# ThemeDelta: Dynamic Segmentations over Temporal Topic Models

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Published: IEEE Transactions on Visualization and Computer Graphics 21(5) 2015

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## What: Text Dataset with Timestamps

"I can't believe I have so many racist friends..." "These are the faces of the Syrian refugees. Men, women, and children who's homes were destroyed and were forced to flee."

"Canada extends it's condolences to France."

"Shouldn't we help our homeless before refugees?"

"Terror in Paris..."

"Diversity is our strength. We strongly condemn the acts aimed at certain Canadians after the Paris attacks."

"Canada is full. Say No to terrorists."

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"My great grand parents immigrated from Russia to escape violence... No one told them 'We're full'."

"Canada stands with Paris."

## Why: Identify Scatter/Gather Relationships

"These are the faces of the Syrian refugees. Men, women, and children who's homes were destroyed and were forced to flee."

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"Terror in Paris..."

"Canada stands with Paris."

"Shouldn't we help our homeless before refugees?"

> "Canada is full. Say No to terrorists."

"I can't believe I have so many racist friends..."

"My great grand parents immigrated from Russia to escape violence... No one told them 'We're full'."

"Diversity is our strength. We strongly condemn the acts aimed at certain Canadians after the Paris attacks."

## But what if we have lots of data?

What: Derived Bag of word representation

"Canada extends it's condolences to France."

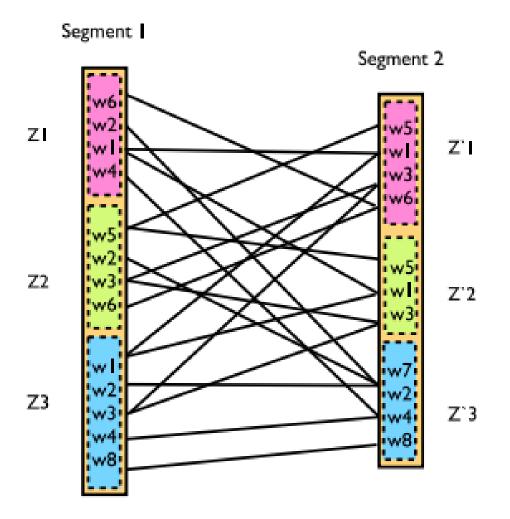
Canada: <u>1</u> Condolences: <u>1</u> France: <u>1</u> Syria: <u>0</u> "These are the faces of the Syrian' Nitugees, grand parents immigrated "Shouldn't we help our help are the data book help syntheting start grand parents immigrated horis hers the data book help syntheting start grand parents in a migrated horis hers the data book help syntheting start grand parents in a migrated horis hers the data book help syntheting start grand parents in a migrated horis hers the data book help syntheting start grand parents in a migrated horis hers the data book help syntheting start grand parents in a migrated horis hers the data book investories the factor of the fill of the fill of the fill of the main candisted and the factor of the synthetic starts and the fill of the fill of the main candisted and the synthetic starts and the starts and the start of the fill of the main candisted and the synthetic starts and the start of the fill of the start of the main candisted and the start of the start of the start of the start of the main candisted and the start of the start of the start of the start of the main can start of the main can start of the main can start of the main can start of the main can start of the main can start of the main can start of the main can start of the main can start of the main can start of the main of the start o

## Processing the bags of words

### Latent Dirichlet Allocation (LDA) Input: Bag of Words over time Output: Topics (Groups of keywords at a specific point in time)

#### **Timeline Segmentation**

Input: Topics Output: Optimal time intervals containing groups of topics



What: Data

Timestamped text dataset

What: Derived

Bag of Words over time

Topics (Groups of keywords at a specific point in time)

Time intervals containing groups of topics

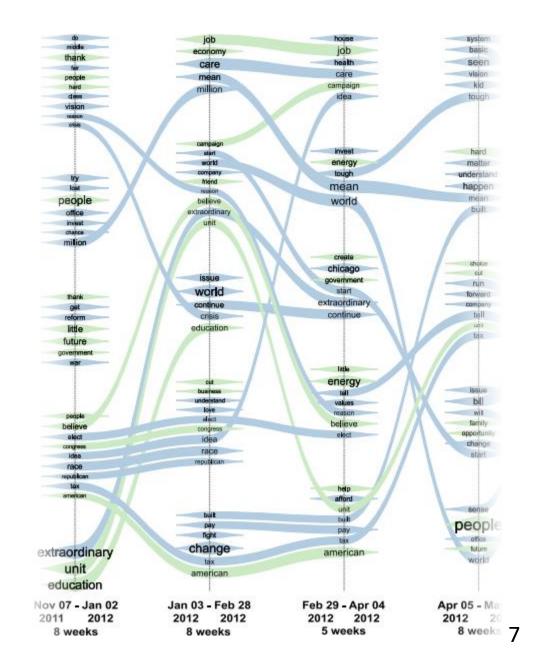
### Why: Tasks

Identify changes in topics over time Identify scatter/gather relationships

How: Encode

Parallel axes for time segmentsSpatially partition topics along a segmentLabel keywords within topicsLinked keywords across time intervalsSegment labels for dates and duration

How: Encode (Free Channels) Size of labels for quantitative data Width of links for quantitative data Link colour for categorical or ordered data



### How: Encode (Free Channels)

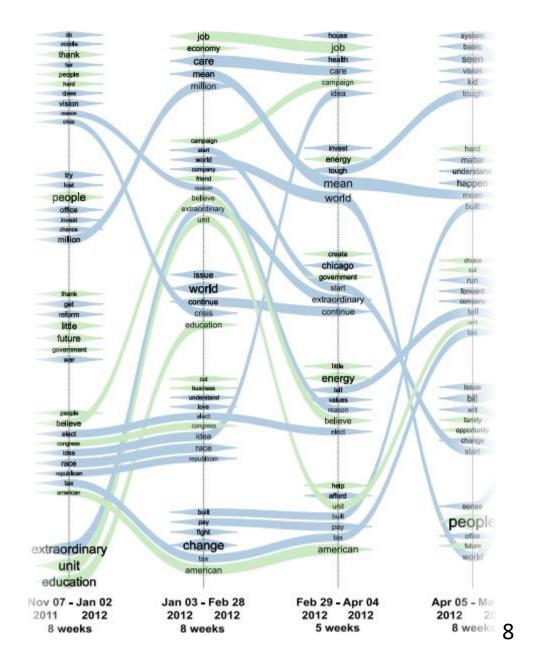
Size of labels for quantitative data Width of links for quantitative data Link colour for categorical or ordered data

### How: Manipulate

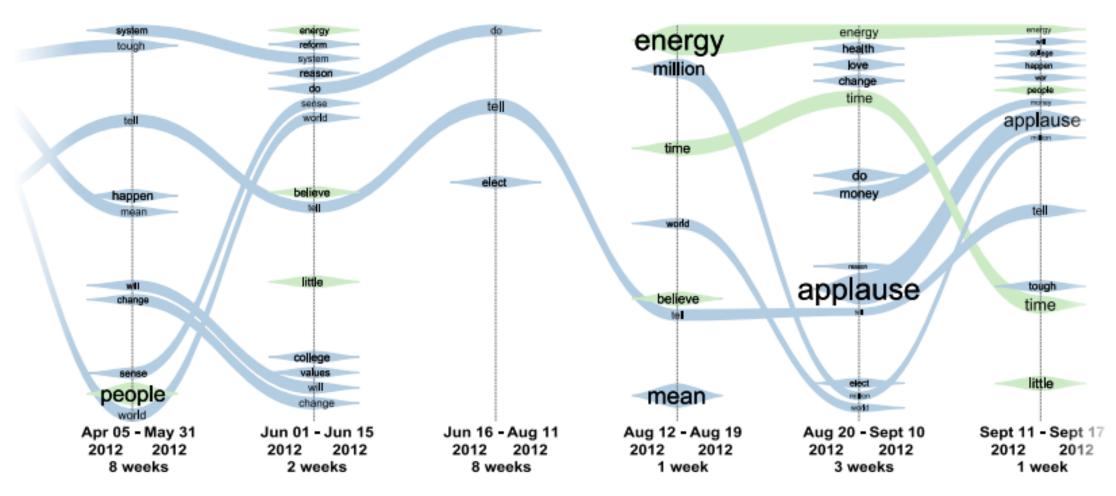
Navigate: geometric zooming and panning Select: highlight keywords Search: Select keywords by searching

### How: Reduce

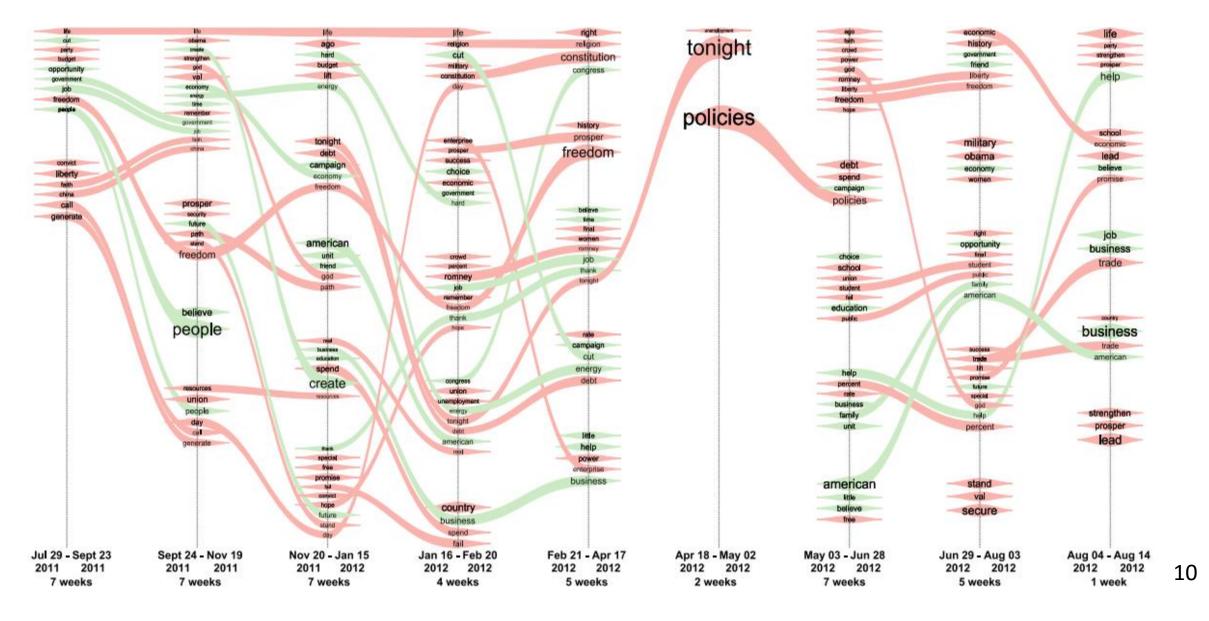
Filter: by selected keywords and resort



## Filtering on "Energy"



### Example: US Presidential Election 2012 - Mitt Romney



### Spanish Flu in the News

#### Sep 09 – Oct 09

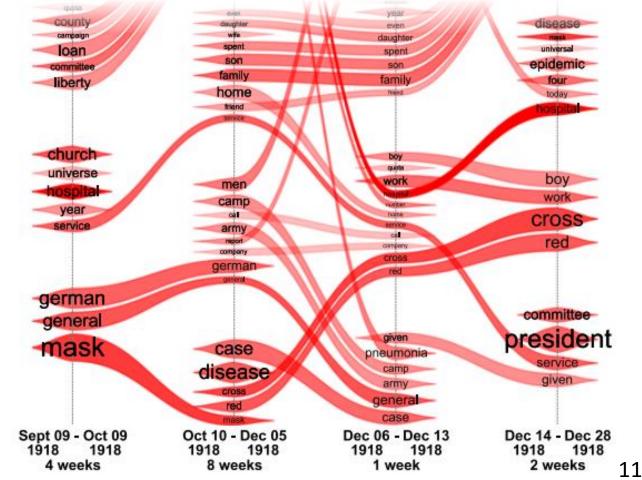
"German", "mask" – advisories from the first world war to wear a mask

### Oct 10 – Dec 05

"home", "family", "son", "daughter" – men from the army were allowed to return home

Dec 06 – Dec 13

"German" disappears – The war was won on November 11.



## Expert User Study on Spanish Flu Data

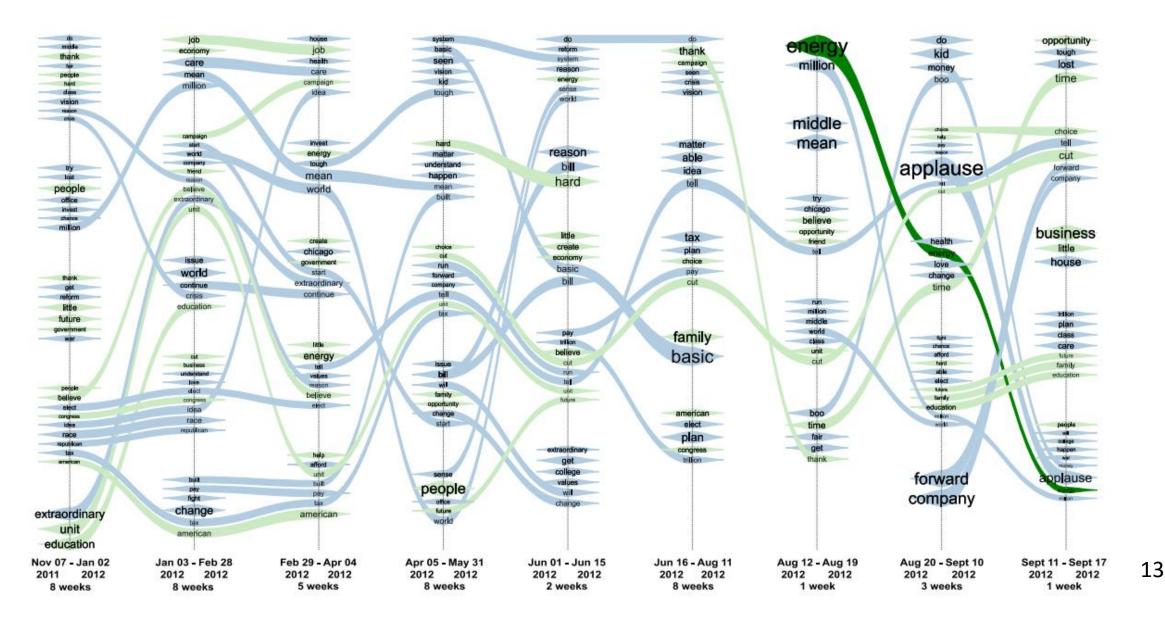
### **Changed-Focused Questions**

- How did the newspapers describe the spread of influenza?
- How does the description of the pandemic change over time?
- Are there different times when the influenza pandemic becomes less important? What are those time periods?

### **Connection-Focused Questions**

- What are the categories that appear to be associated with influenza in different newspapers?
- Was there a specific feeling that surrounded the influenza reporting in the newspapers?

### Scalability Limits



## Thank You

### References

*ThemeDelta: Dynamic Segmentations over Temporal Topic Models*, by Samah Gad, Waqas Javed, Sohaib Ghani, Niklas Elmqvist, Tom Ewing, Keith N. Hampton, Naren Ramakrishnan, in IEEE Transactions on Visualization and Computer Graphics 21(5) 2015.

*Visualization Analysis and Design*, by Tamara Munzner, A K Peters Visualization Series, CRC Press, 2014.

What: Data

Timestamped text dataset What: Derived

Bag of Words over time

Topics (Groups of words)

Time intervals containing groups of topics Why: Tasks

Identify changes in topics over time Identify scatter/gather relationships How: Encode

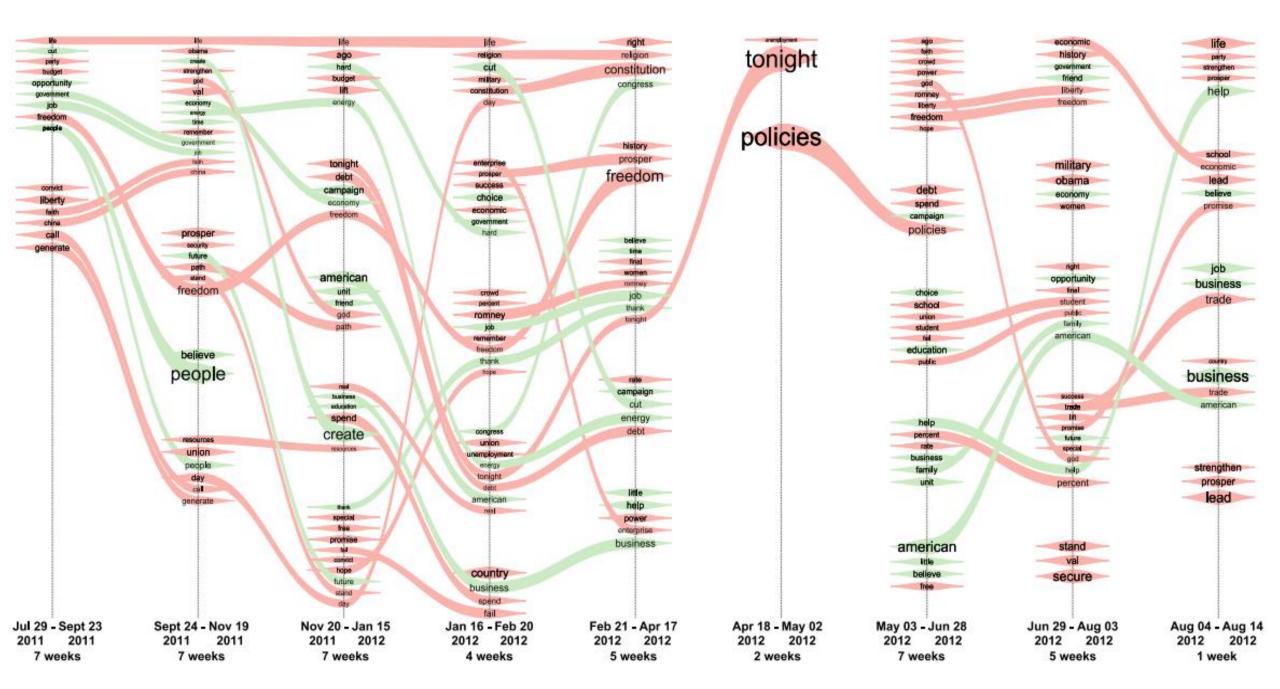
> Parallel axes for time segments Spatially partition topics along a segment Label keywords within topics Linked keywords across time intervals Segment labels for dates and duration

How: Encode (Free Channels)
Size of labels for quantitative data
Width of links for quantitative data
Link colour for categorical or ordered data
How: Manipulate

Navigate: geometric zooming and panning Select: highlight keywords Search: Select keywords by searching

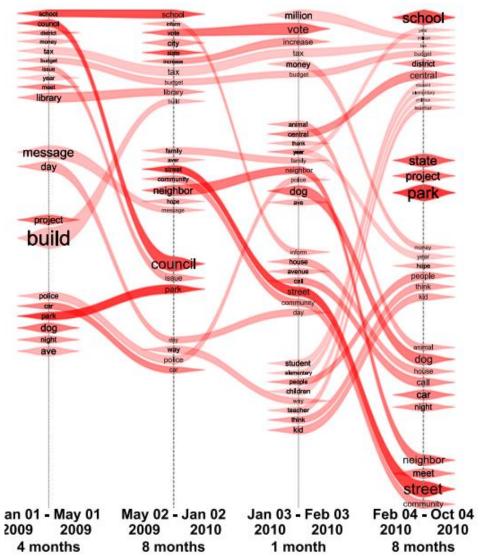
How: Reduce

Filter: by selected keywords and resort

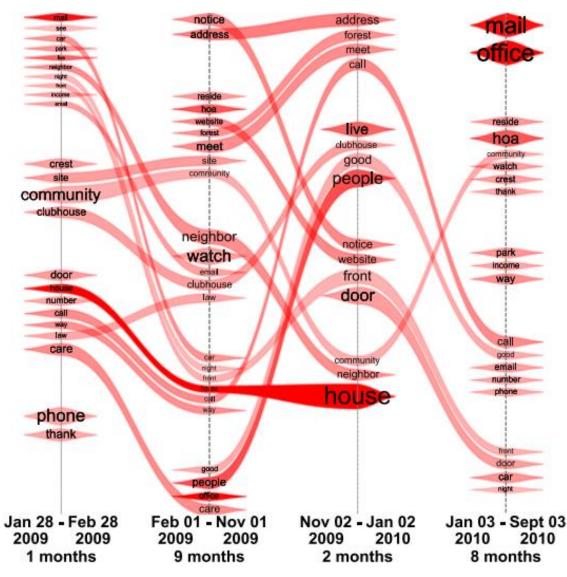


### Low vs High Income Neighbourhood Discussions

#### Low Income



High Income



## Layout Sorting

