

Slides adapted from Hendrik Strobelt, Irene Ross, Jeff Herr and Alex Lex

whether the tweet is **positive**, **negative**, **or neutral**. So far you've scraped:

5
5
7

# You are scrapping twitter for tweets about **Bob Ross** to create a visualization communicating the time, number of retweets and

of tweets	sentiment
	3 neutral, 2 positive
	3 positive, 3 negative
	1 positive, 4 neutral, 2
	negative

This captures the popularity of the content produced by or for a speaker, but not the popularity of their talk.

20<mark>16</mark> 🔻

### wattenberg

viegasf



### http://vallandingham.me/openvis\_tweets/

day 1 day after day 2

day 1 day after day 2



# Challenges of text and language abstract and unstructured

### **Structured Data**

- Graphs
- Tables

### **Unstructured Data**

Video Images **Text** 

### **Text is semi-structured**

- Grammatical rules
- linear perception

### • Words → Sentences → Paragraphs → Documents

# Text Unit Hierarchy

### Level of detail that we can analyze in text

linguistic visualization



### Language Main medium for communication

- More expressive than visualization
- religions,...)

# Extremely expressive for communicating complex ideas different across population groups (countries, accents,

# Why visualize text?

# Why Visualize Text?

### Worldwide Corporate Data Growth



Sources: IDC, The Digital Universe 2010

Exabytes

# More abundant than structured data



Unstructured text Structured data

### Design and Text

# Typography

Style, arrangement, or appearance of printed letters on a page Visual medium for language

# Design and Text Typography Sans Serif, Serif, Bold, Italic point size (10pt, 12pt, 24pt, 36pt.) line length (alignment: left, right, justified) **Leading:** vertical line spacing **Tracking:** spacing between groups of letters

combining letters to a glyph ligatures

**Kerning:** space between actual letters





 $fi \rightarrow fi$  $f1 \rightarrow f1$ 

### Erik Spiekermann, self described typomaniac

### **Creating a font requires profound** design knowledge

We [designers] are interpreters, not merely translators, between sender and receiver. What we say and how we say it makes a difference. If we want to speak to people, we need to know their language. In order to design for understanding, we need to understand design.

### **Design choices influe** your message



### Comic Sans/Higgs Boson catastrophe of 2012



### Taking the god particle seriously

One of the most important scientific discoveries in the last 100 years

Presented their work in Comic sans.

Does the medium fit the message?

### http://www.comicsanscriminal.com/



### Other recorded offences of bad font choices







### Does Papyrus Belong Here?

Hi, I'm Emily. Let's talk about Papyrus.



### We use text visualization on a daily basis...

## Visualization for "Raw" Text



### Enriched text - hypertext linking (graph navigation)

### Screenshot

### E SECTIONS Q SEARCH

The Opinion Pages

At 11:33 AM ET BUSINESS DAY »

1,850.83 16,231.21 4,312.48 Rail Shipments of Oil

Dow Nasdaq U.S. Orders Tests on

railcars.

OP-ED CONTRIBUTOR

Abolitionist or **Terrorist?** 

Why Denmark Vesey

remains a divisive

Editorials: A Military Budget

figure in South

MORE IN OPINION

MARKETS »

+5.71

+0.31%

the second

5.6P. 500

to Fit the Times

Edsall: Why the I.R.S.

andal Won't Go Away

Room for Debate: How the

+51.55

+0.32% +0.58%

West Can Shape Ukraine

Quotes | My Portfolios »

Carolina.

ESCRIBE NOW SIGN IN Register 🔅

EDITORIAL OBSERVER

or just his district?

OP ED COLUMNISTS

Backward

The Education of a Long

Representative Peter King has

a new out look on immigration

reform. Did his heart change

Dowd: Parade Marches

Friedman: Don't Just Do

Something. Sit There.

Bittman: 'Rights' to

**Dangerous Behaviors** 

+24.89 Recent accidents have drawn

attention to the risks of

shipping large quantities of

crude oil in unpressurized

Island Conservative

All Section

### Putin Orders a Surprise Army Exercise Near a Fragile Ukraine

By STEVEN LEE MYERS and RICK GLADSTONE 27 minutes ago President Vladimir V. Putin ordered the exercise of ground forces in western Russia and air forces across the country The order came as thousands of ethnic Russians demonstrated in Crimea's regional capital of Simferopol, protesting the political upheavals in Kiev.

Comments · In North Caucasus, a Bumpy **Revitalization** Course 46 minutes ago

E.U. Weighs Its Options on Support for New Ukraine

### Kingpin's Arrest Is Unlikely to Break Mexico Drug Cartel

By GINGER THOMPSON and RANDAL C. ARCHIBOLD Officials say the Sinaloa cartel has transcended its leader, Joaquín Guzmán Loera, learning better than its competitors how to produce and move drugs, establish new markets and outsource business. Comments

### Senate Report Says Credit Suisse Helped **Clients Hide Billions**

By ANNIE LOWREY A two-year investigation concluded that the Zurich based bank actively helped thousands of Americans evade taxes.

Comments ON THE BLOGS

DealBook: Bitcoin Site's Failure Stirs Ire and Hope Well: How to Get Fit in a Few Minutes a Week · Sinosphere: Attacker Stabs

Ousted Hong Kong Editor

TimesMinute

VIDEO >



U.S. INTERNATIONAL 中文网

**Ehe New York Eimes** 

WORLD U.S. NEW YORK BUSINESS OPINION SPORTS SCIENCE ARTS FASHION & STYLE VIDEO OLYMPICS

Wednesday, February 26, 2014 🛛 🔳 Today's Paper 🔹 Personalize Your Weather

e opposed to Crimean secession fought with pro-Russia demonstrators in Simferopol on Wednesday.

### An Unfinished Ukraine Palace and a Fugitive's Folly

By ANDREW HIGGINS Workers have abandoned a Pharaonic retreat for Viktor F. Yanukovych that was being built in an old-growth forest. Comments

### Most Democrats Want Clinton Bid in '16, Poll Shows By DALIA SUSSMAN 7:00 AM ET

While party members seem eager for Hillary Rodham Clinton to seek the presidency, the Republican field is more mixed.

Christie Urges Sacrifices but No Solution to Labor Costs

### Mystifying Deaths for 2 Anti-Piracy Guards By NICHOLAS KULISH. IAN URBINA and MARK MAZZETTI

Troubling questions surround how two former members of the Navy SEALs ended up dead inside the Maersk Alabama.

THE HOME FROM A Lender Revives Hopes of Subprime Borrowers By BINYAMIN APPELBAUN

A nonprofit lender is trying to make it easier for low-income people to purchase homes after the mortgage bust.

### Crude Weapons Help Fuel Unrest in Venezuela By WILLIAM NEUMAN

Protesters are using a variety of homemade weapons against troops, including miniature Molotov cocktails and Miguelitos made from hoses festooned with nails.

### Paco de Lucía, Master of Flamenco Guitar, Dies at 66 By RAPHAEL MINDER 47 minutes ago

Mr. de Lucía was born into a musical family and became one of the world's greatest guitarists. finding new audiences for flamenco by blending i with jazz and other genres.

### MORE NEWS

od Obesity

What You Need to Know in New York on Wednesday Chinese Scholar Faces Separatism Charges 8:55 AM ET \* Ex-Pope Denies He Was Forced to Resign 5:48 AM ET

Why Clinton Is a

More Video »

**Campaign Staple** 



Deserving of a Mention, if residential neighborhoods and

A Push to Ban Plastic

INSIDE THE RINGS

Not a Medal

By CHRISTOPHER CLARE

Games, on the snow and ice

A look back at some of the best and worst

performances of

and in the air.

the Sochi



DINING & WINE »

WHAT'S FOR DINNER? A Weeknight Fish



richness and balance of the classic recipe while keeping things simple.

### E Q, WORLD U.S. NEW YORK BUSINESS OPINION SPORTS SCIENCE ARTS FASHION & STYLE VIDEO OLYMPICS



REAL ESTATE AUTOS JOBS ALL CLASSIFIEDS

Search for Properties

 Commercial Real Estate · Post an Ad

agrarian lands. · More Living In Columns »



WINES OF THE TIMES **Biscuits and Scones** The Book on

Amontillado The collective story of this sherry will be rewarding if you are up for the

challenge. Pairings: A Scallop for a

CITY KITCHEN First Time's the Charm With Fresh Pita

Rustic homemade hummus goes best with the

freshest pita, an easy bread-baking project for the home cook.







# Visualization for "Raw" Text Highlighting semantics

21	export class CPTDictionary {		
22	public codeDict = {		
23			
24	PT': {		
25	'physical therapy evaluation' : [97001, 97002],//combined ev		
26	'theraputic excercises' : [97110],		
27	'manual therapy' : [97140],		
28	'theraputic activities': [97530],		
29	'self-care': [97535],		
30	'home management training': [97535],		
31	'neuromuscular re-education': [97112],		
32	'aquatic therapy': [97113],		
33	'physical performance test': [97750],		
34	'physical performance measurement': [97750],		
35	'Extremity muscle testing': [95831],		
36	'trunk muscle testing': [95831]		
37	},		
38			
39	'injection': {		
40	'injection': [		
41	62310, 62312, 62313, 62314, 62315, 62316, 62317, 62318,		
42	62320, 62321, 62322, 62323, 62324, 62325, 62326, 62327		
43			
44	},		
45			
46	'surgery': {		
47	'surgery': [63030],		
48			
49	<u>}</u>		
50			
51	}		
52			
53	<pre>export function create() {</pre>		

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	55		The sector extended and the second state 1 don't want to be event the deside 4 <b>Second Second Second</b> <b>Second Second</b> <b>Second</b> <b>Second Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Second</b> <b>Se</b>
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	59	<pre>* @returns {Date}</pre>	See Select a tradition of the select select a select of the select selec
	60	~~~ <sup>*</sup> /	ican factor factor factorization ( to esta - too configuration (FALTEL estitu- material) and to provide the state of the state (Second Configuration (Second Configuration)) (Second Configuration) (Second Configuration
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	63	<pre>let minDate = new Date();</pre>	res S T T T T T T T T T T T T T
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	67	<pre>minDate = this.parseTime(pat[index]['PROC_DTM'], null)</pre>	20 20 20 20 20 20 20 20 20 20
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### Visualization for "Raw" Text **Overview and detail views** ▼ Boot Camp Install. ÷.





# Visualization for "Raw" Text **Document Lens** '93 Focus and Context

### Zoomed area of interest Without loosing context of the whole document

Robertson, George G., and Jock D. Mackinlay **The document lens** *Proceedings of the 6th annual ACM symposium on User interface software and technology*. ACM, 1993.





# Visualization for "Raw" Text **Visualizing Search Results**

To find keywords in an overview

Thumbnail view shows location of keywords or phrases **Document Thumbnails** with Variable Text Scaling 2012

> **Document Thumbnails with Variable Text Scaling** A. Stoffel, H. Strobelt, O. Deussen, D. A. Keim Computer Graphics Forum, volume 31 issue 3 pp.



### Abstract

Document reader applications usually offer an overview of the layout for each page as thumbnail view. Reading the text in these becomes impossible when the font size becomes very small. We improve the readability of these thumbnails using a distortion method, which retains a readable font size of interesting text while shrinking less interesting text further. In contrast to existing approaches, our method preserves the global layout of a page and is able to show context around important terms. We evaluate our technique and show application examples.

### 1. Motivation



submitted to Eurographics Conference on Visualization (EuroVis) (2012)

is used that highlights the keywords and their context. Other applications might use a different interest function, for instance a sentiment score could be used to create thumbnails for sentiment analysis.

### 2. Related Work

Three different techniques are currently used for handling document overview and navigation : abstraction from the document with pixel based representations, thumbnails with different highlighting techniques, and semantic zooming.

A common pixel based technique is TileBars [Hea95], which visualizes the length of documents and the distribution of search terms within these documents with a rectangular pixel-based visualization. Byrd [Byr99] combines the scrollbar of the document view with a pixel visualization of

### allowing the user to scroll

rence of the terms. Both techniques do not show the context



order to access the context of the search terms

Thumbnails, small version of the document or page, are commonly used for overview and navigation. The spacefilling thumbnail approach of Cockburn et al. [CGA06] avoids scrolling in the overview of a document, by positioning the thumbnails of all pages on a grid on the screen and resizing the thumbnails to fit the window size. Suh et al. [SWRG02] combined the thumbnails with popouts which highlgiht search terms by rendering them in a readable size with a semi-transparently colored background above of the original thumbnail. Woodruff et al. [WRM<sup>10</sup>2] pre-

# Visualization for "Raw" Text **Poemage: Visualizing the Sonic Topology of a Poem**

0 0	Poemage_v01			
Poemage v 0.1 Mod				
Set View	Poem View	Patl		
SONIC RHYMES	Machinations Calcite Clark Coolidge	4		
Identical Rhyme/Rhyme Riche				
AET Perfect Masculine	acetone imprinted Obliqueswatch on the skip car barn oil wall	4		
Perfect Feminine	ocarina & mumps muchwet green I'd leave sole key to this game to my friend, sheepwater cap	(		
Perfect Dactylic	The fear country to this game to my mend, enceptater edu			
Semirhyme	weaving candle turn on computer cigarette, paper wall tarheels & balance			
Syllabic Rhyme	a lot of yellowstickneck He'll have to hurry & carry away, to my blue friend hustling bringing his moon & car	Ŀ		
Consonant Slant Rhyme				
Vowel Slant Rhyme	agate inked merry melodies drool on <u>han</u> of wet lead star tool crayon & <u>sands</u>			
Pararhyme	length of granite buck - drill It's sucking up the strand, his crystal flag, & the eels tube for that their parade wizzle fun			
Syllabic 2 Rhyme				
Alliteration SW	splinter dry -ice spazz (uke- ing ace supper at church hard pinks & sponge breath			
Assonance	Roller window going up on I repeat my offer food list in iron flakes			
Consonance CH SK				
clear beautiful mess	hover word show uncertainty custom set	sł		



### **complex structures** from the interaction of **sonic patterns** in the poem

# Working with Text

Call me Ishmael. Some years ago -- never mind how long precisely -- having little or no money in my purse, and nothing particular to interest me on shore, I thought I would sail about a little and see the watery part of the world. It is a way I have of driving off the spleen, and regulating the circulation. Whenever I find myself growing grim about the mouth; whenever it is a damp, drizzly November in my soul; whenever I find myself involuntarily pausing before coffin warehouses, and bringing up the rear of every funeral I meet; and especially whenever my hypos get such an upper hand of me, that it requires a strong moral principle to prevent me from deliberately stepping into the street, and methodically knocking people's hats off -- then, I account it high time to get to sea as soon as I can. This is my substitute for pistol and ball. With a philosophical flourish Cato throws himself



# Generally want to convert raw text to features



4 x 't' 3 x 'u' 2 x 'r' 2 x 'e'

### structured data

 $\bullet \bullet \bullet$ 

# Steps of Processing to derive Text Features The cleanup:

- Sentence splitting
- •change to lower case
- Removing punctuation
- Stemming <u>demo porter stemmer</u>

• Stop word removal (most frequent words in a language)

# Steps of Processing to derive Text Features Understanding the structure:

### •N-grams, bag of words

- Concordance: Keyword in context • Co-occurrence : Phrase Net POS tagging (part of speech) Sentiment analysis for twitter •NER (name entity recognition) • deep parsing - try to "understand" text.

# **Measuring Structured Text Features**

- Simple counts (bag of words) used for similarity measures
- One of the most basic measures for text analysis
- Divide text into n-grams
- If texts share similar words, may be similar in content



dragon	castle
1	1
0	1

# Wordle

- Frequency-based
  - words that occur often are large
- Can vary font type, size, color, etc.
- One of the most popular text level vis tools

### http://www.wordle.net



tc. vel vis tools

[Viegas 2009]









# Wordle vs Tag Cloud



Fig 2: Wordle vs. Tag Cloud of Barack Obama's speech at the Democratic Convention in 2008.

Can quickly see dominant words Not for precise comparisons and similarity measures

11 addesion advis afford afghanistan ago agree ahead alive america american americans army auto back benefits treats bush trainers businesses Care cars century challenges chance change child children clean clear clinton college companies Country create cut daughters day days debate decades decere democrats deserve dupity datars dreams dave economic economy education election end energy face failure families family finally find finish fix fundamental handamentals future generation george give pring good government grandul great hands hard health hear heard higher home hope idea ideas invest iraq job jobs john judgment kennedy lead leave life lives long longer lost love made make makes making man marter mccain measure meet men mithely middle-days military million moment moments money moral nation new night nuclear obligation oil part party past pay people percent plan plans plans plans politics powerty power president programs progress promise protect proud provide pursue put ready renewable republicans require responsibility restore mand rise safe security SEMBTOF sense on sick signs small stand standards start states stood strength makes talk talking tax taxes waches technology tes things thing threats time today tonight tough troops turn understand united veterans walk washington watch watching whiners woman women WORK worked workers working world years young



# Weighting

Frequency count log frequency : log(1 + tftd) Normalized for proportion Text Frequency by inverse document frequency - **TF IDF** 

### Limitations

Frequency may not be meaningful Does not show the structure Does not explain the context/grammar/POS

# Steps of Processing to derive Text Features Understanding the structure:

- N-grams, bag of words
- Concordance: <u>Keyword in context</u>
- Co-occurrence : Phrase Net
- POS tagging (part of speech)
- Sentiment analysis for twitter
- •NER (name entity recognition)
- deep parsing try to "understand" text.

### Concordance: Keyword in context Word Tree

if love be rough with you , be rough with love .

if love be blind , love cannot hit the mark .

if love be blind, it best agrees with night.

### What is the local context of the word?



[Wattenberg 2008]

# Search for "if" in Romeo & Juliet



The word tree, an interactive visual concordance

M Wattenberg, FB Viégas Visualization and Computer Graphics, IEEE Transactions on 14 (6), 1221-1228



**The word tree, an interactive visual concordance** M Wattenberg, FB Viégas *Visualization and Computer Graphics, IEEE Transactions on 14 (6), 1221-1228* 

# Steps of Processing to derive Text Features **Understanding the structure:**

- N-grams, bag of words
- Concordance: <u>Keyword in context</u>
- Co-occurrence : Phrase Net
- POS tagging (part of speech)
- Sentiment analysis for twitter
- •NER (name entity recognition)
- deep parsing try to "understand" text.

### Phrase Net We are looking for specific linking patterns





Many Eyes finds this word relationship in Jane Austen's text:

Her manners were pronounced to be very bad indeed, a mixture of pride and impertinence; she had no conversation, no stile, no taste, no beauty.

Many Eyes creates the word graph:

Frank van Ham, Martin Wattenberg, and Fernanda B. Viegas. Mapping Text with Phrase Nets. IEEE Transactions on Visualization and Computer Graphics 15, 6 (November 2009)

### pride—impertinence




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# Part of Speech Tagging

Labeling words in text as a specific part of speech How is a word **used in the scope** of a phrase?

Distinguish meaning of the word.

# "I am going to the fair." VS "That is fair"

Explain the **syntactic role** of a word **Infer semantic information** from this due to our knowledge of syntactic role

### Part of Speech Tagging Demo

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### **Sentiment Analysis Subjective information** (opinions and attitudes) from text. Social media is a huge data resource for this.

Basic task is identifying **polarity**: positive, neutral, negative

<u>Tweet sentiment visualization</u>

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- <u>Sentiment analysis</u>
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- <u>context</u> et ch)<u>– demo</u>
- **tion)** erstand" text.

# Name Entity Recognition

Reveals major people, organizations, and places.

Used for **tagging and categorizing** of documents and articles



### deep parsing - try to "understand" text.

- •NER (name entity recognition)
- <u>Sentiment analysis</u>
- POS tagging (part of speech)
- Co-occurrence : Phrase Net
- Concordance: <u>Keyword in context</u>
- N-grams, bag of words

## Steps of Processing to derive Text Features Understanding the structure:

## Text features are complicated

- Toilet out of order. Please use floor below.
- don't know.
- Did you ever hear the story about the blind carpenter who picked up his hammer and saw?

• One morning I shot an elephant in my pajamas. How he got in my pajamas, I

## Visualizing Collections of Documents

- Identify themes across documents
- Identify groupings of documents
- Identify differences between collections
- Understand adjacent information about a particular topic in the collection

### The Bohemian Bookshelf



Alice Thudt, Uta Hinrichs and Sheelagh Carpendale.

The Bohemian Bookshelf: Supporting Serendipitous Book Discoveries through Information Visualization. CHI '12: Proceedings of the SIGCHI Conference on Human Factors in Computing Systems, 2012



KEYWORDS

### Open ended book exploration in the library

Highlight adjacencies between books

Flexible visual pathways

webpage with video





### **JigSaw-** investigate document collections



### **DocumentCards**



### summarize using important terms and important figures





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College and Some Table

### content as a mixture of figure and textual representatives

H. Strobelt, D. Oelke, C. Rohrdantz, A. Stoffel, O. Deussen, D. Keim IEEE Transactions on Visualization and Computer Graphics (TVCG - InfoVis), 2009

> 5 0



## Compare Corpora Compare topics between text collections



Use probabilistic topic modeling to identify topics that discriminate one collection from others.

### Comparison of papers between conferences.

Comparative Exploration of Document Collections: a Visual Analytics Approach (<u>http://ditop.hs8.de</u>) D. Oelke, H. Strobelt, C. Rohrdantz, I. Gurevych, and O. Deussen



# Visualizing and tracking changes How did this document evolve?

### **Traces Project**

### Vis for Time-Evolving Document Collections

### Visualizing tweets in an overview to show saliency of past and present happenings in the context of the evolving conversation



Marian Dörk, Daniel Gruen, Carey Williamson, and Sheelagh Carpendale. <u>A Visual Backchannel for Large-Scale Events</u>. TVCG: Transactions on Visualization and Computer Graphics (Proceedings Information Visualization 2010

## **StoryFlow: Tracking the Evolution of Stories**

### Visual interpretation of a story line.



### THESE CHARTS SHOW MOVIE CHARACTER INTERACTIONS. THE HORIZONTAL AXIS IS TIME. THE VERTICAL GROUPING OF THE LINES INDICATES WHICH CHARACTERS ARE TOGETHER AT A GIVEN TIME.



### https://xkcd.com/657/

## Design Critique: <u>History through the President's words</u>

### **Nationalism**

Liberman shared a colleague's analysis that shows words like "citizens" and "duties" have faded from presidential inaugural addresses, while words like "freedom" and "America" have surged. While it doesn't explain the shift, he suspects that it's likely the trend applies to both types of addresses.

Fields suspected the oscillations in "America" (and variations) shadow the popularity of "God Bless America," which was written by Irving Berlin in 1918 and revised in 1938.



What information is encoded? What marks and channels are they using? Is it effective? What information do you get in overview vs on hover?

## Design Critique: <u>History through the President's words</u>

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### **Create a redesign with your group:** Imagine you ran some sentiment analysis on the speech data How could you encode sentiment in the visualization

Create a redesign encoding polarity of the speech data for listed topics

### Visualization for Translation





### JAPANESE

成層圏は、高度 10km から 50km の範囲にあります.

 $\sim$ 

(c)

### Visualization for Translation

Geometry of translations Colored by the meaning A sentence translated from English →Korean Japanese → English share the same color.



### Z tr

(b)

(c)

### ENGLISH

ne stratosphere extends from about 10km to about 50km in altitude.

100

### KOREAN

성층권은 고도 약 10km부터 약 50km까지 확장됩니다.

### JAPANESE

成層圏は、高度 10km から 50km の範囲にあります.

### Visualization for Translation

Zoom into one of the groups translated sentence

### ENGLISH

ne stratosphere extends from about 10km to about 50km in altitude.

100

### KOREAN

성층권은 고도 약 10km부터 약 50km까지 확장됩니다.

### JAPANESE

成層圏は、高度 10km から 50km の範囲にあります. Color is changed to source language, Network must be encoding semantics rather than phrase to phrase translations Existence of an interlingua?



(c)



### Visualization for Translation



### Seq2Seq-Vis: A Visual Debugging Tool for Sequence-to-Sequence Models <a href="http://seq2seq-vis.io/">http://seq2seq-vis.io/</a>

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### http://textvis.lnu.se/

### **Text Visualization Browser**

A Visual Survey of Text Visualization Techniques Provided by ISOVIS group

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