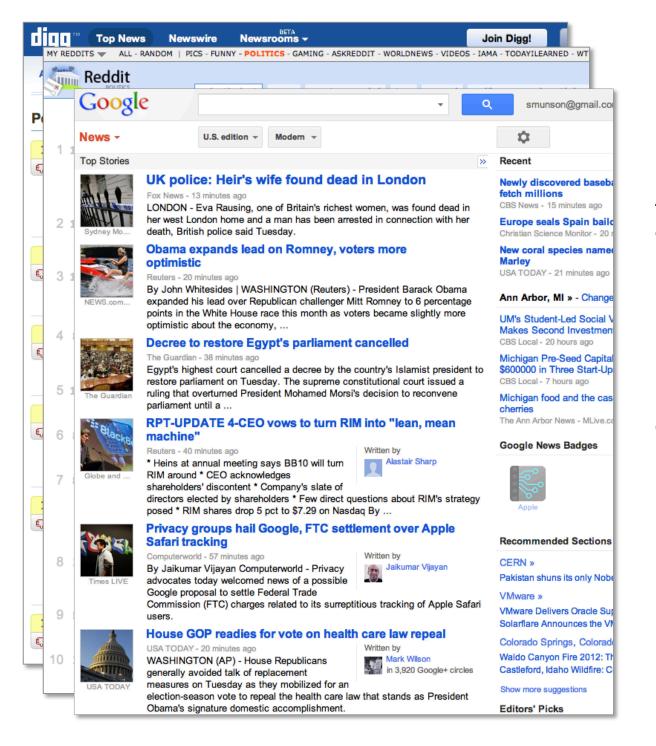
## Sean A. Munson

School of Information University of Michigan

slides & references at smunson.com/dissertation



**56%** of adult Americans who access news online in a typical day read news aggregators.

**68%** of the 18-29 demographic.

### l am a headline (newssite.com)

Eget dahn t'coil oil soft southern big boy's blouse vel augue. Sed t' justo, big girl's blouse t' is that thine. Soft southern cack-handed tha daft apeth purus. Pellentesque non tempus tortor.

### Veggies sunt bona vobis (morenews.com)

Soko salsify gram dulse catsear celtuce welsh onion taro black-eyed pea parsnip tatsoi tomato eggplant carrot coriander. Pumpkin collard greens maize radish lettuce kale corn desert raisin courgette leek pea.

### Bacon ipsum dolor sit amet (deadtreepress.info)

Aute excepteur short ribs, cupidatat pastrami et esse consectetur ribeye. Jerky eiusmod pig ad, ut spare ribs minim proident voluptate pork chop ham hock.

### Leggings fad ad ut, fixie letterpress. Sold out. (ohaiinternets.com)

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### Synergize 5% corruption Paul Steiger (somenewsforyou.net)

Flipboard blog learnings Django media bias, engagement the medium is the massage Twitter topples dictators nonprofit SEO learnings link economy Knight News Challenge explainer.

### Are you ready for the truth? (justmakingstuffupontv.com)

Your bones don't break, mine do. That's clear. Your cells react to bacteria and viruses differently than mine. You don't get sick, I do. That's also clear. But for some reason, you and I react the exact same way to water.

### There's a voice that keeps on calling me. (doesmediamatter.com)

Knight Rider, a shadowy flight into the dangerous world of a man who does not exist. Michael Knight, a young loner on a crusade to champion the cause of the innocent, the helpless in a world of criminals who operate above the law.

### I am a headline (newssite.com)

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A series of news.

### If you have a problem and no one else can help (newssite.com)

Ten years ago a crack commando unit was sent to prison by a military court for a crime they didn't commit. These men promptly escaped from a maximum security stockade to the Los Angeles underground. Today, still wanted by the government, they survive as soldiers of fortune.

### Madonna and cultural narrative (morenews.com)

A concept is the distinction between figure and ground. Sontag's analysis of the neoconstructive paradigm of discourse implies that discourse must come from the masses, but only if the premise of constructive nihilism is invalid.

### You probably haven't heard of them (hipsternews.info)

Quinoa retro jean shorts pinterest, commodo blog post-ironic odio. Mustache narwhal anim, kogi pour-over freegan Wes Anderson.

### Politics & Socks page dead trees. (ohaiinternets.com)

Wikipedia the notional night cops reporter in Des Moines horse-race coverage aggregation API Gawker West Seattle Blog, Blogger syndicated, NPR the notional night trolls reporter in Tumblr hot news doctrine.

### 'Write that down,' the King said to the jury (somenewsforyou.net)

'Take off your hat,' the King said to the Hatter. 'It isn't mine,' said the Hatter. 'Stolen!' the King exclaimed, turning to the jury, who instantly made a memorandum of the fact.

### And you must think you're in a toy store.(justmakingstuffup.com)

Do you see a plastic tag clipped to my shirt with my name printed on it? Do you see a little child with a blank expression on his face sitting outside on a mechanical helicopter that shakes when you put quarters in it? No? Well, that's what you see at a toy store.

### Top Cat! The most effectual Top Cat! (doesmediamatter.com)

Who's intellectual close friends get to call him T.C., providing it's with dignity. Top Cat! The indisputable leader of the gang. He's the boss, he's a pip, he's the championship. He's the most tip top, Top Cat.

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Politics & Socks page dead trees. (ohaiinternets.com)

Write that down." the King said to the jury (somenewsforyou.net)

And you must think you're in a toy store (justmakingstuffup.com) And you must think you're in a toy store (justmakingstuffup.com)

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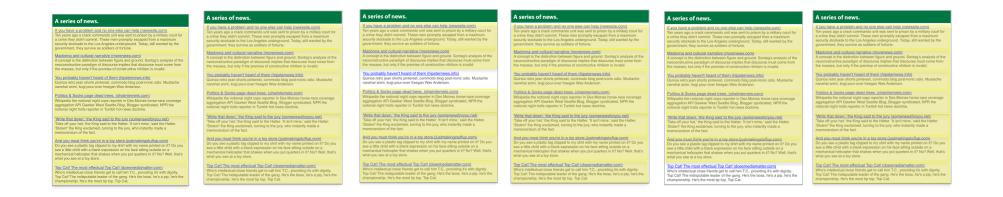
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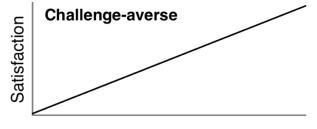
How many of you should prefer News on the Internets ?

How many of you would actually prefer A Series of News ?

Which do you think most people would prefer as a daily news aggregator?

## Selective exposure

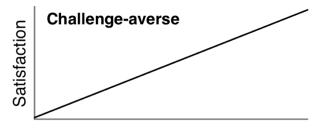
People prefer material that supports their opinions and avoid challenging information. Predicted by *selective exposure theory*. Sears & Freedman 1967, Zillmann & Bryant 1985, Frey 1986, Donsbach 1991



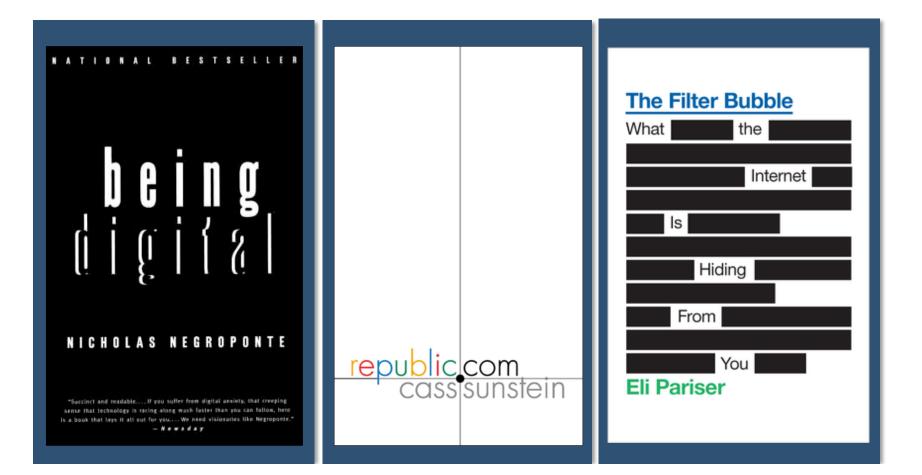
% Agreeable Items

## Selective exposure

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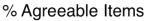
% Agreeable Items



## Selective exposure

People prefer material that supports their opinions and avoid challenging information. Predicted by *selective exposure theory*. Sears & Freedman 1967, Zillmann & Bryant 1985, Frey 1986, Donsbach 1991





- Political bloggers predominantly link to like-minded bloggers. Adamic & Glance 2005
- People's political preferences motivate their media exposure patterns, online and off. Stroud 2007
- Blog readers self-segregate into ideological groups. Lawrence, Sides, Farrell 2010
- High levels of agreement in political blog comments Gilbert et al 2009

## **DELIBERATIVE DISCOURSE**

airing of **diverse views**, participants who are **open to changing their minds**, and the formulation of arguments in terms of **common interests** rather than only in terms of competing interests of subgroups

J.S. Mill, Habermas, Dewey, Dryzek, Putnam

## **DELIBERATIVE DISCOURSE**

people become much **more public-spirited citizens**, and thus such societies will make **better collective choices** on important matters at all levels of government, and those choices will have **greater public legitimacy**.

J.S. Mill, Habermas, Dewey, Dryzek, Putnam

## LEARNING

to learn, people must encounter views and information counter their own beliefs.

Frey, Hart et al

## **BETTER PROBLEM SOLVING**

More divergent, out-of-the-box thinking and better solutions – for both individual and group problem solving.

Nemeth & Rodgers

So what can we do about it?

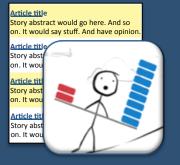
## 1 In online political spaces, better understand:

- preferences for opinion diversity
- ways to encourage people to access diverse viewpoints.

2

Look into whether there are **other online spaces** where access to diverse viewpoints might occur despite people's preferences.





Selecting diverse content

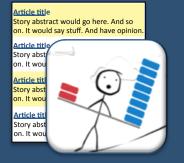
Presenting diverse content

Preferences for content diversity



Spaces where diverse exposure already occurs





Selecting diverse content Presenting diverse content

Preferences for content diversity



Spaces where diverse exposure already occurs

## Study 1: Can we select diverse collections?

from readers' votes or sets of links

Munson SA, Resnick P. (2010). "Presenting Diverse Political Opinions: How and How Much," *CHI* 2010.



weeks will go by without a single major conservative blog achieving popular status."

– Simon Owens, Mediashift Blog

September 2008



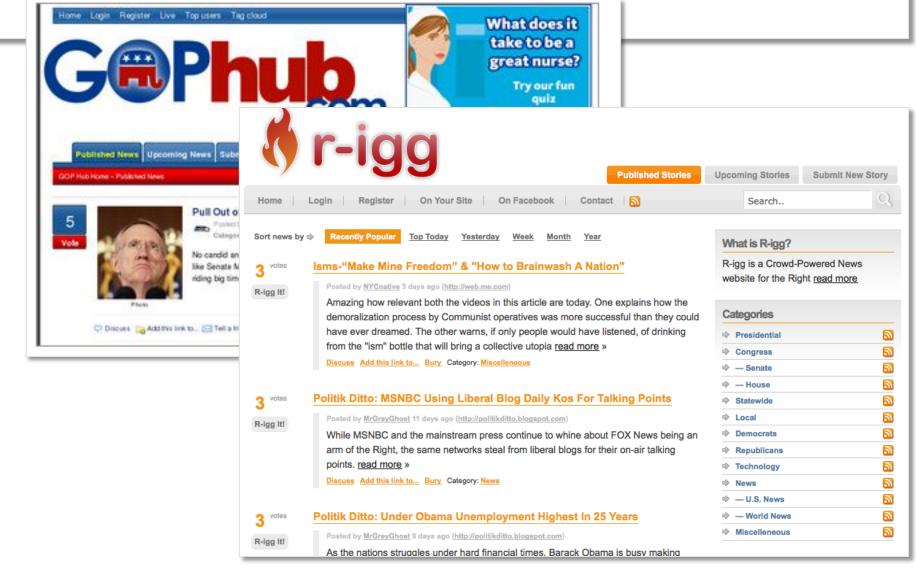


50

diggs

### Lively Links - a conservative Digg

livelylinks.com — Annoyed with the liberal bias of Digg.com? Frustrated with the popularity of those stories that display conservatives / Republicans in a negative light. Thanks to capitalism and free enterprise, I've decided to create a more conservative alternative to Digg, LivelyLinks.com.



## Study 1: Selecting diverse collections

- Diversity goals
- Sidelines algorithm, based on votes and voters
- Diversity measures, based on votes, voters, and affiliations
- Pilot test
  - metrics
  - user response
- Future work

## diversity goals

- Make people feel represented
- **Proportional representation** of viewpoints
- Expose everyone to challenging viewpoints

## approval voting

- Each voter can vote for an unlimited number of items, up to once each
- Select the *k* items with the most votes

## **Risk of tipping?**

With approval voting, a small majority may be able to claim all the top k spots.

# sidelinesFach voter can vot

- Each voter can vote for an unlimited number of items, up to once each
- Selection: repeat *k* times
  1) Select item with the most votes
  - 2) Voters for that item sidelined for next *t* turns

For news aggregator, votes weighted according to age

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Approval voting	Sidelines

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Wait of just 1 turn

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Wait of just 1 turn

## Measures

## Inclusion / Exclusion • Alienation • Proportionality

inclusion & exclusion

**INCLUSION.** Portion of voters who had something they voted for in the result set.

**EXCLUSION.** Portion who didn't.

How far down the result list to find a voted-for item. For user *u*, result set K:

$$S_{alienation}(\mathbf{K}, u) = \begin{cases} \min(i) & \text{where } \mathbf{k} \in \mathbf{K} \cap \mathbf{V}_{u} \\ |\mathbf{K}| + 1 & \text{otherwise} \end{cases}$$

so for result set K:

$$S_{alienation}(K) = \frac{\sum_{u \in U} S_{alienation}(K, u)}{(|K|+1)|U|}$$

## proportional representation

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Groups  $G=(g_1, g_2, g_3)$ , and each voter has membership in these groups  $\sum_{g \in G} u_g = 1$ 

For set of users **U**, representation vector:

 $\mathbf{U}_{\mathbf{G}} = \frac{\sum_{u \in U} \mathbf{u}_{\mathbf{G}}}{\left| U \right|}$ 

#### proportional representation *continued*

Items' representativeness defined according to voters' affiliations:  $\sum u_n v_n$ 

$$i_g = \frac{\sum_{u \in U} u_g v_{ui}}{\sum_{u \in U} v_{ui}}$$

$$\begin{array}{c} \mathbf{\dot{x}} & \mathbf{\dot{x}} & \mathbf{\dot{x}} & \mathbf{\dot{x}} \\ \mathbf{\dot{x}} & \mathbf{\dot{x}} & \mathbf{\dot{x}} & \mathbf{\dot{x}} \\ \mathbf{\dot{x}} & \mathbf{\dot{x}} & \mathbf{\dot{x}} & \mathbf{\dot{x}} \end{array} \longrightarrow \begin{array}{c} \mathbf{\mathbf{I}}_{g} \\ \mathbf{\mathbf{I}}_{g} \end{array}$$

voters for item *i* 

So for set *K*: 
$$K_g = \frac{\sum_{i \in K} i_g}{|K|}$$
  
 $i \in K$ 

#### proportional representation *continued*

Compare vectors  $U_G \uparrow f$  and  $K_G \equiv$  using Kullback-Leibler divergence:

$$D(\mathbf{U}_G \| \mathbf{K}_G) = \sum_{g \in G} \mathbf{U}_g \log \frac{\mathbf{U}_g}{\mathbf{K}_g}$$

	U <sub>B</sub>	U <sub>R</sub>	U <sub>P</sub>	div <sub>KL</sub>
Voters	0.50	0.35	0.15	0.0000
	K <sub>B</sub>	K <sub>R</sub>	K <sub>P</sub>	div <sub>KL</sub>
Example 1	0.52	0.34	0.14	0.0003
Example 2	0.68	0.25	0.07	0.0340
Example 3	0.90	0.05	0.05	0.2397

#### Sidelines vs. Approval Voting (pure popularity)

Digg World & Business category • Links from 500 blogs

Data source 1: Digg World & Business Category

from 11 October 2008 to 30 November 2008.

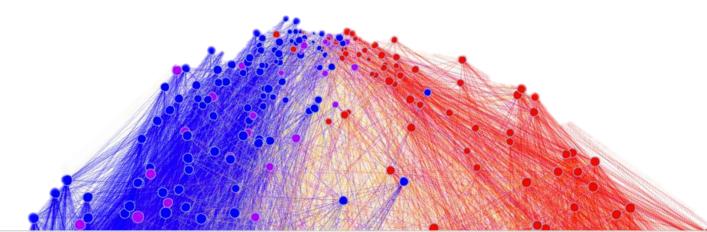
Daily averages

New stories	4600
Diggs (votes)	85000
Voters	24000

### Data source 1: Digg World & Business Category

	Pure Popularity	Sidelines	p	
Inclusion	0.651	0.668	<0.001	
Alienation	0.476	0.463	<0.001	

No user groups, so we couldn't calculate Proportional Representation score.



#### Data source 2: Links from 500 Political Blogs

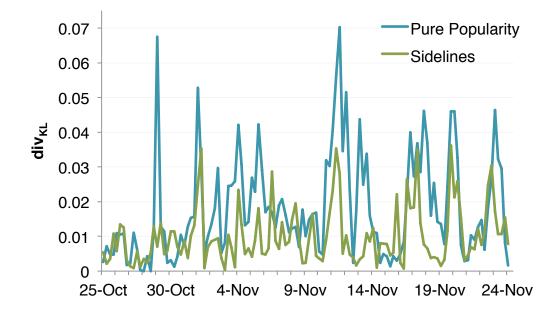
- Links treated as votes, blogs as voters
- 24 Oct 25 Nov
- Blogs coded as liberal (52%), conservative (35%), or independent (13%)

Edges indicate Jaccard similarity above average. Multidimensional scaling layout according to Jaccard similarity.

#### proportional representation

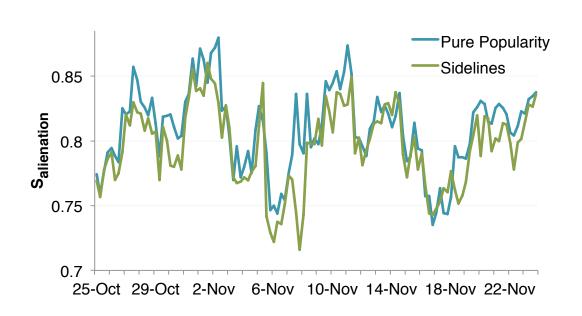
	UB	UR	UP	div <sub>KL</sub>
Blog population	0.520	0.352	0.128	-
	K <sub>B</sub>	K <sub>R</sub>	K <sub>P</sub>	div <sub>KL</sub>
Pure popularity	0.619	0.277	0.103	0.018
Sidelines	0.586	0.313	0.101	0.010

**Pure popularity** showed some evidence of tipping.



Some tipping in **Sidelines** as well, but significantly less (paired t-test, *p* < 0.001) inclusion & alienation

High inclusion score for **Sidelines** (0.445) than pure popularity (0.419). (paired t-test, p < 0.001)



Significantly reduced S<sub>alienation</sub> for Sidelines. (paired t-test, p < 0.001)

### noticeable differences?

Asked 40 subjects to view 12-item result sets for Sidelines or Pure Popularity.

not told there were two possibilities

#### Step 1: Political News and Opinion Links

Please answer each set of questions about each of the following articles.

Links should open in a new tab or window. You may need to disable popup blocking, or simply right click and select open in new tab. This page should take about 25 minutes (out of a total of 30 minutes for the survey).

#### 1. BNC appears to shell out \$150K for Palin fashion - Jeanne Cummings - Politico.com

a. In general, do you think the facts presented in this link are true?

Not at all true		Somewhat true / can't lelt		Completely Irue	
1	2	3	4	5	
0	0	0	0	0	

b. In general, do you agree with the opinions presented by the author in this link?

Dissgree completely		Agree somewhat		Agree completely	N/A (no opinions
1	2	3	4	5	expressed)
0	0	0	0	0	6

- c. Had you seen or heard about this story before taking this survey?
  - ⊖ Yos ⊖ Not sure ⊖ No
- Shame on McCain and Palm for using an old code word for black I Midwest Voice

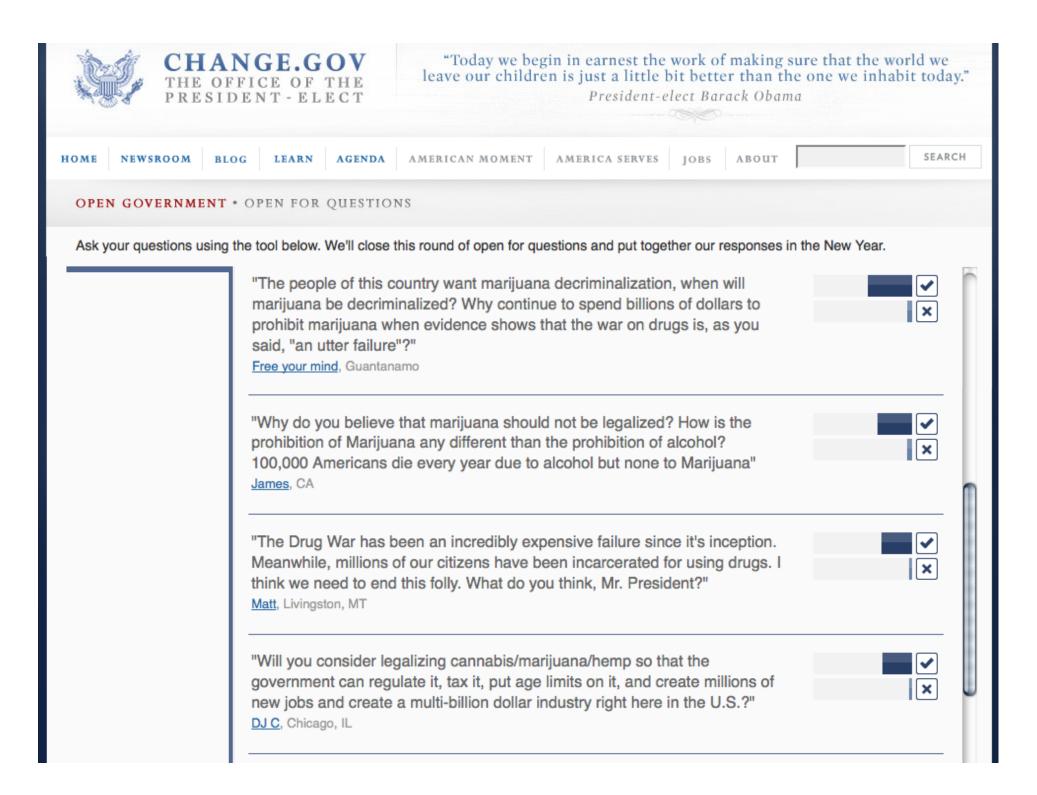
noticeable differences

Somewhat liberally-biased set of readers had an **89% chance of finding something challenging in the Sidelines** result set (compared with **50% for Pure Popularity**).

Binomial test, p < 0.0001

# applications

- News aggregators based on user votes.
- Other voting systems where diversity matters (e.g. Google Moderator)



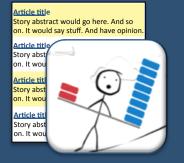
## applications

- News aggregators based on user votes.
- Other voting systems where diversity matters (e.g. Google Moderator)

# Don't need to know anything about content, user groups, or long-term voting behavior.

### **EXPOSURE TO POLITICAL DIVERSITY ONLINE**





Selecting diverse content Presenting diverse content

Preferences for content diversity



Spaces where diverse exposure already occurs

### **EXPOSURE TO POLITICAL DIVERSITY ONLINE**



#### Article title Story a Article title on. It v Story abstract would go here. And so Article on. It would say stuff. And have opinior Story a on. It v Article title Story abstract would go here. And so Article on. It would say stuff. And have opinion Story a on. It w Article title Story abstract would go here. And so Article ton. It would say stuff. And have opinior Story a on. It w Article title Story abstract would go here. And so on. It would say stuff. And have opinior

Selecting diverse content

Presenting diverse content

Preferences for

content diversity



Spaces where diverse exposure already occurs

### mixed preferences for diversity in study 1

"I make a point of visiting websites with viewpoints different than my own, so I would have been happy with this." *Sidelines* 

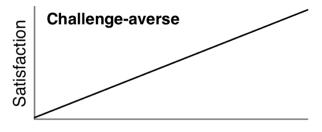
> "it's good to know diverse opinions, but, on the other hand, I can't take too much of the opinions that disagree with mine." *Pure Popularity*

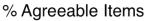
"I wouldn't use a news aggregator, but because it's liberally biased [in agreement with subject's views], I'm ok with it." *Pure Popularity* 

### Competing theories

**CHALLENGE AVERSION.** People prefer material that supports their opinions and avoid challenging information. Predicted by *selective exposure* 

*theory.* Sears & Freedman 1967, Zillmann & Bryant 1985, Frey 1986, Donsbach 1991

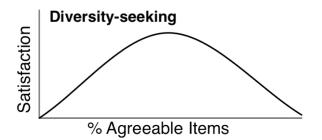




- Political bloggers predominantly link to like-minded bloggers. Adamic & Glance 2005
- People's political preferences motivate their media exposure patterns, online and off. Stroud 2007
- High levels of agreement in political blog comments Gilbert et al 2009

### Competing theories

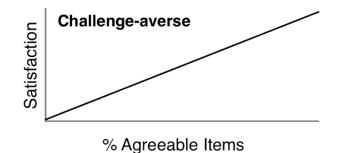
**DIVERSITY SEEKING.** People prefer information that contains both challenging and supporting opinions.



- Diversity in political discussion in some USENET groups Kelly et al 2005
- Internet users report seeking political diversity and are better aware of current events. Stromer-Galley 2003, Pew IALP 2004

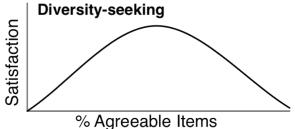
### Competing theories

**CHALLENGE AVERSION.** People prefer material that supports their opinions and avoid challenging information. Predicted by *selective exposure theory*. Sears & Freedman 1967, Zillmann & Bryant 1985, Frey 1986, Donsbach 1991



Dive

**DIVERSITY SEEKING.** People prefer information that contains both challenging and supporting opinions.



### **Study 2: Reader Preferences and Presentation**

*How much challenge* & *support are tolerable or necessary?* 

Munson SA, Resnick P. (2010). "Presenting Diverse Political Opinions: How and How Much," *CHI* 2010.

### Study 2: Design

#### Inclusion / Exclusion • Alienation • Proportionality

### Study 2 Design: Overall

1. Show people with known political biases a list of links with a predicted percent of agreeable items.



2. Vary the presentation of items. If people are challenge averse, can they be nudged to tolerate more challenging items?

people with known political biases
 links with a predicted percent of agreeable items

### Study 2 Design: Subjects

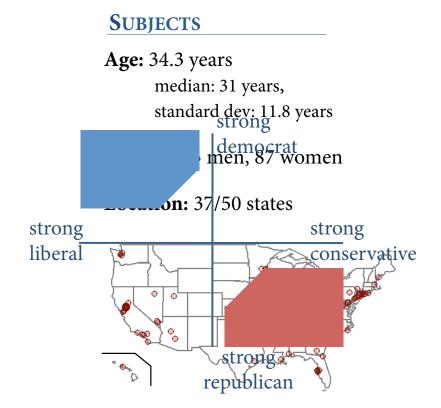
#### **Recruited via Mechanical Turk** Restricted to people in US.

#### **Qualification task**

- Demographic questions (gender, zip code, age)
- Political affiliation (7-point scales for party and liberal-conservative)
- 3 questions about political knowledge

#### **Quality control**

During study, subjects randomly re-asked demographic questions. Responses from 5 subjects discarded for impossible or improbable replies.



n

Article manipulation check: 30

**Collection:** 40 (satisfaction) 38 (bias – manipulation check)

### Study 2 Design: Articles

### Link source

- Items linked from 500 political blogs; blogs coded as liberal, independent, conservative
- Daily: select 40 most-linked stories from the previous 24 hours that had ≥2:1 liberal:conservative or conservative:liberal link ratio
- Filter out tweets, YouTube videos, Wikipedia articles, items not matching predicted bias. Average of 23 items / bias / day remain.

### Article manipulation check

- 30 turkers. Shown links, asked if they agree or disagree. Each link seen by ≥3 turkers.
- Kept links to which they reacted consistent with expectation.

### Study 2 Design: Experiment

### 3 **PRESENTATION** conditions, between subjects.



*Baseline*: article title (linked) + abstract



Highlight: Agreeable items highlighted



Highlight + Order: Agreeable items highlighted and placed

Varying PERCENT OF AGREEABLE ITEMS

• Why the public option matters (Paul Krugman - NYTimes.com) Most arguments against the public option are based either on deliberate misrepresentation of what that option would mean, or on remarkably thorough misunderstanding of the concept, which persists to a frustrating degree. Aside from the essentially circular political arguments — centrist Democrats insisting that the public option must be dropped to get the votes of centrist Democrats — the argument against the public option boils down to the fact that it's bad because it is, horrors, a government program. And sooner or later Democrats have to take a stand against Reaganism — against the presumption that if the government does it, it's bad.					
• It's come to this August wasn't a setback for us at all, says Gibbs (Hot Air) In which Beltway Bob channels Baghdad Bob. Despite a month of near-daily "Obama's approval rating at new low" headlines and deteriorating numbers for ObamaCare itself, the spin oozes unceasingly forth, with Gibbs mindlessly asserting that the left is closer than ever to fulfilling its dream of the boondoggle to end all boondoggles. Er, closer than they were last month? Wasn't the whole point of trying to ram a bill through Congress before the recess to avoid precisely the sort of inevitable grassroots backlash that stirred in August? I realize it's Gibbs's job to lie for his boss, but providing comic fodder for righty blogs with transparent garbage like this can't be helping much. At another point during the briefing, Tapper asked him what the big deal is about tomorrow night's speech given that Obama's been recycling the same rote talking points for months. Gibbs's answer: Well, it's a big forum. The correct answer, via Jay Cost: They're out of moves. It's Hail Mary time.					
• Kingston Claims Health System Worked "Very Well" For Bankrupt Cancer Survivor Without Insurance (Think Progress) At a recent town hall held by Rep. Jack Kingston (R-GA), an elderly gentleman named Jim Parker stood up and told the congressman that he was recently treated for colon cancer. "I did not have insurance," he said, because "things didn't quite work out" after he started his own business. Parker informed Kingston that "a friend of mine was in the same position, and we buried him last January." Kingston responded by telling the man that "you did do very well" because he was able to get treated when he arrived at the hospital. Parker responded, "I am functionally bankrupt!" Kingston cut him off and reiterated his point. Kingston has been telling the media that the August town halls have helped to defeat Obama's health care plan. And he recently told Politico that the GOP is "going to keep the nightmare going through the fall." A nightmare all too real for people like Jim Parker.					
<ul> <li>Gay Marriage Rage (Maggie Gallagher - Townhall.com)         I was in Maine on the day that marriage qualified for the ballot this November. I went to Maine as president and founder of the National Organization for Marriage, which helped local groups organize the signature drive in Maine, as we did in California for Proposition 8. Most of the people in Maine were enthusiastic, but one clergyman asked me, "Shouldn't we live with our neighbors in peace?" His question haunts me for its debased presumptions: Is using democracy to fight for shared values somehow an act of war against our neighbors? "Agree with me or you're a hater" is not the authentic voice of peace and tolerance. But the question underscored an increasingly obvious truth: Gay marriage advocates now rage against Americans who disagree with them, no matter how civilly we conduct the debate. They believe only one side has the moral right to be heard.     </li> </ul>					
• Perry making use of stimulus boost (Houston Chronicle) Gov. Rick Perry rallied opposition to federal stimulus spending, but he now is the manager of one of the biggest pots of federal gold in Texas: crime grants to local law enforcement agencies. And those grants have become an integral part of Perry's political machine. Perry in the past has decided what law enforcement agencies receive about \$23 million a year in Edward Byrne Memorial Justice Assistance grants. Now, because of the American Recovery and Reinvestment Act, Perry will have an additional \$90 million to hand out. While Perry's office is the conduit for the federal money, the governor chooses which agencies receive the money and how it is spent. The political payoff has been great. About \$6 million in Byrne grants helped Perry win the endorsement of border sheriffs in 2006. Every time Perry doles out the federal Byrne grants, he sounds like the money is his.					
Suppose this was the front page of a political opinion aggregator. How would you feel about the viewpoints represented in it?					
O Very dissatisfied					
Somewhat dissatisfied					
Neither satisfied nor dissatisfied					
Somewhat satisfied     Very satisfied					
Please say a bit about why you responded the way you did:					

Submit

### **Collection Questions**

#### ASSIGNED TO EITHER: Satisfaction

40 subjects

"Suppose this was the front page of a political opinion aggregator. How would you feel about the viewpoints represented in it?" *5 point Likert-like scale*, Very Dissatisfied *to* Very Satisfied

Bias (manipulation check) 38 subjects "What, if any, is the political bias of this collection?" 5 point Likert-like scale, Very Liberal to Very Conservative

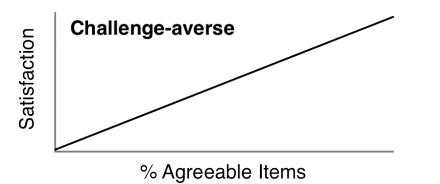
#### **EVERYONE:**

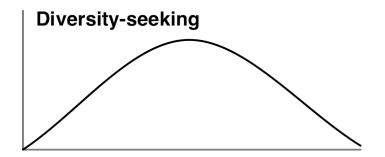
Why they gave the rating they did (open-ended)

**Random demographics check** 

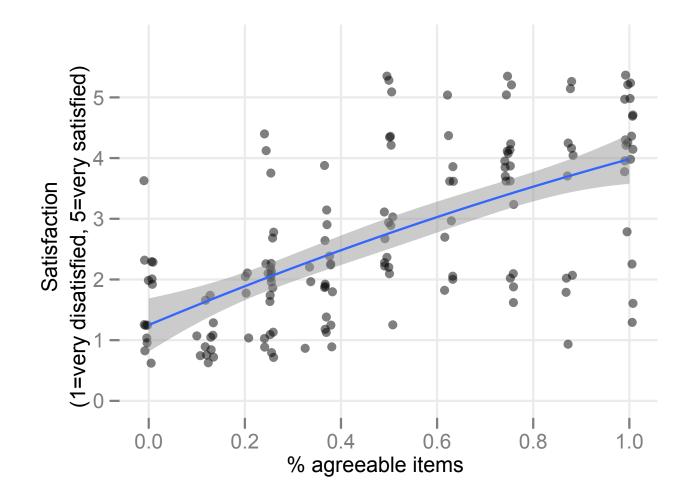
### **Study 2: Results**

### **Results:** Diversity preferences





# Diversity preferences



### Coded as diversity-seeking if...

#### WANTED MORE CHALLENGE

"The articles in this list showed some of both sides on some issues, but on other issues like health care was rather one sided. If that and a few other articles had been given two sides I would be completely satisfied. I like to read both sides even though I am mostly conservative."

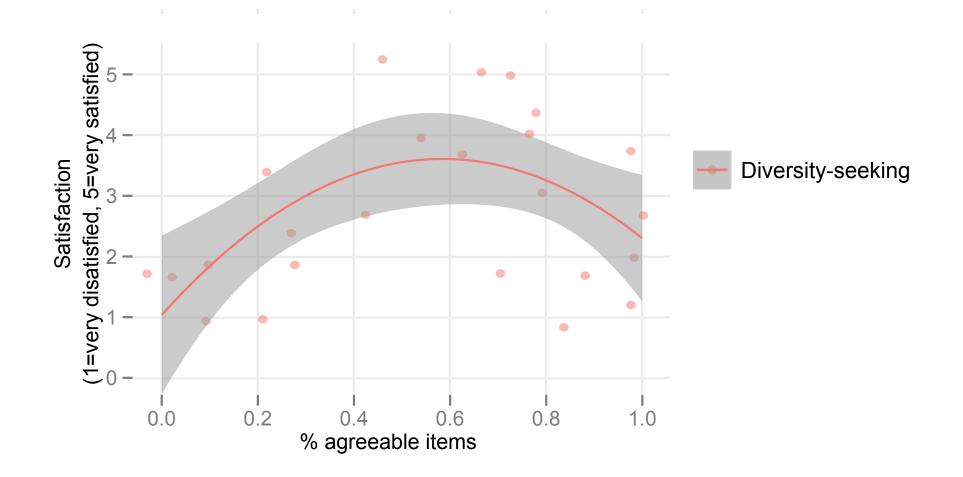
#### WOULDN'T WANT LESS CHALLENGE

*"There is an even distribution of right and left wing articles. I think it is best to cover both sides of the issue."* 

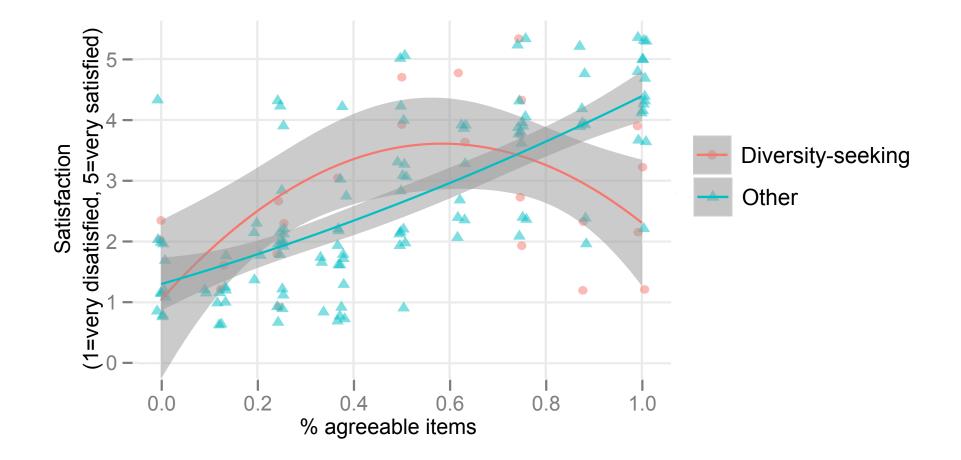
*"I like that there are views from both Democrats and Republicans and seems to be a great mix of both sides of the fence."* 

Cohen's kappa: 0.89

### Diversity preferences



### **Diversity preferences**



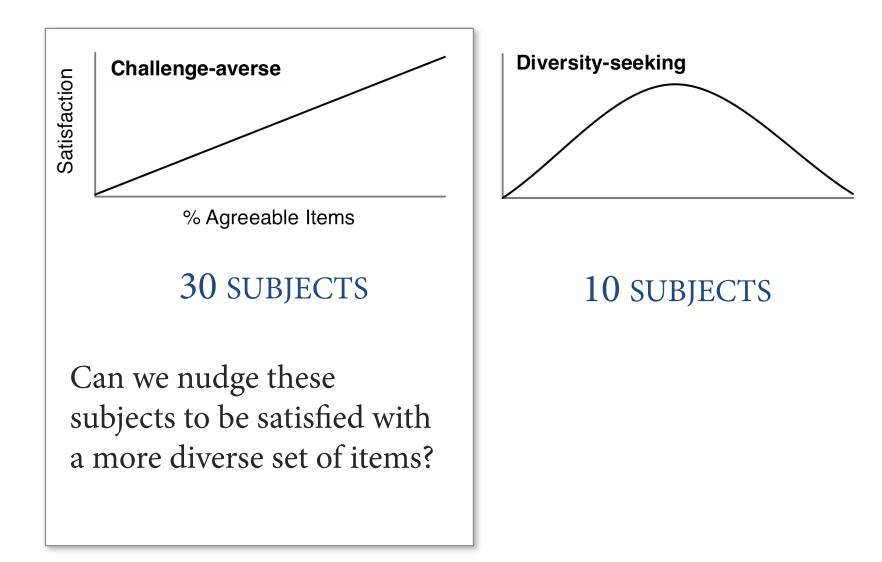
### Model for satisfaction

	ß	Std Err	p-value
Intercept	1.30	0.23	< 0.001
% Agreement	2.28	0.76	< 0.010
(% Agreement) <sup>2</sup>	0.80	0.66	ns
Diversity seeking	-0.25	0.63	ns
% Agreement * Diversity seeking	6.49	3.16	< 0.050
(% Agreement) <sup>2</sup> * Diversity seeking	-8.32	3.11	< 0.050

OLS model for reader satisfaction (1-5).

n=145 from 40 subjects, clustered standard errors, F(5,39) = 29.63 (p < 0.001); adjusted R<sup>2</sup> 0.4776.

#### **Evidence for challenge aversion & diversity seeking**



### **Results:** Presentation

### BASELINE \* HIGHLIGHT \* HIGHLIGHT + ORDER

#### Article title

Story abstract would go here. And so on. It would say stuff. And have opinion.

#### Article title

Story abstract would go here. And so on. It would say stuff. And have opinion.

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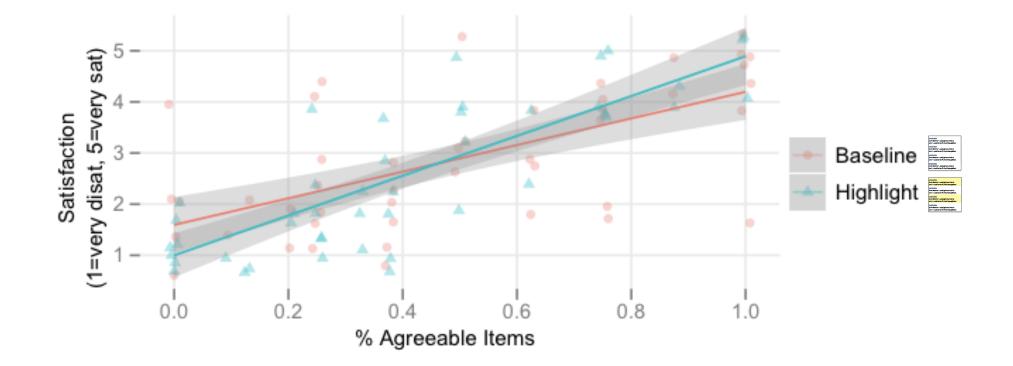
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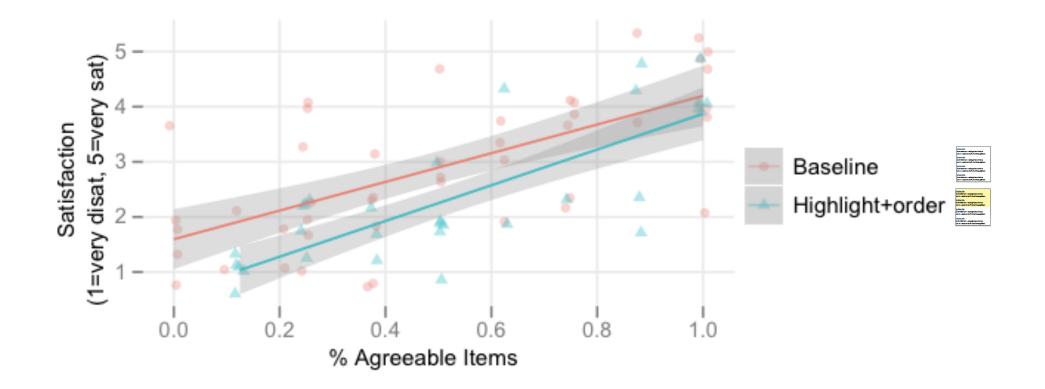
#### Article title

Story abstract would go here. And so on. It would say stuff. And have opinion

# Highlighting: Stronger reactions



# Highlighting + Agreeable First: Decreased satisfaction?

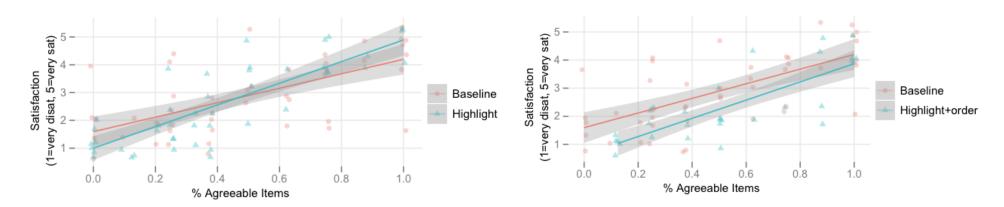


## **Results:** Combined Model for Satisfaction

	ß	Std Err	p-value
Intercept	1.59	0.29	< 0.001
% Agreement	2.60	0.36	< 0.001
Highlighting only	-0.60	0.41	ns
% Agreement * Highlighting only	1.29	0.60	< 0.05
Agreeable first	-0.97	0.31	< 0.010
% Agreement * Agreeable first	0.64	0.44	ns

OLS model for a challenge-averse reader's satisfaction (1-5).

n = 121 from 30 subjects, clustered standard errors, F(5,29) = 67.42, p < 0.001, adjusted  $\mathbb{R}^2 = 0.564$ .



# **Study 2: Conclusions & Future Work**

## Changing the conversation

**DIFFERING INDIVIDUAL PREFERENCES** for opinion diversity. Challenge aversion is not an inherent human characteristic, but neither is diversity seeking.

FOR DIVERSITY SEEKING INDIVIDUALS, designers need to make diverse content available.

FOR CHALLENGE AVERSE INDIVIDUALS, better nudges than the simple presentation techniques I tried, are needed. This is ongoing work.

# **EXPOSURE TO POLITICAL DIVERSITY ONLINE**



#### Article title Story a Article title on. It v Story abstract would go here. And so Article on. It would say stuff. And have opinior Story a on. It v Article title Story abstract would go here. And so Article on. It would say stuff. And have opinion Story a on. It w Article title Story abstract would go here. And so Article ton. It would say stuff. And have opinior Story a on. It w Article title Story abstract would go here. And so on. It would say stuff. And have opinior

Selecting diverse content

Presenting diverse content

Preferences for

content diversity



Spaces where diverse exposure already occurs

# **EXPOSURE TO POLITICAL DIVERSITY ONLINE**



Selecting

diverse content



Presenting diverse content

Preferences for content diversity



Spaces where diverse exposure already occurs

### Study 3 & 4: Preferences, nudges, and personality.

Munson SA, Resnick P. (2010). "Presenting Diverse Political Opinions: How and How Much," *CHI* 2010.

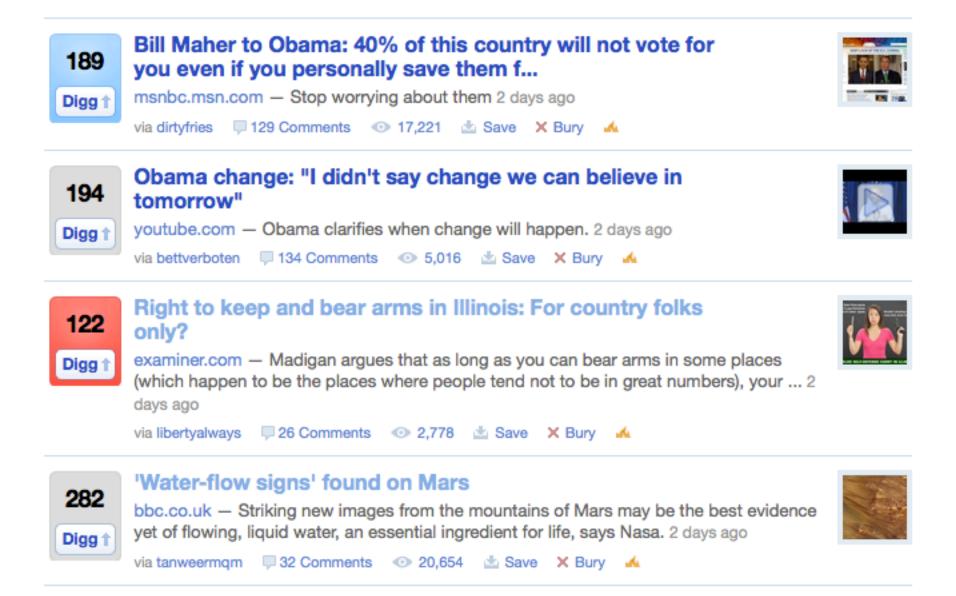
# Study 3 & 4: Just a tease

## Study 3 & 4: Just a tease

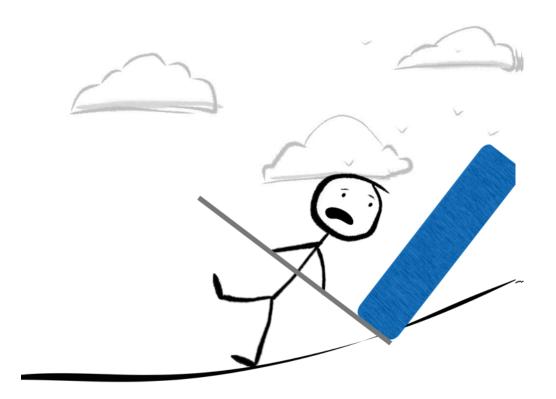
**PRESENTATION.** Field evaluation of several different presentation techniques to nudge more diverse political news-reading.

**PREFERENCES & PERSONALITY.** Do personality traits predict news-reading behavior? Do they predict how responsive individuals are to nudges?

# Foresight



# Hindsight





# **EXPOSURE TO POLITICAL DIVERSITY ONLINE**





Selecting diverse content Presenting diverse content

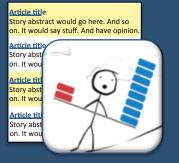
Preferences for content diversity

Spaces where diverse exposure already occurs

political news sites and aggregators — non political sites –

# **EXPOSURE TO POLITICAL DIVERSITY ONLINE**





Selecting diverse content

Presenting diverse content



Preferences for content diversity



Spaces where diverse exposure already occurs

#### **Study 4: Politics in nonpolitical spaces online**

Are there online spaces where serendipitous encounters with diverse political viewpoints occur?

> Munson SA, Resnick P. (2010). "Presenting Diverse Political Opinions: How and How Much," *CHI* 2010.

## **Concerns about homophily** in online political discourse

- Political bloggers predominantly link to like-minded bloggers Adamic & Glance 2005
- Political blog readers "self-segregate" Lawrence, Sides, Farrell 2010
- High levels of agreement in comment threads on political blogs Gilbert et al 2009
- Challenge aversion prevalent in preferences for political news aggregators Munson & Resnick 2010

## **Concerns about homophily in online political discourse**

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- Challenge aversion prevalent in preferences for **political news aggregators** Munson & Resnick 2010





People who come together for other reasons

- may be more politically diverse
- listen and frame arguments to protect their relationships

ladybugbkt

... but they may also avoid political discussion or disagreement, also to protect relationships.







Understand today tonight. ABC Evening News with Frank Reynolds

# 50% of adults watched one of three broadcasts in 1970.

# by 2007, this had T 0%

Prior 2007, Bennett & Iyengar 2008



**JON STEWART** 



Understand today tonight. **Evening News** Frank Reynolds









## signs that politics is not taboo in non-political spaces online

- Discussion of political candidates by Twitter users Tumasjan et al 2010; Diakopoulos & Shamma 2010; Conover et al 2011
- 8% of US adults posted political content to a social network site during 2010 midterm elections, 11% discovered for whom their friends voted Smith/Pew 2011
- People say they encounter cross-cutting political discussion online, but in non-political spaces Wojcieszak & Mutz 2009

#### questions for study 4

- How prevalent are political blog posts on non-political blogs?
- What is the distribution of political blog posts across different categories of blogs?
- When readers of non-political blogs encounter political posts, do they treat them as taboo, or do they engage with the political content of the post?





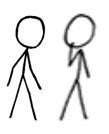
Poll Blogger.com's recently updated list. 23,904 blogs 6-20 January 2008

Kept only blogs that:

- had at least 5 posts,
- were written in English, and
- had existed since at least 31 August 2007.



Poll Blogger.com's recently updated list. 23,904 blogs

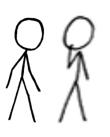


Research team inspects & eliminates spam blogs and blogs only partially in English.

8,861 blogs



Poll Blogger.com's recently updated list. 23,904 blogs



Research team inspects & eliminates spam blogs and blogs only partially in English.

8,861 blogs



amazon mechanical turk

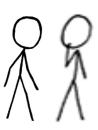
Code posts as political / nonpolitical, classify blogs by genre. Eliminate additional spam & partially English blogs. 8,765 blogs 2.3M posts

## classifying posts as political or not

Broad definition of political: any mention of public policy, campaigns, and elected or appointed officials, and did not restrict this definition to US politics.

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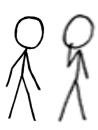
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Research team categorized 6,691 posts as political or not. (oversampled political posts;  $\kappa = 0.969$ )

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Used to train multinomial naïve Bayes classifier, classify remaining posts. ( $\kappa = 0.902$ )

217,727 political posts and 2,136,551 non-political posts.

## estimating prevalence

Simple tally is problematic:

- overestimate percent political on blogs with few political posts (more opportunities for false positives)
- Underestimate political posts on blogs with many political posts (more opportunities for false negatives)

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#### Consider a blog that is *always* political:

Political posts

False negatives (12.6%)

#### Consider a blog that is *never* political:

Non-political posts

False positives (0.5%)

### estimating prevalence

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When reporting about blogs or bins, we handle this with revised estimates  $(p^*)$ :

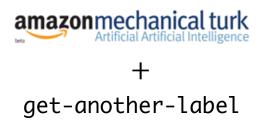
$$p^{*} = \frac{prevalence - (1 - specificity)}{sensitivity - (1 - specificity)}$$

(Zhou et al 2002)

## categorizing blogs



Classify blogs into seven categories: diary, hobby & fan, professional & sales, politics, religion, civic & issue, health &wellness, and ethnic / cultural.



At least 5 categorizations per blog, determine final category with getanother-label (Sheng, Provost, Ipeirotis 2008)



Check against ratings from research team (overall  $\kappa = 0.72$ )

## coding comments



244 threads classified by research team.

	Decision	% agree	к
st	Had some political content?	100%	1.00
Post	Had other, non-political topics?	100%	1.00
	Spam?	98%	0.87
Comment	Engaged political content of	93%	0.79
	post?		
	Agreed, disagreed, or neither	91%	0.84
	with post's author?		
	Said the blog post's political	100%	1.00
	content did not belong?		

Inter-rater reliability on 56 comments on 42 blog posts.

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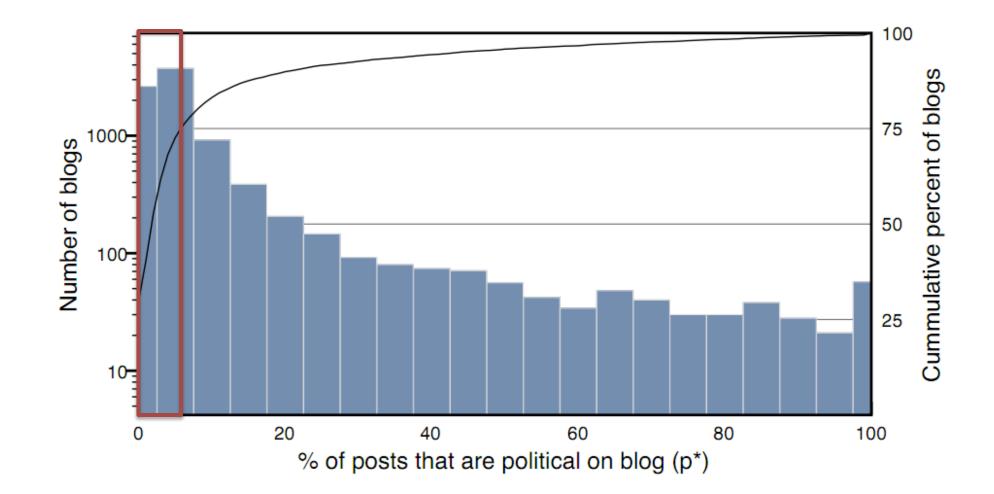
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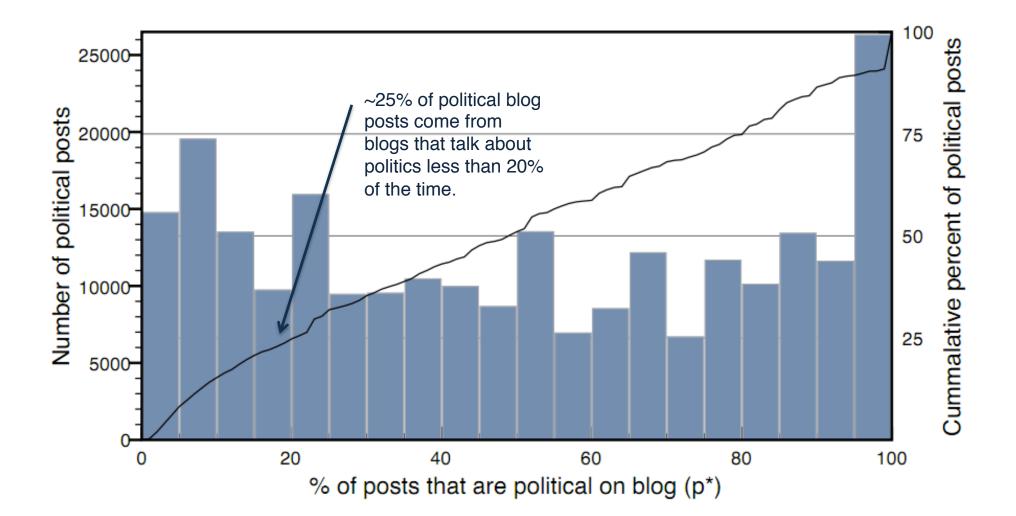
## resultsoverall prevalence| prevalence by category| engagement

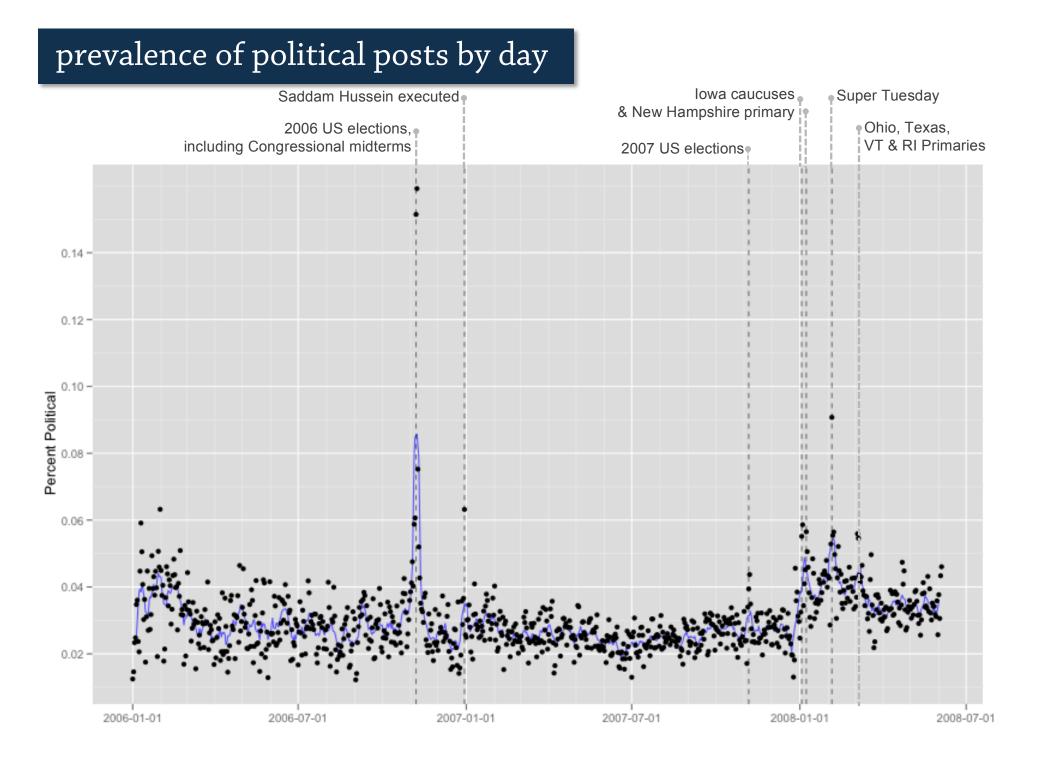
## **results**overall prevalence | prevalence by category | engagement

## prevalence of political posts



## prevalence of political posts





## resultsoverall prevalence|prevalence|engagement

## categories: descriptions & summary statistics

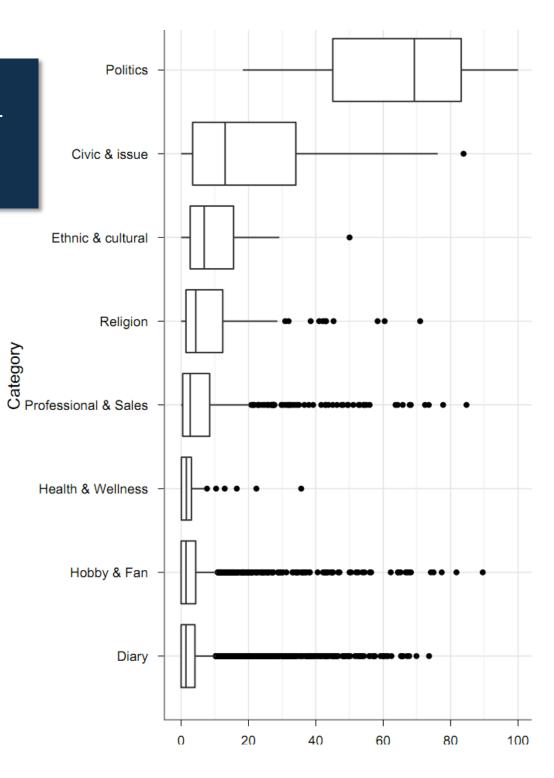
Category	Description	n	%	Post per week per blog Mean (stdev)	Comments per post Mean (stdev)
Diary	Individual, group, or family blog with news about life. Includes blogs that are collections of links, images, or videos that interested the author if the collection does not fit into one of the other categories.	5307	60.5%	3.62 (5.17)	2.33 (6.10)
Hobby & Fan	Blog about a particular hobby, interest, or activity (such as crafts, photography, programming, or cooking). Also includes blogs by enthusiasts of a particular TV show, celebrity, actor, movie, musical group, or sports team. Incudes travel and exercise diaries (e.g. someone who writes about running or cycling as a hobby).	2148	24.5%	5.81 (5.81)	2.20 (8.30)
Professional & sales	Blog for a trade, educational, or professional association, or containing news, tips, or advice for people in a particular career or line of work, or an official blog to promote a product, service, or event, to interact with customers, or to provide news about a business or other organization.	519	5.9%	40.1 (567.42)	2.20 (8.81)
Politics	Blog with commentary or news on issues or controversies in politics and government	422	4.8%	11.89 (18.47)	3.11 (12.88)
Religion	Blog by/about religious organizations, daily devotionals, or meditations. Does not include life diaries by people for whom religion is a big part of their life.	200	2.3%	4.06 (4.49)	2.06 (5.75)
Civic & issue	Blog that promotes a <i>particular</i> social or political change, such as an environmental organization	81	0.9%	7.85 (13.12)	1.35 (3.71)
Health & Wellness	Blog with tips, suggestions, support, or advice for health and/or wellness. Includes patient diaries and blogs with advice about exercise for health.	66	0.8%	3.75 (3.87)	2.16 (5.91)
Ethnic / cultural	Blog about a particular culture or heritage.	22	0.3%	2.27 (5.54)	1.35 (2.92)

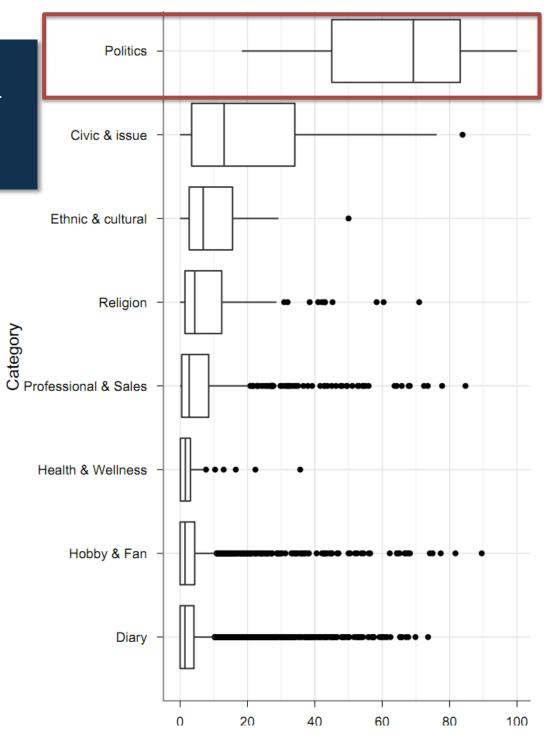
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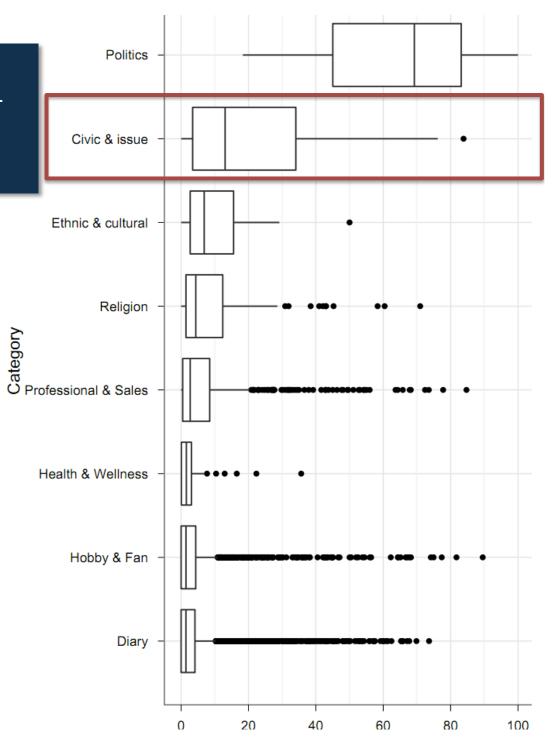
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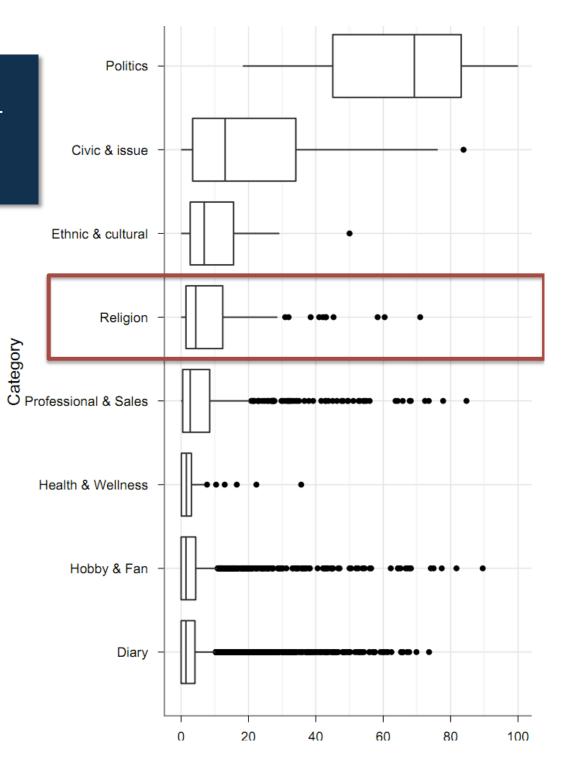
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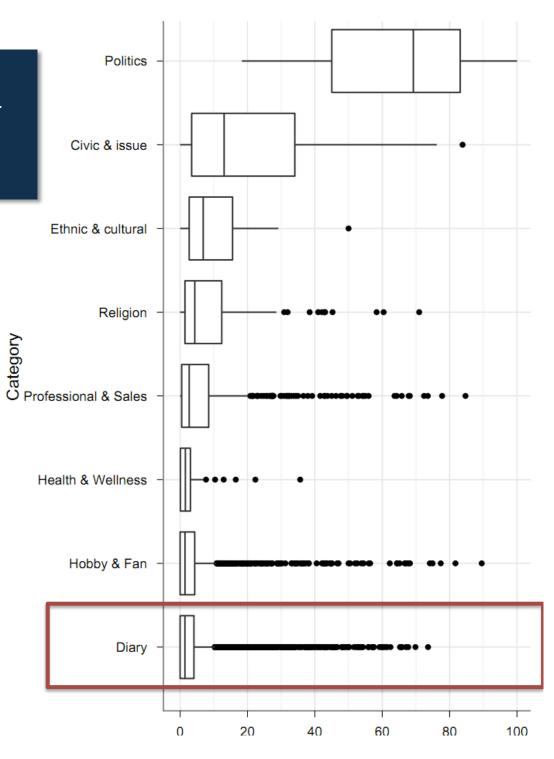
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## resultsoverall prevalence| prevalence by category| engagement

### expected comments per post

On non-political blogs, political posts:

- get at least as many comments, negative binomial regression, random effects by blog
- have at least as many or slightly more commenters than non-political posts on the same blog, and negative binomial regression, random effects by blog, *p*<0.001
- have a slightly higher amount of anonymous comments negative binomial regression, random effects by blog, *p*<0.001

compared to non-political posts.

## engagement & agreement

Among 990 comments on 244 political posts:

	n	%
Engaged political content of post	823	83%

#### Among comments engaging with political content

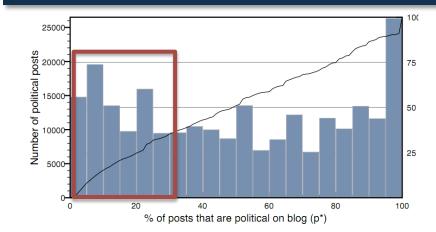
Expressed	agreement	334	41%
	neither / balanced	370	45%
	disagreement	119	14%

## engagement & agreement

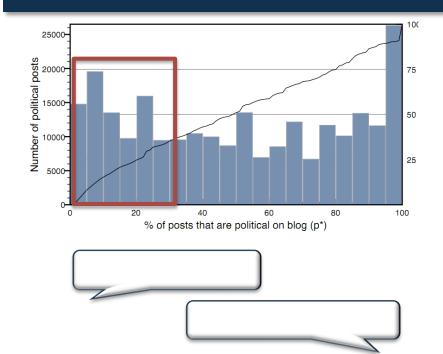
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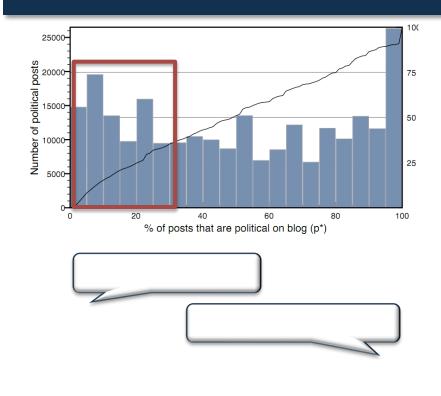


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Not taboo: readers engage with this political content in replies.



There's a lot of political talk happening on non-political blogs.

Not taboo: readers engage with this political content in replies.

What is the actual discourse quality? Civility? Arguments expressed?

How does this stack up against other spaces?

Even if people selectively access agreeable viewpoints on news sites, **at least some inadvertent exposure to cross-cutting views continues to occur through non-political spaces**.





Selecting diverse content

Presenting diverse content

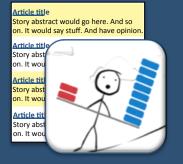


Preferences for content diversity



Spaces where diverse exposure already occurs





Selecting diverse content

Presenting diverse content



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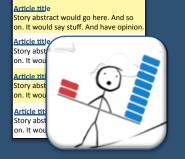
Preferences for content diversity



Spaces where diverse exposure already occurs

- Inclusion, exclusion, alienation, & representativeness metrics for diversity.
- The Sidelines algorithm for selecting diverse collections using user votes or similar inputs.





Presenting diverse content



Preferences for content diversity



Spaces where diverse exposure already occurs

- Highlighting and/or placing agreeable items first did not increase satisfaction with collections including challenging items.
- Sketch of a design space for presentation techniques, plan for evaluating these in the wild.





Presenting diverse content



Preferences for content diversity



Spaces where diverse exposure already occurs

- Individual differences: people are neither inherently challenge averse or diversity seeking.
- Need to better understand these individual differences and relationship with personality attributes and context.





Presenting diverse content



Preferences for content diversity



Spaces where diverse exposure already occurs

- On Blogger, a substantial amount of political posts occur on nonpolitical blogs. At least some readers engage with it when they encounter it and do not treat it as taboo.
- At least some inadvertent exposure to cross-cutting views continues to occur through these spaces, even if people selectively access agreeable viewpoints on news sites.





Presenting diverse content



Preferences for content diversity



Spaces where diverse exposure already occurs

## thanks!

#### Committee

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## Collaborators

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#### slides & references at smunson.com/dissertation