# Deconstructing Visualizations 

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## Last Time: Visual Explainers

## Narrative Storytelling

narrative (n): An account of a series of events, facts, etc., given in order and with the establishing of connections between them
"... require[s] skills like those familiar to movie directors, beyond a technical expert's knowledge of computer engineering and science."

- Gershon \& Page '01



## Announcements

## Final project

New visualization research or data analysis

- Pose problem, Implement creative solution
- Design studies/evaluations


## Deliverables

- Implementation of solution
- 6-8 page paper in format of conference paper submission
- Project progress presentations


## Schedule

- Project proposal: Mon 11/5
- Project progress presentation: $11 / 12$ and $11 / 14$ in class ( $3-4 \mathrm{~min}$ )
- Final poster presentation: 12/5 Location: Lathrop 282
- Final paper: 12/9 11:59pm


## Grading

- Groups of up to 3 people, graded individually
- Clearly report responsibilities of each member


## Deconstructing Visualizations






Pixels are a poor representation of charts and graphs Cannot index, search, manipulate or interact with the data

Goal: Reconstruct higher-level representation of charts and graphs that lets machines and people redesign, reuse and revitalize them




## Approach

Classification: Determine chart type
Mark extraction: Retrieve graphical marks
Data extraction: Retrieve underlying data table

## Classification

## Training the Classifier



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## Training the Classifier



## Classifying an Input Image



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##  <br> 

| Corpus: 667 charts, 5 chart types [Prasad 2007] | Average Accuracy |
| :--- | ---: |
| [Prasad 2007] Multi-class SVM | $84 \%$ |
| ReVision: Multi-class SVM | $88 \%$ |
| ReVision: Binary SVM (yes/no for each chart type) | $96 \%$ |

## Our Corpus

Over 2500 labeled images and 10 chart types


ReVision binary SVMs give $\mathbf{9 6 \%}$ classification accuracy

## Mark and Data Extraction

## Assumptions

Bar charts and pie charts only
No shading or texture, 3D, stacked bars, or exploded pies


## Bar Charts



## Bar Charts


marks: lines

$y$-value $x$-value
50
35
A
35 B
4
75
D


Extract Data


## Pie Charts



## Extraction Results



## Redesign





## Limitations




Visual elements that are layered onto a chart to facilitate the perceptual and cognitive processes involved in chart reading


## Graphical overlay gallery

This gallery contains examples of graphical overlays, described in our paper. We have extracted marks and data from the charts using ReVision (for bars and pie charts) and Datathief (for line charts), but all of the overlays are generated in-browser. Try out some of the parameters, or click on an image thumbnail below the gallery to view some example overlays.


Exchange rates are at current level
Source: European Union

Chart type: Bar *
Chart: 00281
Overlay type: Reference structures $\ddagger$

- Regular gridlines

Lines emanating from marks

## Parameters

- Overlay Underlay
$\odot$ Static Interactive
Divisions
Line thickness: $\quad$,
Places regular gridlines at user defined intervals.

Demo




European Union budgets since 2000


## Most overlays only require access to marks

Reference structures (marks)
Highlights (marks)
Redundant encodings (marks and data)
Summary statistics (marks)
Annotations (marks)



## Example 1: Pew Research

Are People Better Off in Free Market Economy?


Skepticism for capitalism is lowest in Brazil (22\%), China (19\%), Germany (29\%) (although East Germans are less supportive than West Germans) and the U.S. (24\%). Skepticism for free markets is highest in Mexico (60\%) and Japan (60\%).

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## Example 2: Economist



Top earners have attracted more opprobrium as their salaries and the performance of the economy have headed in opposite directions. Europeans and Latin Americans tend to have similar attitudes to the rich; the Anglo-Saxon world is a bit more forgiving.


## Demo

Evaluation


Avg. $\mathrm{F}_{1}$ distance: expert specified references vs. crowd specified references

## Ongoing and Future Work

## Deconstructing D3 Charts



Automatically convert D3 code into mapping based representation to enable redesign and style reuse

## Automatic Redesign

Can we automatically redesign charts to improve
Perceptual effectiveness?
Visual aesthetics?
Accessibility for vision impaired users?


Data Source


Style Target


Result


## Takeaways

A chart is a collection of mappings between data and marks

We can reconstruct this representation from chart bitmaps

Such reconstruction enables redesign, reuse and revitalization

