



# Quantifying the Meaning of Interactions on Different Communication Media

Kenneth Joseph <sup>1</sup>   Kathleen M. Carley <sup>2</sup>

<sup>1</sup>kjoseph@cs.cmu.edu <sup>2</sup>kathleen.carley@cs.cmu.edu

March 15, 2012

# Motivation and Overview

- There are known differences (and similarities) in the meaning of an interaction on different media  
[2, 7, 8, 6, 4, 3, 9]
- Effects:
  - Event data → Social Tie
  - Tie Strength/Meaning
- How can we move in a principle way from qualitative findings to quantities of use to network analysis?
- Today
  - Exploratory Analysis
  - A three step process from “media bias” to metric: **Observe, Generalize, Quantify**



# Data Description

- Survey data from the Pew Internet and American Life Project report on “Social isolation and new technology” [5] <sup>1</sup>
- Their question: **Are new technologies shrinking the size of our core discussion networks?**
- Core tie: “especially significant” or “with whom we discuss important matters”
- Phone interviews (7/08) of 2,512 adults in households in the continental US



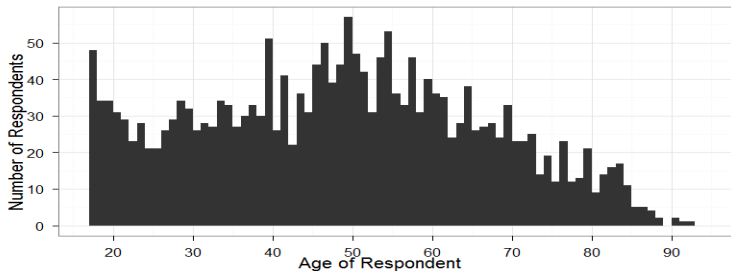
<sup>1</sup>Disclaimer: This work is not affiliated with Pew

Kenneth Joseph , Kathleen M. Carley

March 15, 2012

# Survey Demographics

- 47% Male, 53% Female
- 76.1% white, 10.2% black, 5.3% Hispanic or Latino



## Part I Used

**Each respondent names all core ties.**

**For each tie:**

- Features of the relationship
  - type, duration and physical distance
- Frequency of communication via:
  - Face to Face, Email, Text Messaging, Landline, Cell phone, Mail, Instant messaging, Message through a SNS
  - Only have value if person is able to access media
- Demographics
  - age, race and gender



## Core Tie Generators

From time to time, most people discuss important matters with other people. Looking back over the last six months — who are the people with whom you discussed matters that are important to you? If you could, just tell me their first name or even the initials of their first AND last names. [RECORD UP TO 5 NAMES] [PROBE: "Anyone Else?"]

Now let's think about people you know in another way. Looking back over the last six months, who are the people especially significant in your life? [IF NECESSARY: By significant, I mean just those who are MOST important to you.] If you could, just tell me their first name or even the initials of their first AND last names. These may be some of the same people you just mentioned or it may be other people. [RECORD UP TO 5 NEW NAMES] [PROBE: "Anyone Else?"]



# Relationship Type Generator

People can have many different connections to others. For example, a woman can be your co-worker and also be your neighbor. Or a man could be your brother and also a member of your church. Now, I would like to go through the names you just gave me. Please list all the ways that person is connected to you. How is [INSERT NAME FROM Q10Q17LIST in ORDER] connected to you? [PROBE: What other ways?] [PRECODED OPEN-END; DO NOT READ CATEGORIES; RECORD UP TO FIVE RESPONSES]<sup>9</sup>

Friend  
 Child  
 Spouse/Partner  
 Other Family member/Family relationship  
 Brother/Sister/Sibling  
 Parent  
 Co-worker  
 Member of Group: Church, community association, volunteer group  
 Neighbor  
 Advisor  
 Internet/Online Friend/Acquaintance  
 Other



# Frequency of Communication Generator

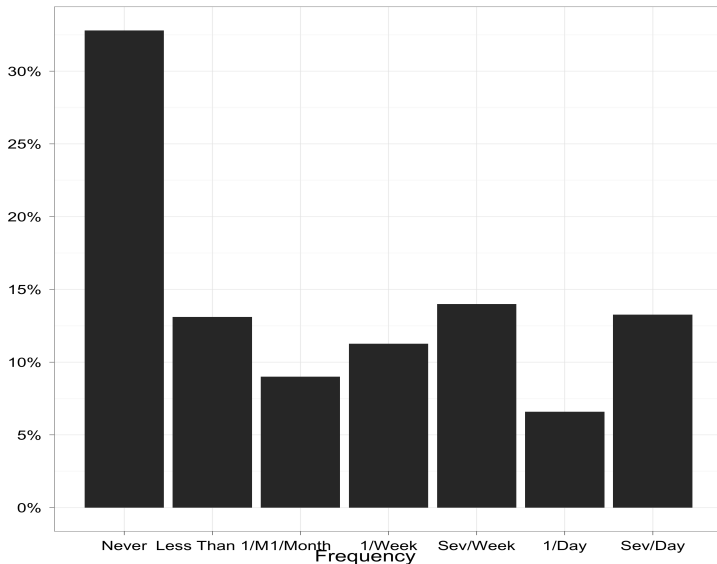
Still thinking about [INSERT ANSWER FROM Q10Q17LIST]... About how often do you usually [INSERT ITEM IN ORDER]... several times a day, once a day, several times a week, once a week, once a month, less often or never?

- a. Talk to (him/her) in-person
- b. Talk to (him/her) using your cell phone
- c. Talk to (him/her) on your landline phone at home
- d. Send (him/her) a card or letter via the mail
- e. Send (him/her) an email
- f. Send (him/her) a text message
- g. Send (him/her) an instant message
- h. Send (him/her) a message thru a Social Networking site

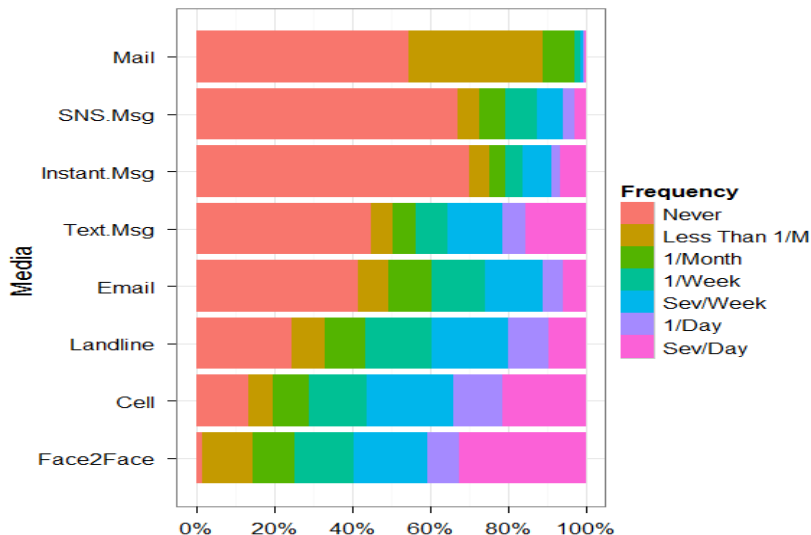




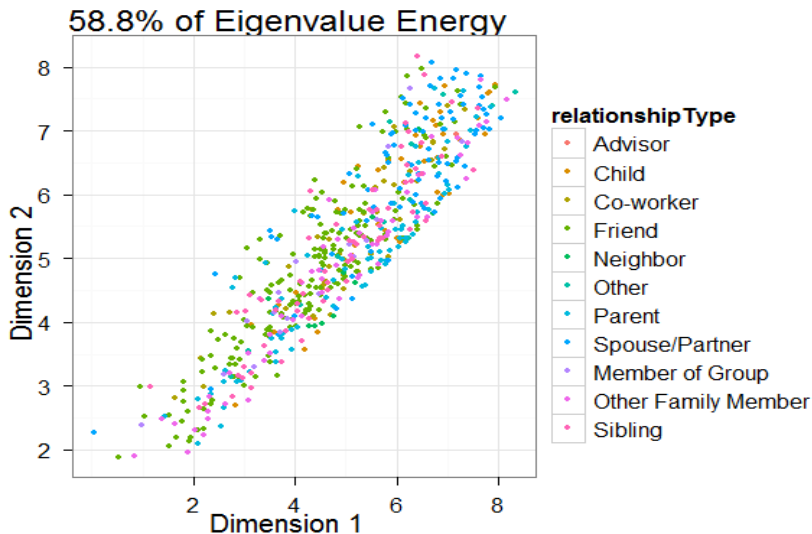
## Something is a Bit Off...



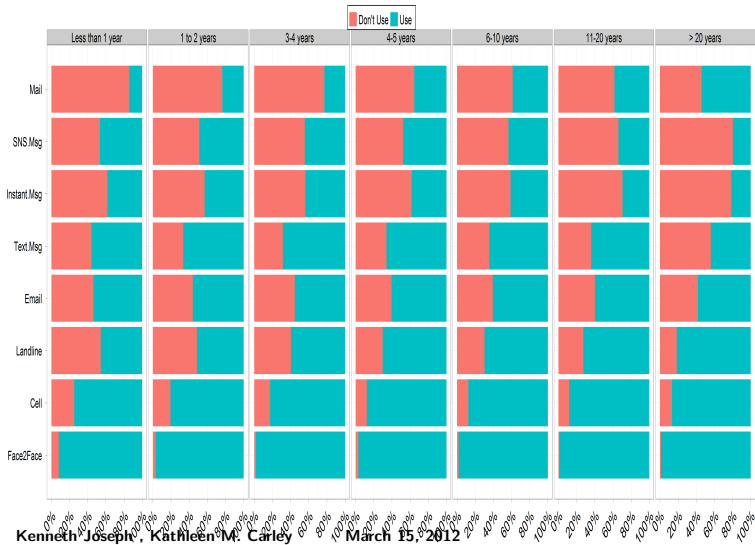
## Observe: Frequency of Use Differs for Core Ties



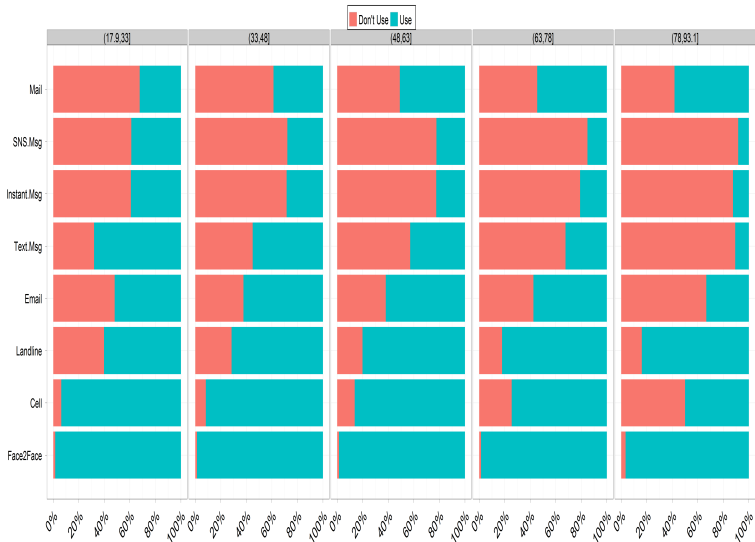
## Generalize: Relationship Type (SVD)



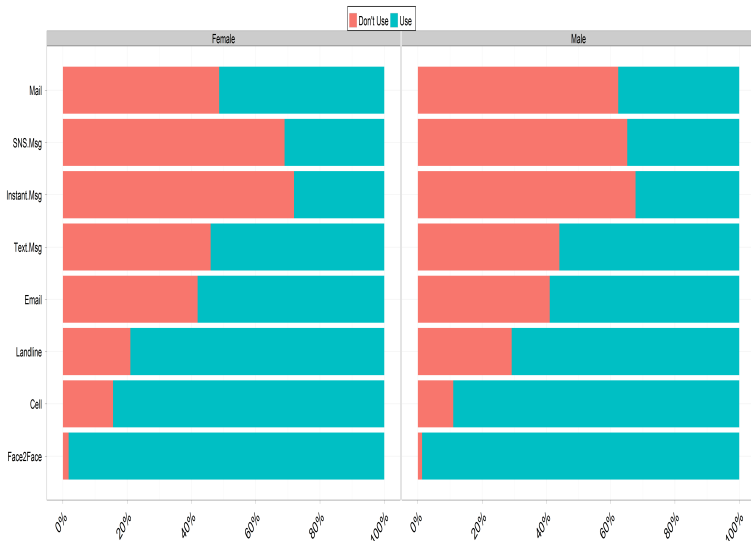
# Generalize: Relationship Duration \*\*Chi-sq p-val significant



# Generalize: Age \*\*Chi-sq p-val significant



# Generalize: Gender \*\*Chi-sq p-val significant



## Quantify: Proposed Quantification

- **Value:** Likelihood that a single observed interaction on a medium is with a member of the core discussion network,  $P(IC)$
- **Use:** Which social ties can we label as “core” from event data?



## Quantify: Equation

- Average Communication Per Day with a Core Member

$$(APD_C) = \sum_{ov}^{OrdinalValues} Avg.PerDay_{ov} * ProbOfAnswer_{ov}$$

- Average Communication Per Day (APD) across all ties - a (deliberately) conservative estimate
- Avg.NumCoreTies = 3.2 (from survey)

$$P(IC) = \frac{Avg.Num.CoreTies * APD_C}{APD}$$

- **Note:** On the aggregate, but we could do this on a per user basis





## Quantify: Result

Media	$APD_C$	Avg. Number of Core	$APD$	$P(IC)$
F2F	1.17	3.2	10	<b>.370</b>
Cell	.9	3.2	10	<b>.283</b>
Mail	.03	3.2	.25	<b>.282</b>
Landline	.52	3.2	10	<b>.162</b>
TXT	.60	3.2	15	<b>.127</b>
SNS Msg	.16	3.2	5	<b>.103</b>
Email	.33	3.2	10	<b>.068</b>
IM	.26	3.2	15	<b>.056</b>

- Mail is a good indicator - birthday cards
- SNS Msg higher than Email - dependence on (currently) arbitrary  $APD$
- Otherwise, order matches intuition, previous work, data



# Conclusion

- Chief Limitations:
  - Survey data [1]
  - “Averaging over circumstance” [6]
  - Current metrics rough
  - Missing data
- Chief Contribution: Observe, Generalize, Quantify
- Uses:
  - Move with principle from event data to network data
  - For large scale analyses of anonymized data, quantification of this kind is practical
  - If we can choose a subset of mediums to observe, which should we choose?



# References I



H.Russell Bernard, Peter D. Killworth, and Lee Sailer.

Informant accuracy in social network data iv: a comparison of clique-level structure in behavioral and cognitive network data.

*Social Networks*, 2(3):191 – 218, 1979/1980.



John R. Carlson and Robert W. Zmud.

Channel expansion theory and the experiential nature of media richness perceptions.

*The Academy of Management Journal*, 42(2):pp. 153–170, 1999.



R L Daft and R H Lengel.

Organizational information requirements, media richness and structural design.

*Manage. Sci.*, 32:554–571, May 1986.



Eric Gilbert and Karrie Karahalios.

Predicting tie strength with social media.

In *Proceedings of the 27th international conference on Human factors in computing systems*, CHI '09, pages 211–220, New York, NY, USA, 2009. ACM.



K.N. Hampton, L.F. Sessions, E.J. Her, and L. Raine.

Social isolation and new technology.

[pewinternet.org/Reports/2009/18-Social-Isolation-and-New-Technology.aspx](http://pewinternet.org/Reports/2009/18-Social-Isolation-and-New-Technology.aspx), November 2008.

URL Accessed first on 10/1/2011.



Hyo Kim, Gwang Jae Kim, Han Woo Park, and Ronald E. Rice.

Configurations of relationships in different media: Ftf, email, instant messenger, mobile phone, and sms.

*Journal of Computer-Mediated Communication*, 12(4):1183–1207, 2007.



## References II



L.P. Robert and A.R. Dennis.

Paradox of richness: a cognitive model of media choice.

*Professional Communication, IEEE Transactions on*, 48(1):10 – 21, march 2005.



John Short, Ederyn Williams, and Bruce Christie.

*The Social Psychology of Telecommunications.*

John Wiley and Sons Ltd, September 1976.



Steve Whittaker and Candace Sidner.

Email overload: exploring personal information management of email.

In *Proceedings of the SIGCHI conference on Human factors in computing systems: common ground*, CHI '96, pages 276–283, New York, NY, USA, 1996. ACM.