

Sensor-based proximity metrics for team research. A benchmarking and validation study across three organizational contexts.



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GEDII Project Gender Diversity in R&D Teams



The central question of the GEDII project is simple: what makes great (research) teams? The literature on what makes (research) teams effective is huge. GEDII will look more specifically at the relationship between gender diversity in research teams and their research performance. How do the proportion of men and women and their associated gender stereotypes [...] Read more »

H2020 Science with and for Society

Duration Oct 2015 – Sep 2018

http://www.gedii.eu

Where to meet the GEDII project

9th Biennial Gender, Work and Organisation Conference



Horizon 2020 European Union Funding for Research & Innovation

Harvard Business Review

LEADING TEAMS

The New Science of Building Great Teams

by Alex "Sandy" Pentland

FROM THE APRIL 2012 ISSUE



Behavioral Research & Social Signal Processing

"Social signal processing is the new research and technological domain that aims at providing computers with the ability to sense and understand human social signals" (Vinciarelli et al. 2009)

Behavioral cues

Physical appearance Gesture and posture Face & eye behavior Vocal behavior Space & environment



Organizational Research Sensors - MIT

<u>Wearable sensors for organizational</u> <u>research</u> ↔ Smart home or smart textiles, "FitBit" or other medical sensor devices, environmental sensors

Development of "Sociometric Sensors" @ MIT by Sandy Pentland Research Group

"Sensible Organizations: Technology and Methodology for Automatically Measuring Organizational Behavior" (Olguien et al, 2009) HONEST SIGNALS

HOW THEY SHAPE OUR WORLD

ALEX (SANDY) PENTLAND

Precise measurement of fundamental layer of human behavior and communication beneath the "surface of words".

(Limitations of) Existing Research

"Honest Signals" - Impressive predictive results based upon quasi-experimental settings

Laboratory validation studies for assessing measurement validity of physical signals (e.g. Chaffin et al. 2017; Kayhan et al. 2018)

Research in empirical settings – limited to single group scenarios (e.g. (Matusik et al. 2018; Alshamsi et al. 2016; Blok et al. 2017)

Research Questions

<u>Lack</u> of studies assessing the influence of organizational setting on validity of wearable sensor measurements.

Q1 – To which degree do Bluetooth detects among team members converge with their self-reported friendship ties and advice seeking ties?

Q2 – Does spatial proximity (as measured by Bluetooth) discriminate friends from non-friends and discriminate advice seeking ties?

Q3 – How does <u>organizational context</u> affect the validity of sensor measures?

Methods

9 Case Studies with R&D Teams

Case Study	Country	Field	Organization	Size
1	ES	Biomed. Eng.	University	8
2	ES	Biomed. Eng.	Research Center	10
3	ES	Biomed. Eng.	University	8
4	ES	Biomed. Eng.	Research Center	9
5	ES	Biomed. Eng.	Research Center	11
6	UK	Energy Eng.	University	10
7A	UK	Transport Eng.	Private company	9
7B	UK	Transport Eng.	Private company	7
8	UK	Transport Eng.	Private company	8
				80

Sociometric Badges

Proximity (Bluetooth)

Receive Signal Strength -90 < x < -60. 1-4 meters desirable.

Infrared (f2f) Cone of 30° angle, 1-1.5 meter. Every 60 seconds.

Audio (speech)

8kHz Volume, voice pitch.

Body movement

Accelerometer energy magnitude. Sampled 0.1-0.5 seconds

All data timestamped



Field period: sociometric data for each team member collected during 5 working days

Friendship and Advice Seeking

Round-robin scores:

Advice: "Please indicate the frequency with which you ask each of your colleagues for <u>work related advice</u>" (1=Never, 2=Rarely, 3=Sometimes, 4=Very often, 5=Always)

Friendship: "Please indicate the frequency with which you <u>spend time</u> <u>socially</u> with each of your colleagues <u>outside the lab/office</u>" (1=Never, 2=Some times a year, 3=Some times a month, 4=Some times a week, 5=Daily)

Large body of research corroborating the importance of <u>instrumental</u> and <u>expressive ties</u> in organizations and the workplace (de Montjoye et al. 2014; Joshi and Knight 2015; Wax, DeChurch, and Contractor 2017; Casciaro and Lobo 2008; Wilkin, Jong, and Rubino 2018)

Bluetooth Proximity Measures

Understanding Radio Signal Strength Indicator (RSSI)



Time	ID1	ID2	RSSI
9:01:46	A	В	-54
9:02:01	В	A	-50
9:02:15	В	A	-68
9:03:05	В	С	-78
9:03:22	В	D	-68
9:03:57	А	D	-83
9:04:12	D	С	-56

Distribution of RSSI Detects (all 9 teams)



Analytic Approach

General procedure

- Assign unique ID to each team member dyad
- Count BT detects at given RSSI interval or level for each team dyad. (High values such as -52 indicate closer spatial proximity while lower numbers such as -90 indicate greater spatial separation).
- Assign corresponding round-robin scores for each team dyad.
- Calculate Spearman's correlation coefficient *rho* between selfreported ratings and frequency of BT detects for all dyads.

Organizational context

Subdivide pool of 9 teams into 3 university based teams, 3 research lab teams and 3 private company teams and re-run analysis.

Results

Convergent Validity (all teams)



Convergent Validity (organizational context)

Advice Seeking Friendship в 0.6 0.6 Spearman Rho Spearman Rho 0.4 0.2 0.2 0.0 0.0 [-90:-58] [-80:-58] [-70:-58] [-60:-58] [-90:-58] [-80:-58] [-70:-58] [-60:-58] RSSI RSSI Organization All teams Private Company
Research labs Organization

All teams

Private Company
Research labs

University

University

A

Discriminant Validity (all teams)

Friendship

Advice Seeking



Assess the role of spatial proximity for validity of Bluetooth measures

Discriminant Validity (organizational context)

Friendship









Type of organization — All teams - Private Company - Research labs - University

Concluding Comments

Bluetooth sensor measures converge to a considerable degree with self-reported instrumental and expressive ties.

BUT: validity of sensor based proximity measures clearly depend on specific <u>organizational contexts</u>!

Consider <u>mixed-methods</u> for collecting complementary data in order to identify genuine social relations within (spatial, organizational) context (see Müller et al. 2019, Doreian & Conti 2012)

 \rightarrow Opens the path to take advantage of high resolution, temporal interaction data.

References

Chaffin, D. et al. The Promise and Perils of Wearable Sensors in Organizational Research. Organ. Res. Methods 20, 3–31 (2017).

Kayhan, V. O. et al. How honest are the signals? A protocol for validating wearable sensors. Behav. Res. Methods 1–27 (2018). doi:10.3758/s13428-017-1005-4

Matusik, J. G. et al. Wearable bluetooth sensors for capturing relational variables and temporal variability in relationships: A construct validation study. J. Appl. Psychol. (2018). doi:10.1037/apl0000334

Alshamsi, A., Pianesi, F., Lepri, B., Pentland, A. & Rahwan, I. Network Diversity and Affect Dynamics: The Role of Personality Traits. PLOS ONE 11, e0152358 (2016).

Blok, A. et al. Stitching together the heterogeneous party: A complementary social data science experiment. Big Data Soc. 4, 1–15 (2017).

Diedenhofen, B. & Musch, J. cocor: A Comprehensive Solution for the Statistical Comparison of Correlations. PLOS ONE 10, e0121945 (2015).

Olguin, D. O. et al. Sensible Organizations: Technology and Methodology for Automatically Measuring Organizational Behavior. IEEE Trans. Syst. Man Cybern. Part B Cybern. 39, 43–55 (2009).

Pentland, A. Honest signals how they shape our world. (MIT Press, 2008).

Vinciarelli, A., Pantic, M. & Bourlard, H. Social signal processing: Survey of an emerging domain. Image Vis. Comput. 27, 1743–1759 (2009).

de Montjoye, Y.-A., Stopczynski, A., Shmueli, E., Pentland, A. & Lehmann, S. The Strength of the Strongest Ties in Collaborative Problem Solving. Sci. Rep. 4, 1–6 (2014).

Joshi, A. & Knight, A. P. Who Defers to Whom and Why? Dual Pathways Linking Demographic Differences and Dyadic Deference to Team Effectiveness. Acad. Manage. J. 58, 59–84 (2015).

Wax, A., DeChurch, L. A. & Contractor, N. S. Self-Organizing Into Winning Teams: Understanding the Mechanisms That Drive Successful Collaborations. Small Group Res. 48, 665–718 (2017).

Casciaro, T. & Lobo, M. S. When Competence Is Irrelevant: The Role of Interpersonal Affect in Task-Related Ties. Adm. Sci. Q. 53, 655–684 (2008).

Wilkin, C. L., Jong, J. P. de & Rubino, C. Teaming up with temps: the impact of temporary workers on team social networks and effectiveness. Eur. J. Work Organ. Psychol. 27, 204–218 (2018).

Müller, J., Fàbregues, S., Guenther, E. A. & Romano, M. J. Using Sensors in Organizational Research—Clarifying Rationales and Validation Challenges for Mixed Methods. Front. Psychol. 10, (2019).

Doreian, P. & Conti, N. Social context, spatial structure and social network structure. Soc. Netw. 34, 32-46 (2012).

Thank you!





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https://www.gender-ict.net https://www.gedii.eu https://www.genderportal.eu https://www.act-on-gender.eu

Annex I -



Number of team dyads per team

Cocor – Convergent Validity



Convergent validity. Significant differences between organizational contexts for <u>cumulative</u> BT detects and <u>friendship</u> scores.

Convergent validity. Significant differences between organizational contexts for <u>cumulative</u> BT detects and <u>advice seeking</u> scores



Cocor - Discriminant Validity

Discriminant validity. Friendship correlation coefficients at discrete RSSI levels comparing organizational contexts



Discriminant validity. Advice seeking correlation coefficients at discrete RSSI levels comparing organizational contexts





С

-60

04

0.2

0.0

-0 1

Correlation

