

<h1>Information Visualization</h1> <h2>Intro</h2> <p>Tamara Munzner Department of Computer Science University of British Columbia</p> <p><i>10 September 2015</i></p> <p>http://www.cs.ubc.ca/~tmm/courses/547-15</p>	<h3>Audience</h3> <ul style="list-style-type: none"> no prerequisites <ul style="list-style-type: none"> many areas helpful but not required <ul style="list-style-type: none"> human-computer interaction, computer graphics, cognitive psychology, graphic design, algorithms, machine learning, statistics, ... open to non-CS people <ul style="list-style-type: none"> if no programming background, can do analysis or survey project open to advanced undergrads <ul style="list-style-type: none"> talk to me open to informal auditors <ul style="list-style-type: none"> some or all days of readings/discussion, as you like <ul style="list-style-type: none"> you'll get out of it what you put into it... 	<h3>Waitlist</h3> <ul style="list-style-type: none"> currently 40 registered and 16 on waitlist <ul style="list-style-type: none"> wow! don't panic, people are still shopping around for classes highly likely that all who want to take can be accommodated <ul style="list-style-type: none"> without schlepping extra chairs each time :-) make sure to record your name on signup sheet today <ul style="list-style-type: none"> with probability of attending, including real vs audit update at end of class today, and start of class <ul style="list-style-type: none"> structure plans thus slightly tentative <ul style="list-style-type: none"> might tweak depending on final enrollment 	<h3>Class time</h3> <ul style="list-style-type: none"> week 1 <ul style="list-style-type: none"> 1 lecture weeks 2-9: Participation [30%] <ul style="list-style-type: none"> before class: you read chapter+paper, write questions/comments during class: 1 lecture briefly, we discuss, in-class design exercises, ... <ul style="list-style-type: none"> week 2, 3 <ul style="list-style-type: none"> guest lectures (Robert Kosara, Matt Brehmer) week 8 <ul style="list-style-type: none"> no class (annual VIS conference) weeks 10-13: Presentations [20%] <ul style="list-style-type: none"> before one of the classes: you each read paper on topic of your choice during class: you present it to everybody else (~10 min)
<h3>Readings</h3> <ul style="list-style-type: none"> textbook <ul style="list-style-type: none"> Tamara Munzner: Visualization Analysis and Design. AK Peters Visualization Series. CRC Press, 2014. <ul style="list-style-type: none"> http://www.cs.ubc.ca/~tmm/vadbook/ library has multiple ebook copies to buy yourself, cheapest is amazon.com papers <ul style="list-style-type: none"> links posted on course page if DL links, use library EZproxy from off campus readings posted by one week before class usually one chapter + one paper per class session 	<h3>Paper Types</h3> <ul style="list-style-type: none"> technique/algorithm design studies (problem-driven) systems evaluation model/theory 	<h3>Participation [30%]</h3> <ul style="list-style-type: none"> written questions on reading in advance (18% of total mark) <ul style="list-style-type: none"> due 1:30pm (30 min before class) 3 total, at least 1 for each reading bring printout or laptop with you, springboard for discussion discussion/participation in class (12% of total mark) attendance expected <ul style="list-style-type: none"> tell me in advance if you'll miss class (and why) question credit still possible if submitted in advance tell when you recover if you were ill 	<h3>Questions</h3> <ul style="list-style-type: none"> questions or comments fine to be less formal than written report <ul style="list-style-type: none"> correct grammar and spelling still expected be concise: a few sentences is good, one paragraph max! should be thoughtful, show you've read and reflected <ul style="list-style-type: none"> poor to ask something trivial to look up ok to ask for clarification of genuinely confusing section examples on http://www.cs.ubc.ca/~tmm/courses/infovis/structure.html
<h3>Projects [50%]</h3> <ul style="list-style-type: none"> solo, or group of 2, or group of 3 <ul style="list-style-type: none"> groups highly encouraged; amount of work commensurate with group size stages <ul style="list-style-type: none"> pitches (oral, in class): Oct 22 meetings (individual, outside class): through Nov 5 proposals (written): Nov 9, 5pm status updates incl related work (written): Nov 23, 5pm final presentations (oral): Dec 15 afternoon (times TBD) final reports (written): Dec 17, 5pm resources <ul style="list-style-type: none"> software, data project ideas guest lecture: Brehmer on toolkits/resources (Sep 29) 	<h3>Projects</h3> <ul style="list-style-type: none"> programming <ul style="list-style-type: none"> common case I will only consider supervising students who do programming projects three types <ul style="list-style-type: none"> problem-driven design studies (target specific task/data) technique-driven (explore design choice space for encoding or interaction idiom) algorithm implementation (as described in previous paper) analysis <ul style="list-style-type: none"> use existing tools on dataset detailed domain survey particularly suitable for non-CS students survey <ul style="list-style-type: none"> very detailed domain survey particularly suitable for non-CS students 	<h3>Projects: Design Studies</h3> <ul style="list-style-type: none"> BYOD (Bring Your Own Data) <ul style="list-style-type: none"> you have your own data to analyze your thesis/research topic (very common case) dovetail with another course (sometime possible but timing can be difficult) FDOI (Find Data Of Interest) <ul style="list-style-type: none"> many existing datasets, see resource page to get started <ul style="list-style-type: none"> http://www.cs.ubc.ca/group/infovis/resources.shtml 	<h3>Presentations [20%]</h3> <ul style="list-style-type: none"> last several weeks of class present, analyze, and critique one paper <ul style="list-style-type: none"> send me topic choices by Nov 2, I will assign papers accordingly expectations <ul style="list-style-type: none"> slides required summary/description important, but also your own thoughts <ul style="list-style-type: none"> analysis according to book framework critique of strengths and weaknesses timing <ul style="list-style-type: none"> exact times TBD depending on enrollment likely around 10 minutes each topics at http://www.cs.ubc.ca/~tmm/courses/infovis/presentations.html
<h3>Marking</h3> <ul style="list-style-type: none"> 50% Project <ul style="list-style-type: none"> 2% Pitches 10% Proposal 6% Status Updates 12% Final Presentation 20% Final Report 50% Content 20% Presentations <ul style="list-style-type: none"> 75% Content: Summary 50%, Analysis 25%, Critique 25% 25% Delivery: Presentation Style 50%, Slide Quality 50% 30% Participation <ul style="list-style-type: none"> 60% Written Questions 40% In-Class Discussion/Exercises <ul style="list-style-type: none"> marking by buckets <ul style="list-style-type: none"> great 100% good 89% ok 78% poor 67% zero 0% 	<h3>Course Goals</h3> <ul style="list-style-type: none"> twofold goal <ul style="list-style-type: none"> specific: teach you some infovis generic: teach you how to be a better researcher feedback through detailed written comments on writing and presenting <ul style="list-style-type: none"> both content and style at level of paper review for your final project goal: within a week or so fast marking for reading questions <ul style="list-style-type: none"> great/good/ok/poor/zero goal: turn around before next class <ul style="list-style-type: none"> one week at most 	<h3>Finding me</h3> <ul style="list-style-type: none"> email is the best way to reach me: tmm@cs.ubc.ca office hours Tue right after class (3:30-4:30pm) <ul style="list-style-type: none"> or by appointment X661 (X-Wing of ICICS/CS bldg) <ul style="list-style-type: none"> course page is font of all information <ul style="list-style-type: none"> don't forget to refresh, frequent updates http://www.cs.ubc.ca/~tmm/courses/547-15 	<h3>Chapters/Topics</h3> <ul style="list-style-type: none"> What's Vis and Why Do It? Marks and Channels What: Data Abstractions Why: Task Abstractions Rules of Thumb Analysis: Four Levels for Validation Arrange Tables Arrange Spatial Data Arrange Networks Map Color and Other Channels Manipulate View Facet Into Multiple Views Reduce Items and Attributes Analysis Case Studies

Guest Lectures

- Tue Sep 15 (next time!)
 - Robert Kosara, Tableau
 - Tableau intro/overview demo
 - Tue Sep 29
 - Matt Brehmer, UBC
 - resources discussion/demos
- in both cases, brief intro lecture on readings from me first

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Topics Preview

Defining visualization (vis)

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

Why?...

Why have a human in the loop?

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

Visualization is suitable when there is a need to augment human capabilities rather than replace people with computational decision-making methods.

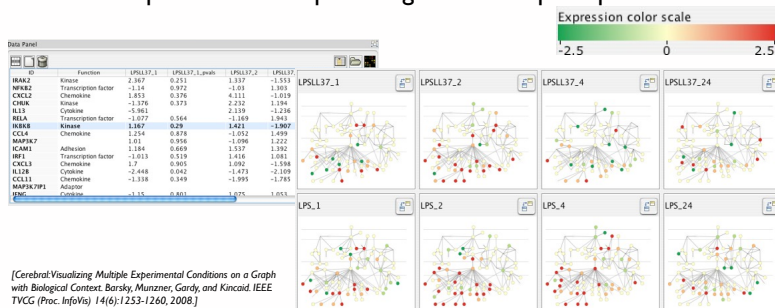
- don't need vis when fully automatic solution exists and is trusted
- many analysis problems ill-specified
 - don't know exactly what questions to ask in advance
- possibilities
 - long-term use for end users (e.g. exploratory analysis of scientific data)
 - presentation of known results
 - stepping stone to better understanding of requirements before developing models
 - help developers of automatic solution refine/debug, determine parameters
 - help end users of automatic solutions verify, build trust

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Why use an external representation?

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

- external representation: replace cognition with perception

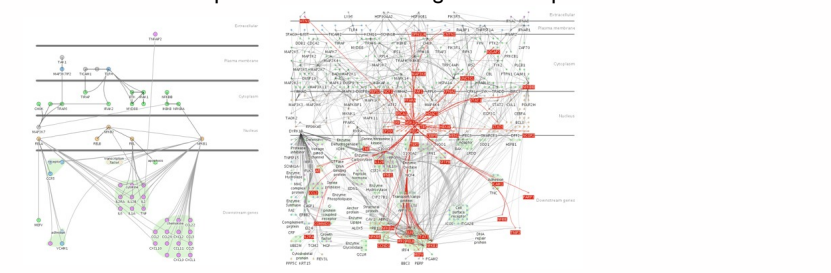


[Cerebral: Visualizing Multiple Experimental Conditions on a Graph with Biological Context. Barsky, Munzner, Gardy, and Kincaid. IEEE TVCG (Proc. InfoVis) 14(6):1253-1260, 2008.]

Why have a computer in the loop?

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

- beyond human patience: scale to large datasets, support interactivity
 - consider: what aspects of hand-drawn diagrams are important?



[Cerebral: a Cytoscape plugin for layout of and interaction with biological networks using subcellular localization annotation. Barsky, Gardy, Hancock, and Munzner. Bioinformatics 23(8):1040-1042, 2007.]

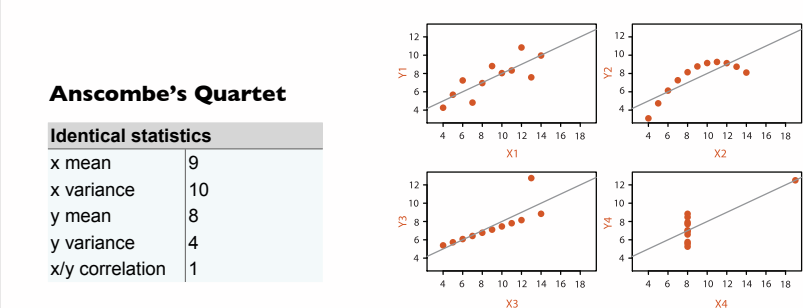
Why depend on vision?

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

- human visual system is high-bandwidth channel to brain
 - overview possible due to background processing
 - subjective experience of seeing everything simultaneously
 - significant processing occurs in parallel and pre-attentively
- sound: lower bandwidth and different semantics
 - overview not supported
 - subjective experience of sequential stream
- touch/haptics: impoverished record/replay capacity
 - only very low-bandwidth communication thus far
- taste, smell: no viable record/replay devices

Why show the data in detail?

- summaries lose information
 - confirm expected and find unexpected patterns
 - assess validity of statistical model

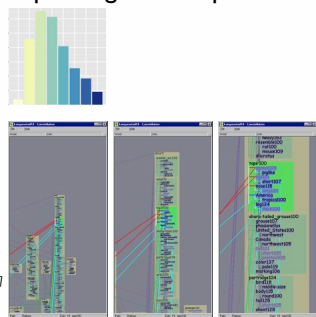


Idiom design space

The design space of possible vis idioms is huge, and includes the considerations of both how to create and how to interact with visual representations.

- **idiom**: distinct approach to creating or manipulating visual representation

- how to draw it: **visual encoding** idiom
 - many possibilities for how to create
- how to manipulate it: **interaction** idiom
 - even more possibilities
 - make single idiom dynamic
 - link multiple idioms together through interaction



[A layered grammar of graphics. Wickham. Journal of Computational and Graphical Statistics 19:1 (2010), 3–28.]
[Interactive Visualization of Large Graphs and Networks. Munzner. Ph.D. thesis, Stanford University Department of Computer Science, 2000.]

Why focus on tasks and effectiveness?

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

- tasks serve as constraint on design (as does data)
 - idioms do not serve all tasks equally!
 - challenge: recast tasks from domain-specific vocabulary to abstract forms
- most possibilities ineffective
 - validation is necessary, but tricky
 - increases chance of finding good solutions if you understand full space of possibilities
- what counts as effective?
 - novel: enable entirely new kinds of analysis
 - faster: speed up existing workflows

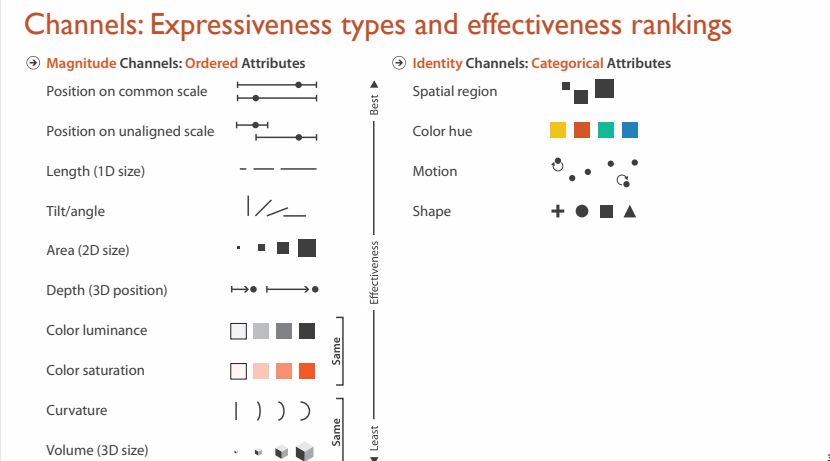
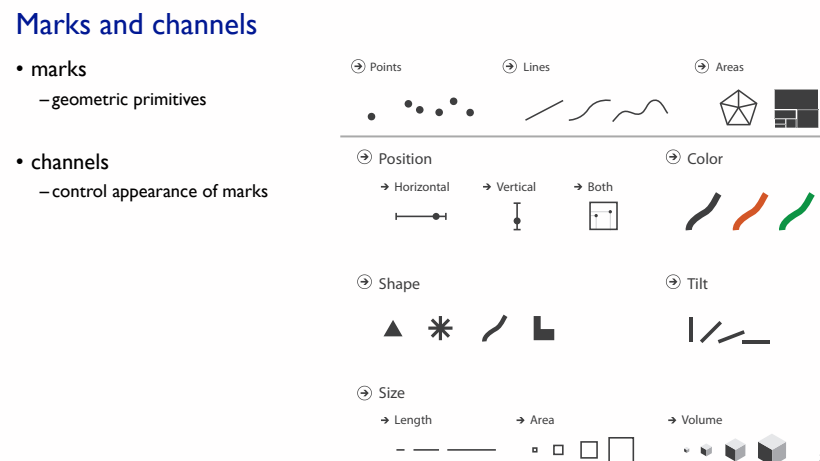
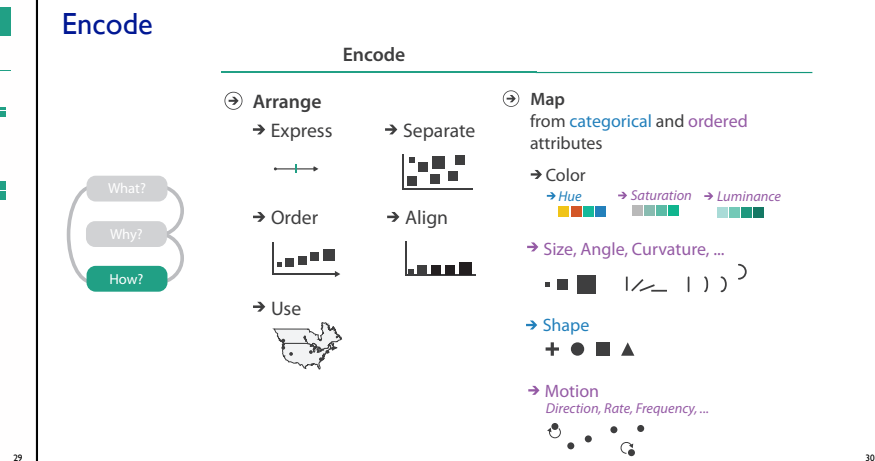
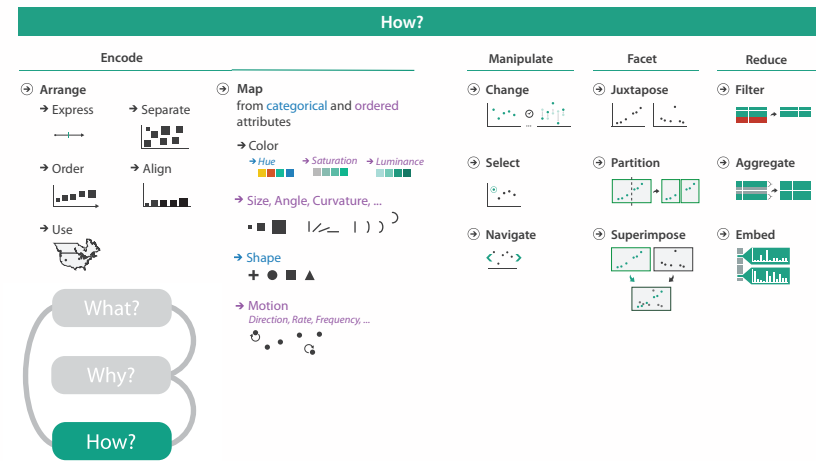
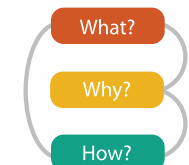
Resource limitations

Vis designers must take into account three very different kinds of resource limitations: those of computers, of humans, and of displays.

- computational limits
 - processing time
 - system memory
- human limits
 - human attention and memory
- display limits
 - pixels are precious resource, the most constrained resource
 - **information density**: ratio of space used to encode info vs unused whitespace
 - tradeoff between clutter and wasting space, find sweet spot between dense and sparse

Analysis: What, why, and how

- **what** is shown?
 - **data** abstraction
 - **why** is the user looking at it?
 - **task** abstraction
 - **how** is it shown?
 - **idiom**: visual encoding and interaction
- abstract vocabulary avoids domain-specific terms
 - translation process iterative, tricky
- what-why-how analysis framework as scaffold to think systematically about design space



What? Why? How?

Datasets

- Data Types: Items, Attributes, Links, Positions, Grids
- Data and Dataset Types: Tables, Networks & Trees, Fields, Geometry, Clusters, sets, lists
- Dataset Types: Tables, Networks, Fields (Continuous), Multidimensional Table, Trees, Geometry (Spatial)
- Dataset Availability: Static, Dynamic

Attributes

- Attribute Types: Categorical, Ordered, Quantitative
- Ordering Direction: Sequential, Diverging, Cyclic

Dataset types

- Dataset Types:
 - Tables: Attributes (columns), Cell containing value
 - Networks: Link, Node (item)
 - Fields (Continuous): Grid of positions, Cell, Value in cell
 - Geometry (Spatial): Position
 - Multidimensional Table: Key 1, Key 2, Value in cell
 - Trees

Attribute types

- Attribute Types:
 - Categorical: +, ●, ■, ▲
 - Ordered: Ordinal, Quantitative

Why? What? How?

Actions

- Analyze: Consume, Discover, Produce, Search, Query

Targets

- All Data: Trends, Outliers, Features
- Attributes: One, Many, Distribution, Extremes
- Network Data: Topology, Paths
- Spatial Data: Shape

{action, target} pairs

- discover distribution
- compare trends
- locate outliers
- browse topology

Actions: low-level query

- Query: Identify, Compare, Summarise
- how much of the data matters?
 - one, some, all

Why: Targets

- ALL DATA: Trends, Outliers, Features
- NETWORK DATA: Topology, Paths
- ATTRIBUTES: One, Many, Distribution, Extremes, Dependency, Correlation, Similarity
- SPATIAL DATA: Shape

Rules of Thumb

- No unjustified 3D
- Eyes beat memory
- Resolution over immersion
- Overview first, zoom and filter, details on demand
- Function first, form next
- ...

Four Levels of Design

- domain situation: all aspects of user context
- data/task abstraction: why/what
- encoding/interaction idioms: how
- algorithm: efficient implementation of idioms

Nested Levels of Design and Validation

- mismatch: cannot show idiom good with system timings
- mismatch: cannot show abstraction good with lab study

How?

Encode

- Arrange: Express, Order, Use
- Map: from categorical and ordered attributes

Manipulate

- Change
- Select
- Navigate

Facet

- Juxtapose
- Partition
- Superimpose

Reduce

- Filter
- Aggregate
- Embed

Arrange space

Encode

- Arrange: Express, Order, Use
- Separate
- Align

Arrange tables

- Express Values
- Separate, Order, Align Regions
- Axis Orientation: Rectilinear, Parallel, Radial
- Layout Density: Dense, Space-Filling
- 1 Key List, 2 Keys Matrix, 3 Keys Volume, Many Keys Recursive Subdivision

Arrange spatial data

- Use Given:
 - Geometry: Geographic, Other Derived
 - Spatial Fields:
 - Scalar Fields (one value per cell): Isocontours, Direct Volume Rendering
 - Vector and Tensor Fields (many values per cell): Flow Glyphs (local), Geometric (sparse seeds), Textures (dense seeds), Features (globally derived)

Arrange networks and trees

- Node-link Diagrams: Connections and Marks
- Adjacency Matrix: Derived Table
- Enclosure: Containment Marks

Color: Luminance, saturation, hue

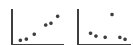
- 3 channels:
 - identity for categorical: hue
 - magnitude for ordered: luminance, saturation
- other common color spaces:
 - RGB: poor choice for visual encoding
 - HSL: better, but beware: lightness ≠ luminance

Manipulate

- Change View Over Time
- Select
- Navigate:
 - Item Reduction
 - Attribute Reduction
 - Zoom: Geometric or Semantic
 - Pan/Translate
 - Constrained
 - Slice
 - Cut
 - Project

Facet

→ Juxtapose



→ Partition



→ Superimpose

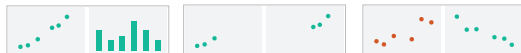


→ Share Encoding: Same/Different

→ *Linked Highlighting*



→ Share Data: All/Subset/None



→ Share Navigation



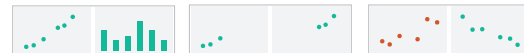
Juxtapose and coordinate views

→ Share Encoding: Same/Different

→ *Linked Highlighting*



→ Share Data: All/Subset/None



→ Share Navigation



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Reduce items and attributes

- **reduce/increase: inverses**
- **filter**
 - pro: straightforward and intuitive
 - to understand and compute
 - con: out of sight, out of mind
- **aggregation**
 - pro: inform about whole set
 - con: difficult to avoid losing signal
- **not mutually exclusive**
 - combine filter, aggregate
 - combine reduce, change, facet

Reducing Items and Attributes

→ Filter



→ Attributes



→ Aggregate



→ Attributes



Reduce

→ Filter



→ Aggregate



→ Embed



Embed: Focus+Context

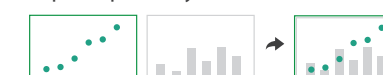
- **combine information within single view**
- **elide**
 - selectively filter and aggregate
- **superimpose layer**
 - local lens
- **distortion design choices**
 - region shape: radial, rectilinear, complex
 - how many regions: one, many
 - region extent: local, global
 - interaction metaphor

→ Embed

→ Elide Data



→ Superimpose Layer



→ Distort Geometry



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Next Time

- to read
 - Book: Marks and Channels (Ch 5)
 - Paper: Polaris
 - academic paper, Tableau is the spinoff company
- guest lecture by Robert Kosara on Tableau

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