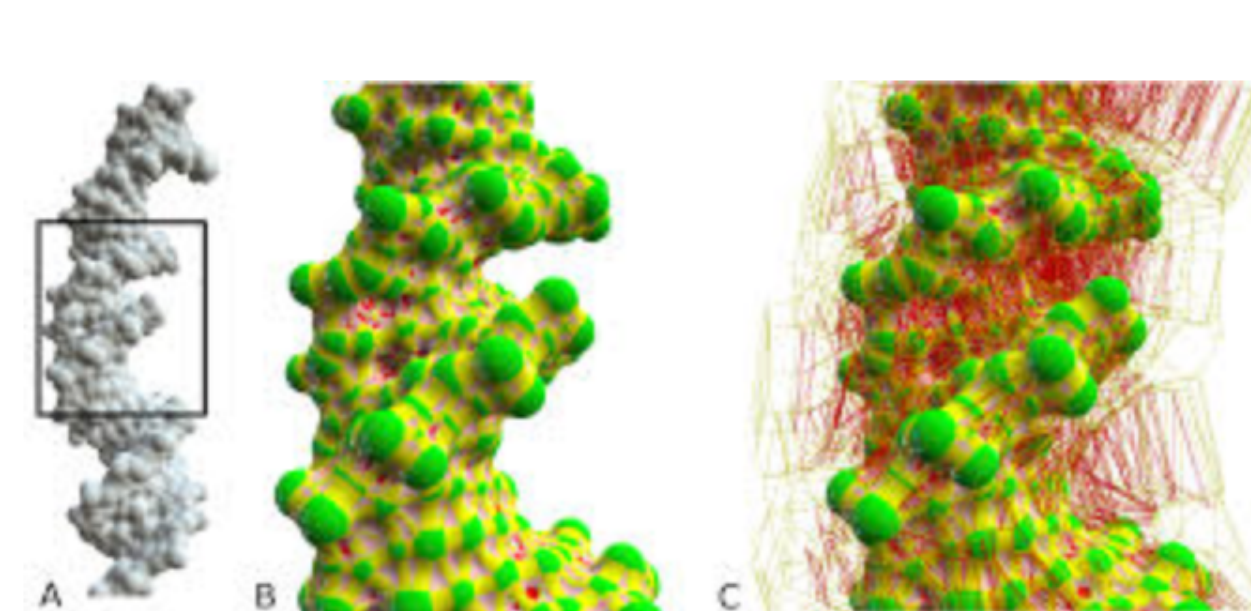
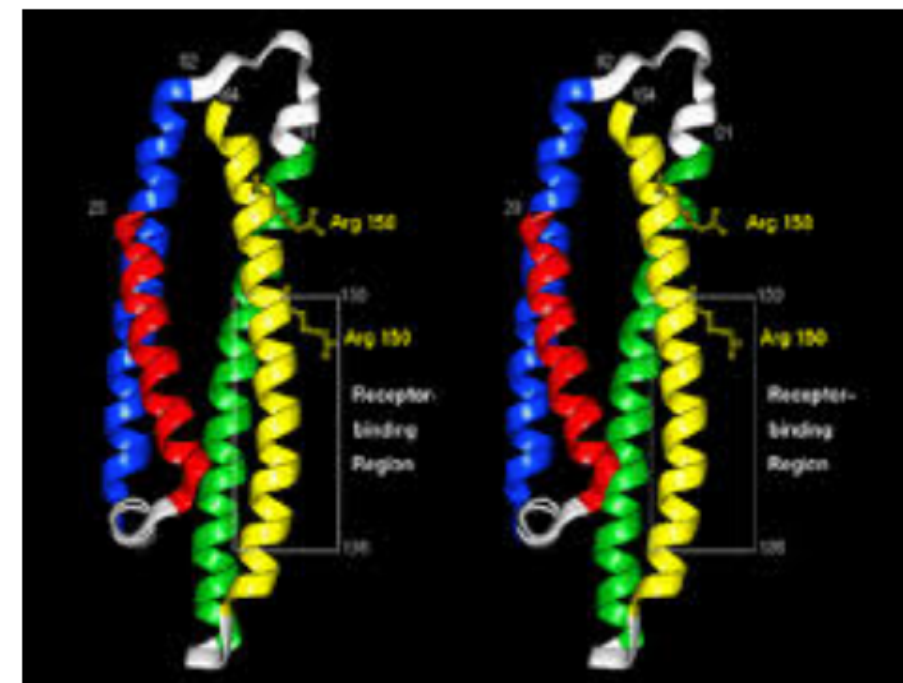
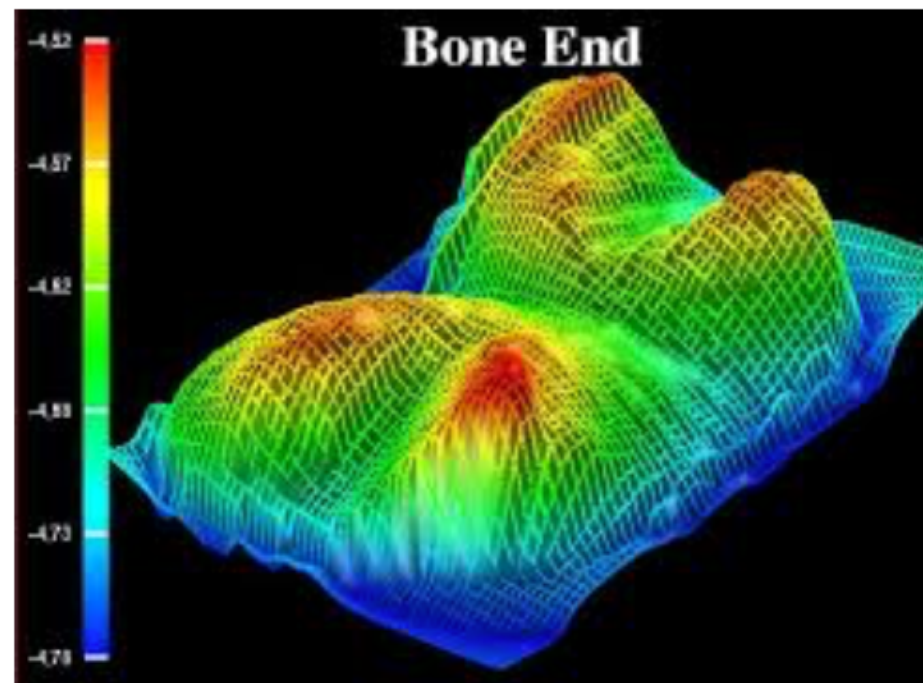
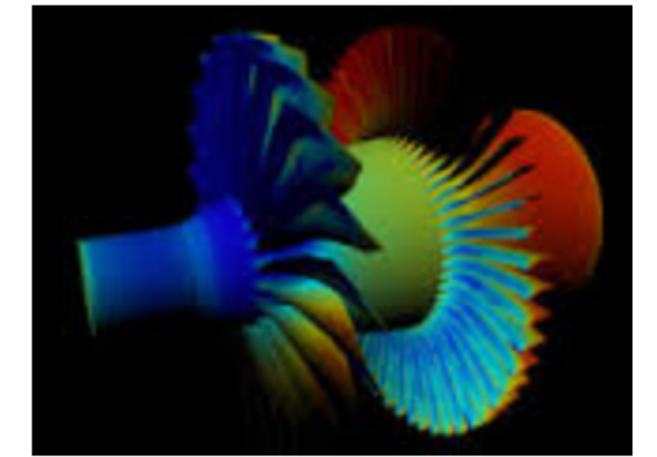
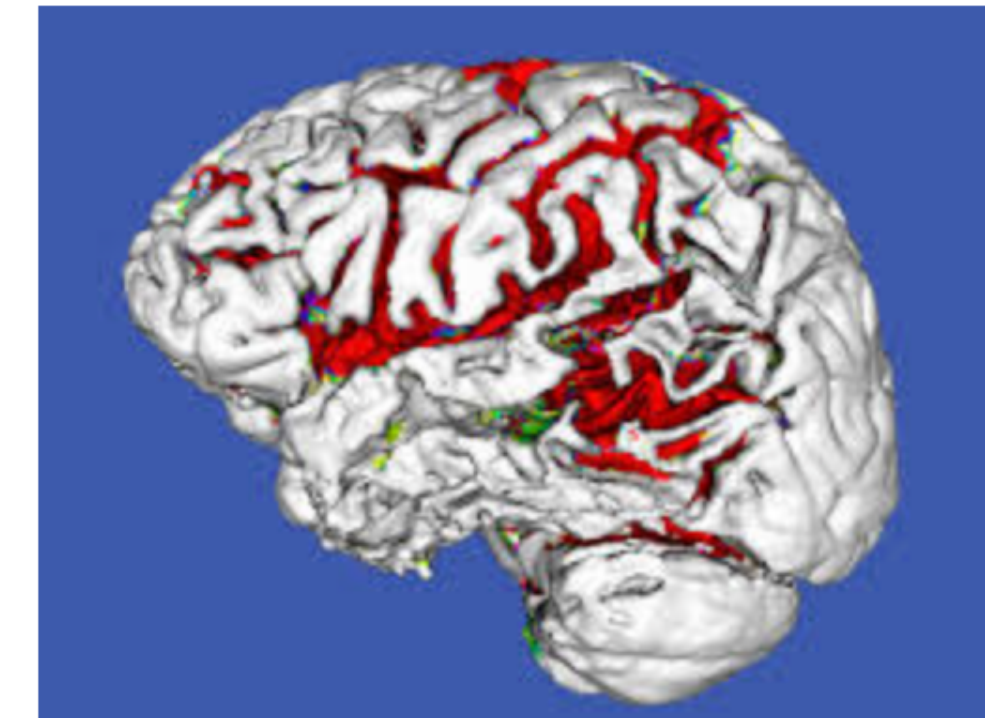
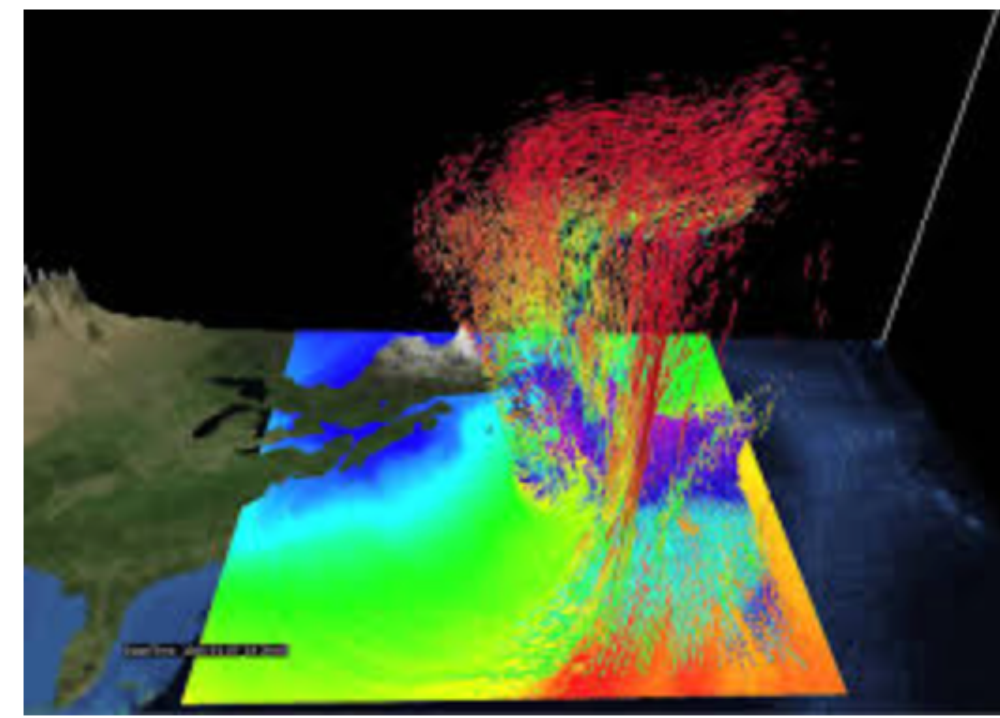
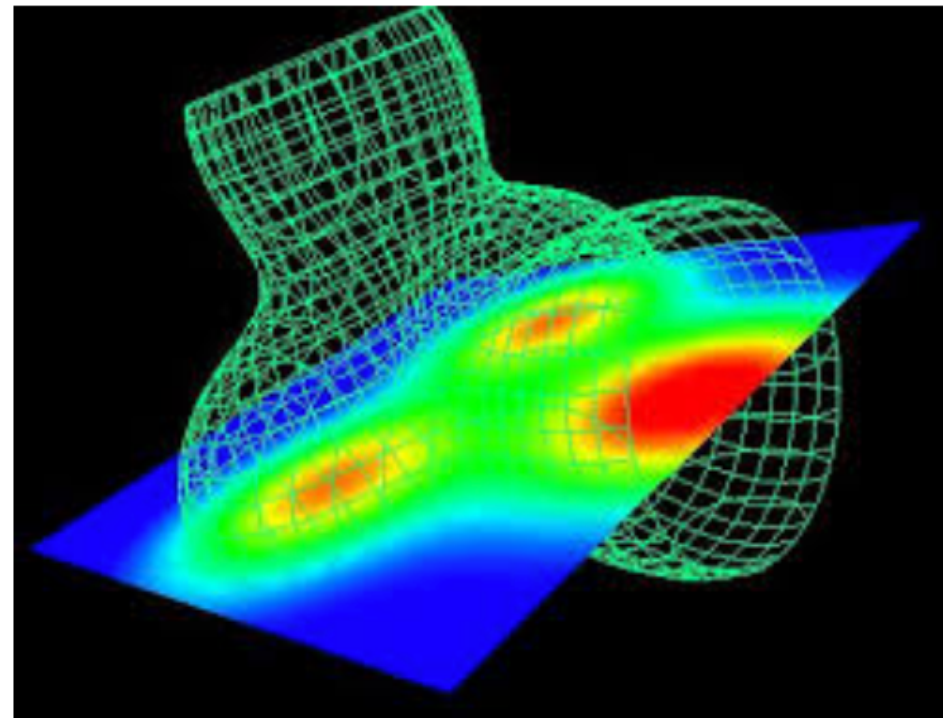
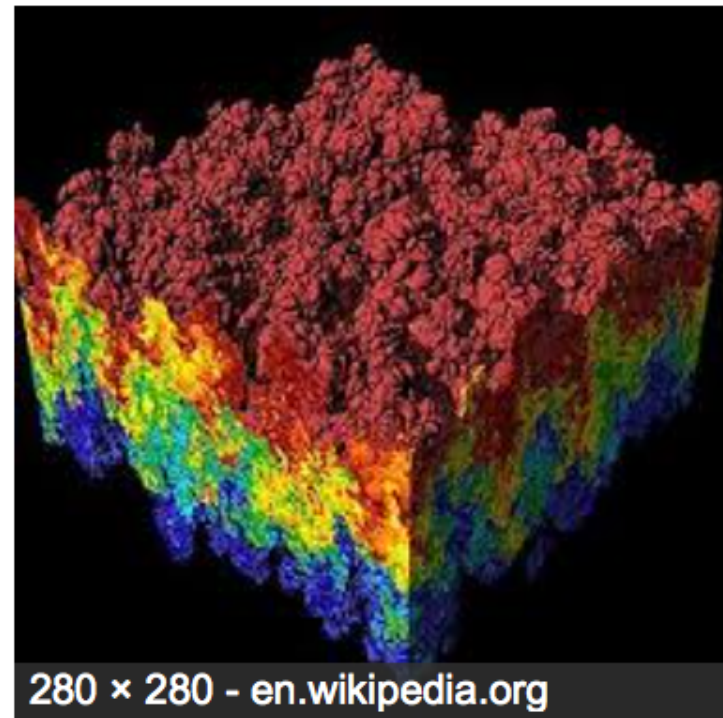
# Scivis and Infovis

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- Two subfields of visualization
- **Scivis** deals with data where the spatial position is given with data
  - Usually continuous data
  - Often displaying physical phenomena
  - Techniques like isosurfacing, volume rendering, vector field vis
- In **Infovis**, the data has no set spatial representation, designer chooses how to visually represent data



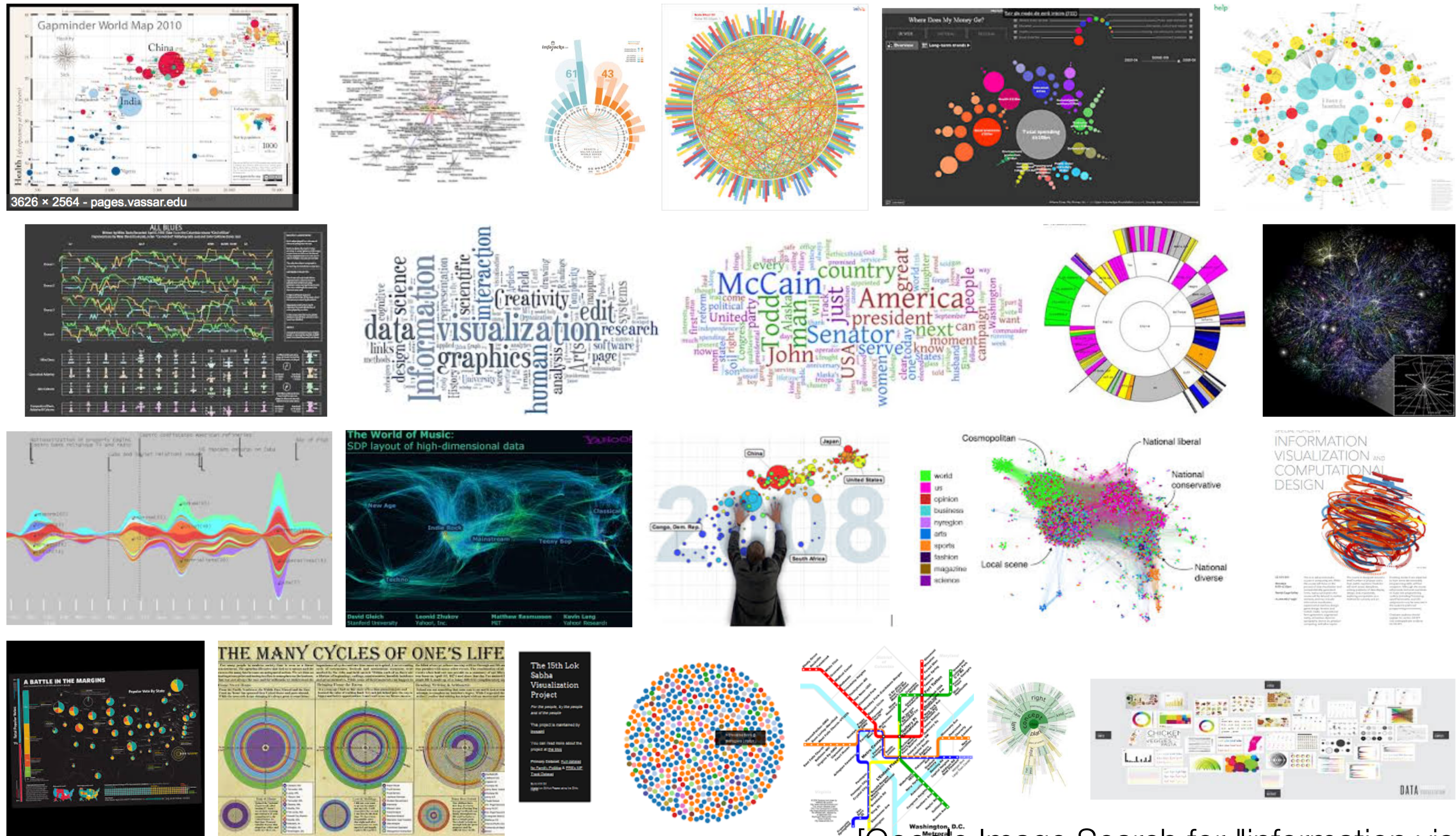
# SciVis



[Google Image Search for "scientific visualization", 2017]



# InfoVis

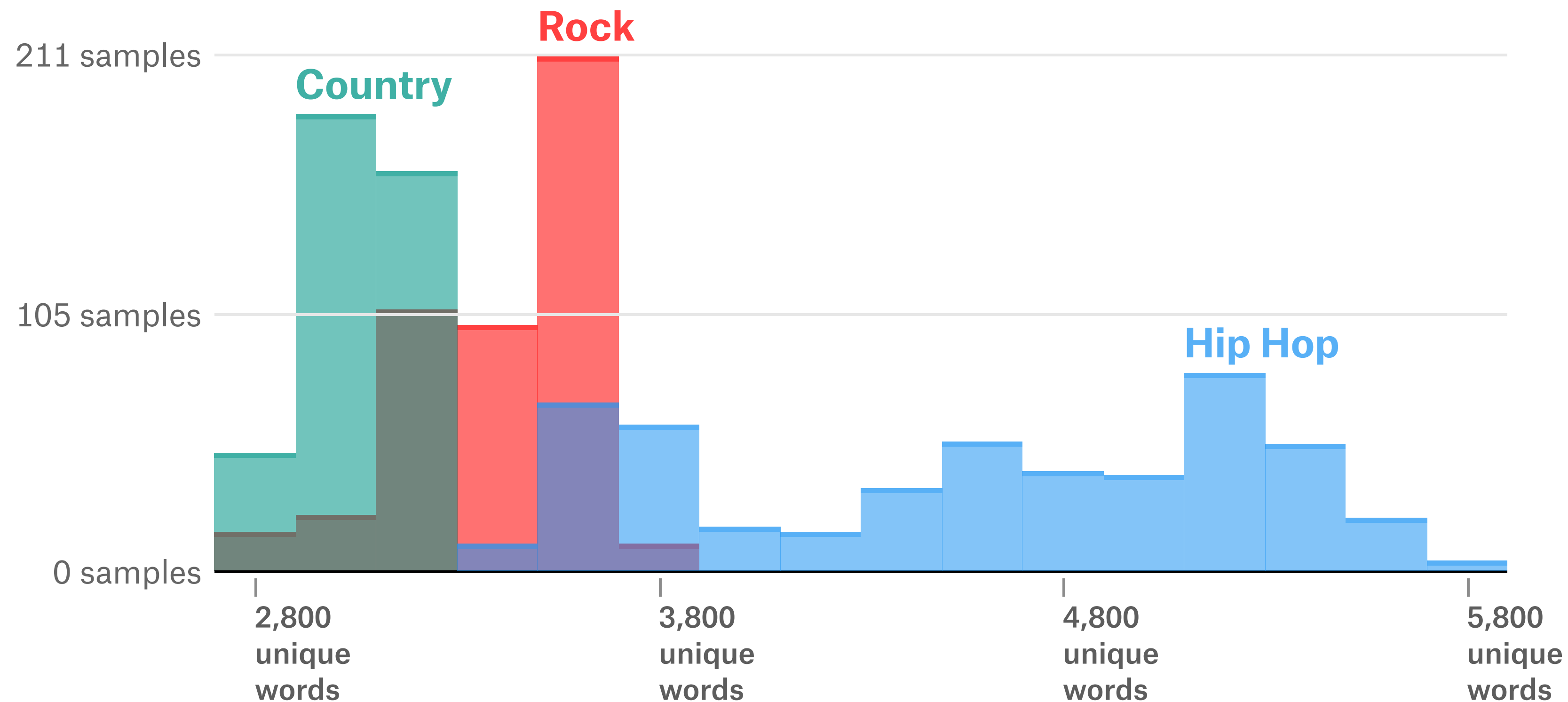


[Google Image Search for "information visualization", 2017]



# Sets & Lists

# of Unique Words Used in 500 Random Samples of 35,000 Lyrics from Country, Rock, Hip Hop

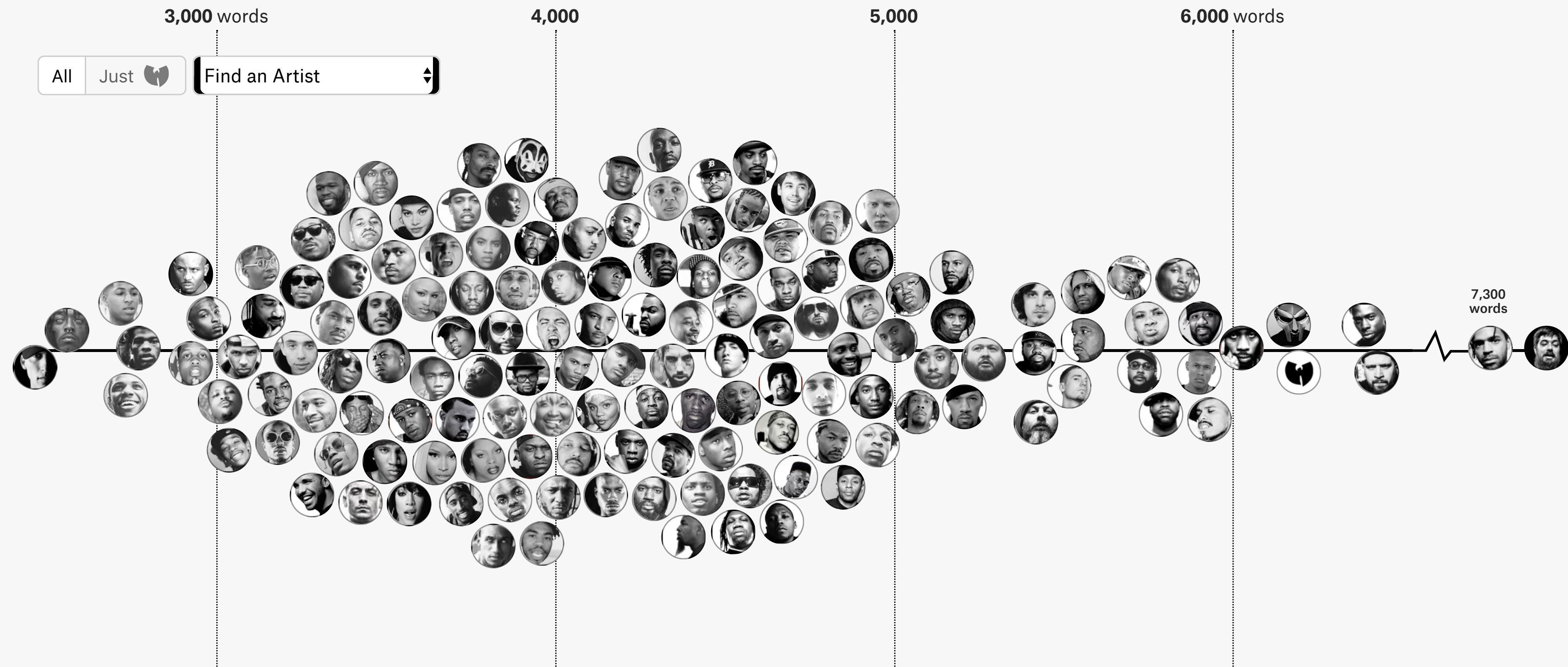


Raw Lyrics Data via John W. Miller

[M. Daniels, 2019]

# Sets & Lists

# of Unique Words Used Within Artist's First 35,000 Lyrics



Notes/sources:

All lyrics are via [Genius](#).

[M. Daniels, 2019]

# Sets & Lists

# of Unique Words  
Used Within Artist's  
First 35,000 lyrics

BY ERA<sup>1</sup>

1980s | 1990s | 2000s | 2010s

# of Unique words Used Within Artists' First 35,000 lyrics											
BY ERA <sup>1</sup>											
1980s   1990s   2000s   2010s											
				Run-D.M.C.							
				2Pac		Biz Markie					
				Big L		Ice T					
				Insane Clown...		Rakim					
				MC Lyte		Brand Nubian					
			Foxy Brown	Scarface		Geto Boys					
			Juvenile	Three 6 Mafia		Ice Cube	Beastie Boys				
			Master P	UGK		Jay-Z	Big Daddy Kane				
			Salt-n-Pepa	Dizzee Rascal		Mobb Deep	LL Cool J				
			Snoop Dogg	Jadakiss		Outkast	Busta Rhymes				
			Eve	Kano		Public Enemy	Cypress Hill				
			Gucci Mane	Lil' Kim		Cam'ron	De La Soul				
			Kanye West	Nelly		Eminem	Fat Joe				
			Lil Wayne	Rick Ross		The Game	Gang Starr				
		Bone Thugs-n...	Missy Elliot	T.I.		Joe Budden	KRS-One				
		50 Cent	Trick Daddy	2 Chainz		Kevin Gates	Method Man				
		Juicy J	Trina	A\$AP Ferg		Royce da 5'9	A Tribe Call...				
		Drake	Young Jeezy	Big KRIT		Tech n9ne	Atmosphere				
		Future	Big Sean	Brockhampton		Twista	Ludacris	Common			
	DMX	Kid Cudi	BoB	Cupcakke		Ab-Soul	Lupe Fiasco	Das EFX		Del the Funk...	
	21 Savage	Kid Ink	Childish Gam...	Hopsin		A\$AP Rocky	Mos Def	E-40		The Roots	
	A Boogie wit...	Kodak Black	G-Eazy	Jay Rock		Danny Brown	Murs	Goodie Mob	Kool G Rap	Blackalicious	
	Lil Baby	Lil Yachty	J Cole	Kendrick Lamar		Death Grips	Talib Kweli	Nas	Kool Keith	Canibus	
	Lil Durk	Logic	Machine Gun ...	Mac Miller		Denzel Curry	Xzibit	Redman	Raekwon	Ghostface Ki...	
	Wiz Khalifa	Migos	Meek Mill	Schoolboy Q		\$uicideboy\$	Flatbush Zom...	Brother Ali	CunninLynguists	Immortal Tec...	GZA
Lil Uzi Vert	YG	Travis Scott	Nicki Minaj	Tyga		Tyler the Cr...	Joey BadA\$\$	Action Bronson	Sage Francis	Jean Grae	Wu-Tang Clan
NF	YoungBoy Nev...	Young Thug	Russ	Vince Staples		Wale	Rittz	KAAN	Watsky	Killah Priest	Jedi Mind Tr...
										RZA	MF DOOM
											Aesop Rock
											Busdriver
<2,675	2,675-3,050	3,050-3,425	3,425-3,800	3,800-4,175	4,175-4,550	4,550-4,925	4,925-5,300	5,300-5,675	5,675-6,050	6,050-6,425	6,425+
unique words	unique words	unique words	unique words	unique words	unique words	unique words	unique words	unique words	unique words	unique words	unique words