### Lecture 24: Online dating

Matthew J. Salganik

Sociology 204: Social Networks Princeton University

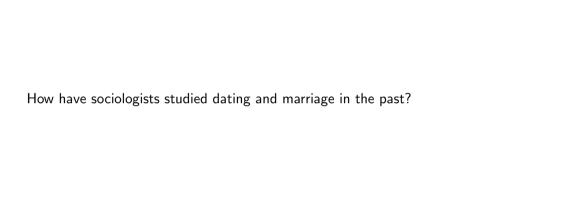
1/2 Online dating



#### Online dating create two kinds of question:

- ▶ How does online dating change dating and marriage?
- ▶ How can we use online dating to study existing questions in new ways?

This is a common pattern when new online systems are created.



### INTERMARRIAGE AND HOMOGAMY: Causes, Patterns, Trends

Matthijs Kalmijn

Department of Sociology, Utrecht University, Utrecht, The Netherlands; e-mail: m.kalmijn@fsw.ruu.nl

"People have a tendency to marry within their social group or to marry of person who is close to them in status."

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"People have a tendency to marry within their social group or to marry of person who is close to them in status."

- ▶ Can we measure these patterns and see how it varies over time and across space?
- Why does these pattern exist? (Very hard with only outcome data)

http://dx.doi.org/10.1146/annurev.soc.24.1.395

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Consequences of assortative mating for:

inequality within generations

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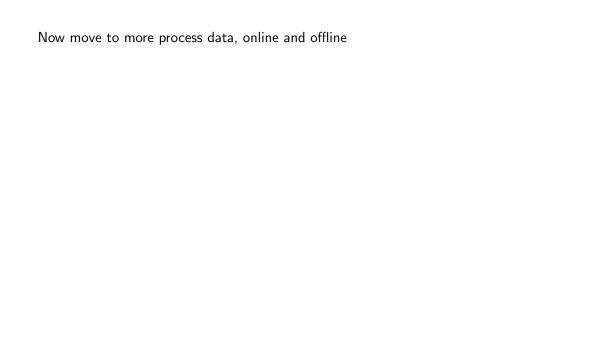
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### Consequences of assortative mating for:

- inequality within generations
- inequality between generations
- long-run population change
- relationship quality and dissolution

http://dx.doi.org/10.1146/annurev-soc-071312-145544

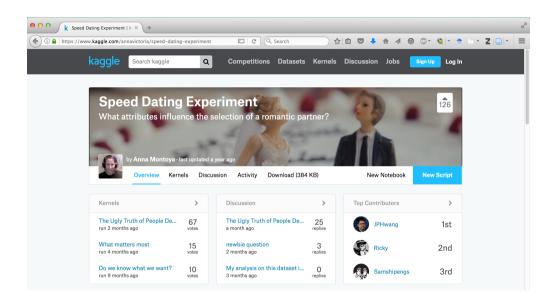


Now move to more process data, online and offline

### GENDER DIFFERENCES IN MATE SELECTION: EVIDENCE FROM A SPEED DATING EXPERIMENT\*

RAYMOND FISMAN
SHEENA S. IYENGAR
EMIR KAMENICA
ITAMAR SIMONSON

Observe all decisions, not just final matches



https://www.kaggle.com/annavictoria/speed-dating-experiment

### Online dating create two kinds of question:

► How does online dating change dating and marriage?

▶ How can we use online dating to study existing questions in new ways?

- 1940 heterosexual couples, US, way of meeting (some categories overlapped):
- ▶ family: 24 percent
- friends: 21 percent
- school: 21 percent
- neighbors: 13 percent
- ► church: 13 percent
- ▶ bar or restaurant: 12 percent
- co-workers: 10 percent

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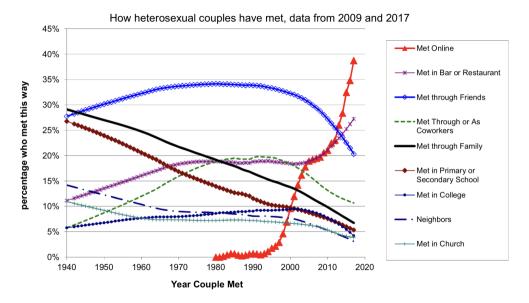
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By 2009,

- ▶ half of all straight couples still met through friends or at a bar or restaurant, but 22 percent met online, and all other sources had shrunk.
- ▶ more than one-third of couples who married in the United States from 2005 to 2012 met online
- ▶ almost 70 percent of gay and lesbian couples met online

https://www.nytimes.com/2015/06/14/opinion/sunday/how-to-make-online-dating-work.html



Source: Rosenfeld et al (2019) https://doi.org/10.1073/pnas.1908630116

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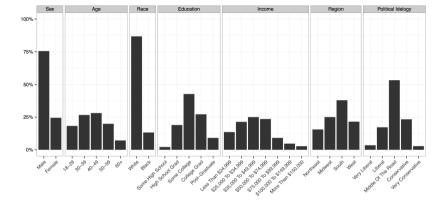
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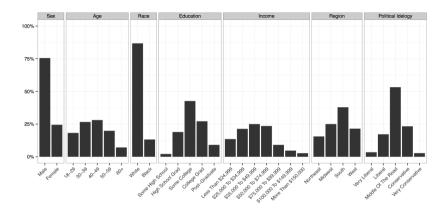
▶ How does online dating change dating and marriage?

### Political Ideology and Racial Preferences in Online Dating

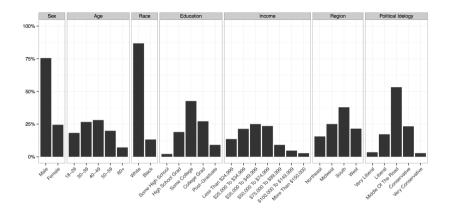
Ashton Anderson,<sup>a</sup> Sharad Goel,<sup>b</sup> Gregory Huber,<sup>c</sup> Neil Malhotra,<sup>a</sup> Duncan J. Watts<sup>b</sup>
a) Stanford University; b) Microsoft Research; c) Yale University

► Focused on same race romantic relationships (racial homogamy). What are the roles of opportunity and choice?

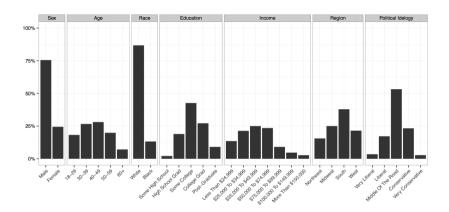




▶ Analysis sample is limited to white and black heterosexuals.



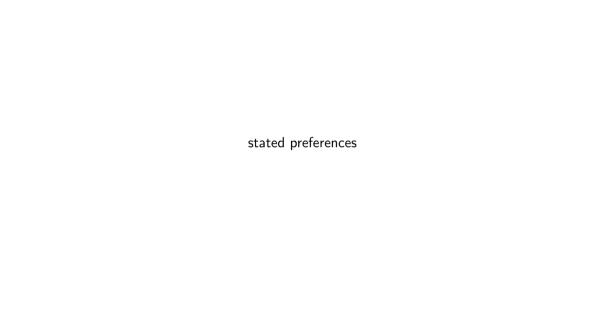
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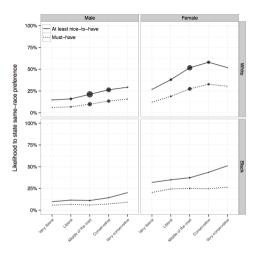


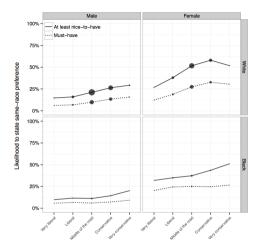
- ► Analysis sample is limited to white and black heterosexuals. Other research focuses on other groups.
- ► Sample is diverse in other ways.

- State Low Commercial Laboratory
- ► Stated preferences: what you say you want

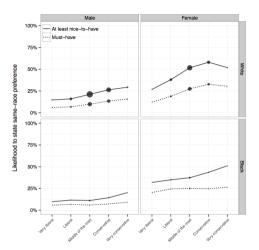
► Revealed preferences: what you do



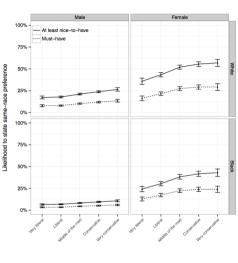


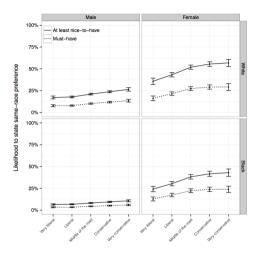


► Conservative show more stated preference for same-race partners

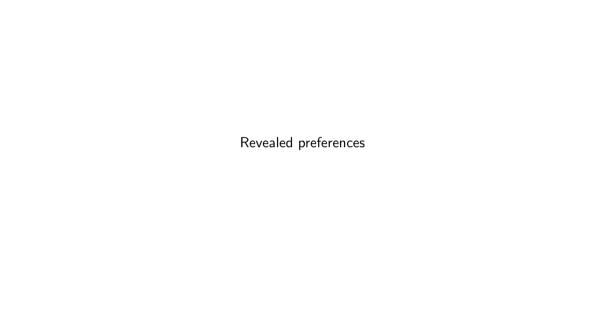


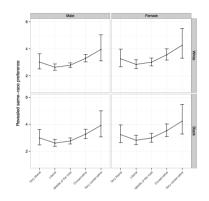
- ► Conservative show more stated preference for same-race partners
- ► Maybe this is caused by something correlated with conservativeness? So, researchers do statistical adjustments.



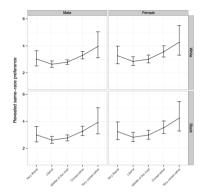


► Conservative show more stated preference for same-race partners, even after some statistical adjustments.



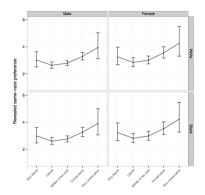


 $\mbox{risk ratio} = \frac{Pr[q_i \mbox{ views profile of } c_i | q_i \mbox{ is the same race as } c_i]}{Pr[q_i \mbox{ views profile of } c_i | q_i \mbox{ is different race as } c_i]}$ 



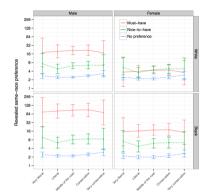
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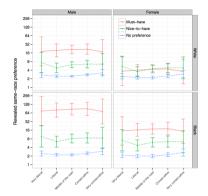
▶ More conservative individuals revealed preference to select same race partner



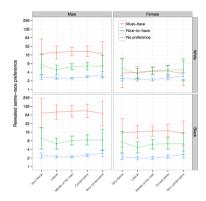
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- More conservative individuals revealed preference to select same race partner
- ► Men and women are equally likely to have revealed preference to select same race partner

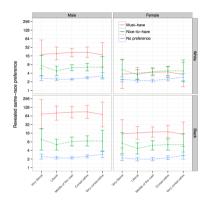




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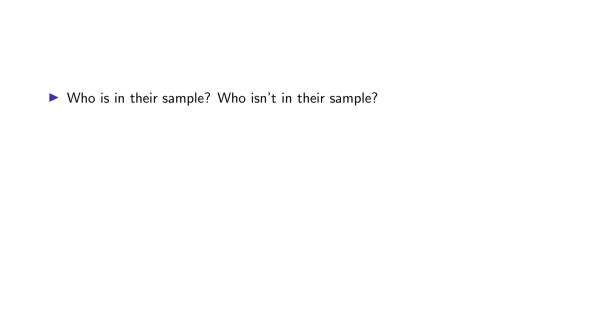
- ▶ All groups exhibit revealed same-race preferences (note all estimates are above 1)
- ▶ People who have higher stated preferences have higher revealed preferences
- ► Not big differences by ideology

# Studying Online Behavior:

Comment on Anderson et al. 2014

Kevin Lewis

University of California, San Diego



- ▶ Who is in their sample? Who isn't in their sample?
- What kind of dating site?

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- ► What kind of dating site?
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- ► What kind of dating site?
- ▶ How much of these revealed preferences are the users and how much are the site's algorithms? (This should remind you of algorithmic filter bubbles).
- ► Should we care about profile clicks or some other behavior, such as online contact or offline dating?

## Political Ideology and Racial Preferences in Online Dating

Ashton Anderson, a Sharad Goel, b Gregory Huber, Neil Malhotra, Duncan J. Wattsb a) Stanford University; b) Microsoft Research; c) Yale University

## Studying Online Behavior: Comment on Anderson et al. 2014

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### Rejoinder to Lewis

Ashton Anderson,<sup>a</sup> Sharad Goel,<sup>a</sup> Gregory Huber,<sup>b</sup> Neil Malhotra,<sup>a</sup> Duncan J. Watts<sup>c</sup>

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|----------------|--|--|--|
|                |  |  |  |

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- racial homogomy is partially the results of opportunity and partially the result of choices
- online dating allows us to study those choices in more detail (but this can be tricky because of things like algorithmic confounding)
- in this study, participants had both stated and revealed preferences for same-race partners

- Here are some more things to read about online dating:

  Lewis (2013) "The limits of racial prejudice." PNAS.
- http://dx.doi.org/10.1073/pnas.1308501110

http://dx.doi.org/10.1086/687533.

https://doi.org/10.1093/sf/soaa065

- ► Bruch et al (2016) "Extracting multistage screening rules from online dating activity data." *PNAS*. http://dx.doi.org/10.1073/pnas.1522494113

  ► Huber and Malbetra (2017) "Political Homophily in Social Polationships:
- ► Huber and Malhotra (2017) "Political Homophily in Social Relationships: Evidence from Online Dating Behavior." The Journal of Politics,
- ▶ Rafalow, Feliciano, and Robnett. 2017. "Racialized Femininity and Masculinity in the Preferences of Online Same-Sex Daters." Social Currents, https://doi.org/10.1177/2329496516686621
- Rudder (2015) Datacylsm. http://dataclysm.org/
- ► OKCupid Blog. https://theblog.okcupid.com/
- Ansari and Klinenberg (2015) Modern Romance.
- https://en.wikipedia.org/wiki/Modern\_Romance:\_An\_Investigation

  Feliciano and Kizer (2020) "Reinforcing the Racial Structure: Observed Race and Multiracial Internet Daters' Racial Preferences." Social Forces,