



Gender Diversity in Online Software Teams

Aid or Barrier?

Bogdan Vasilescu

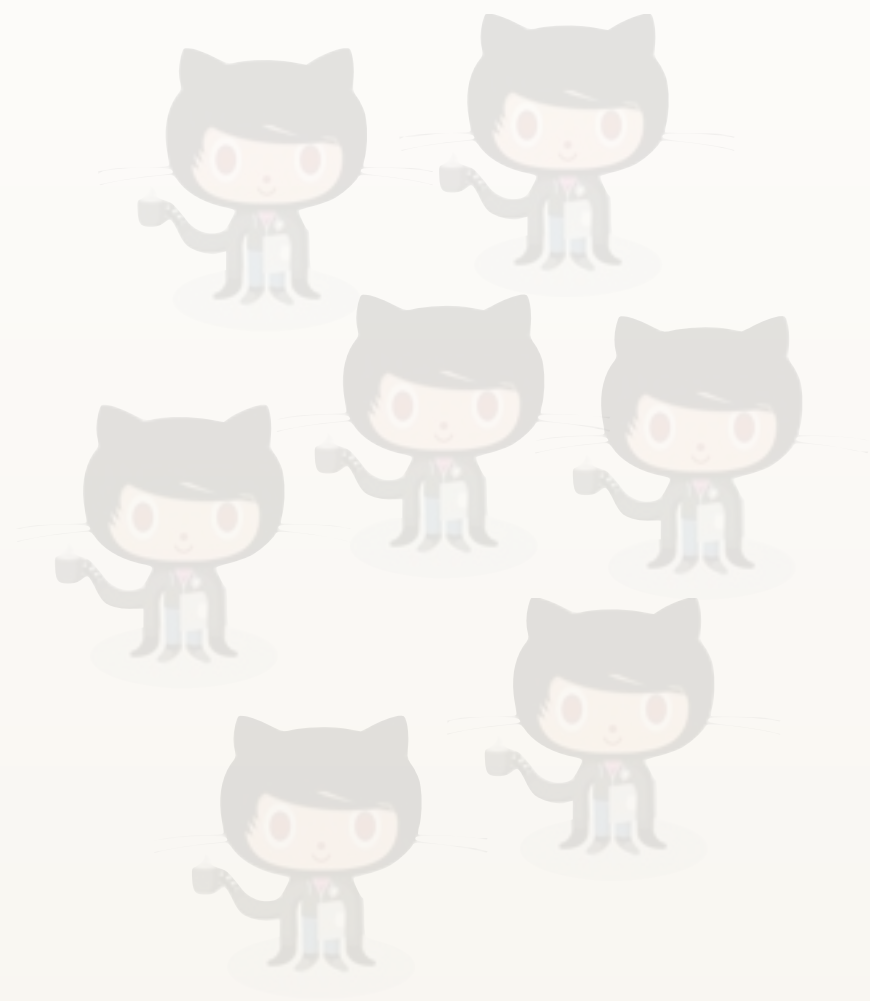
@b_vasilescu

<http://bvasiles.github.io>

Which is more effective?

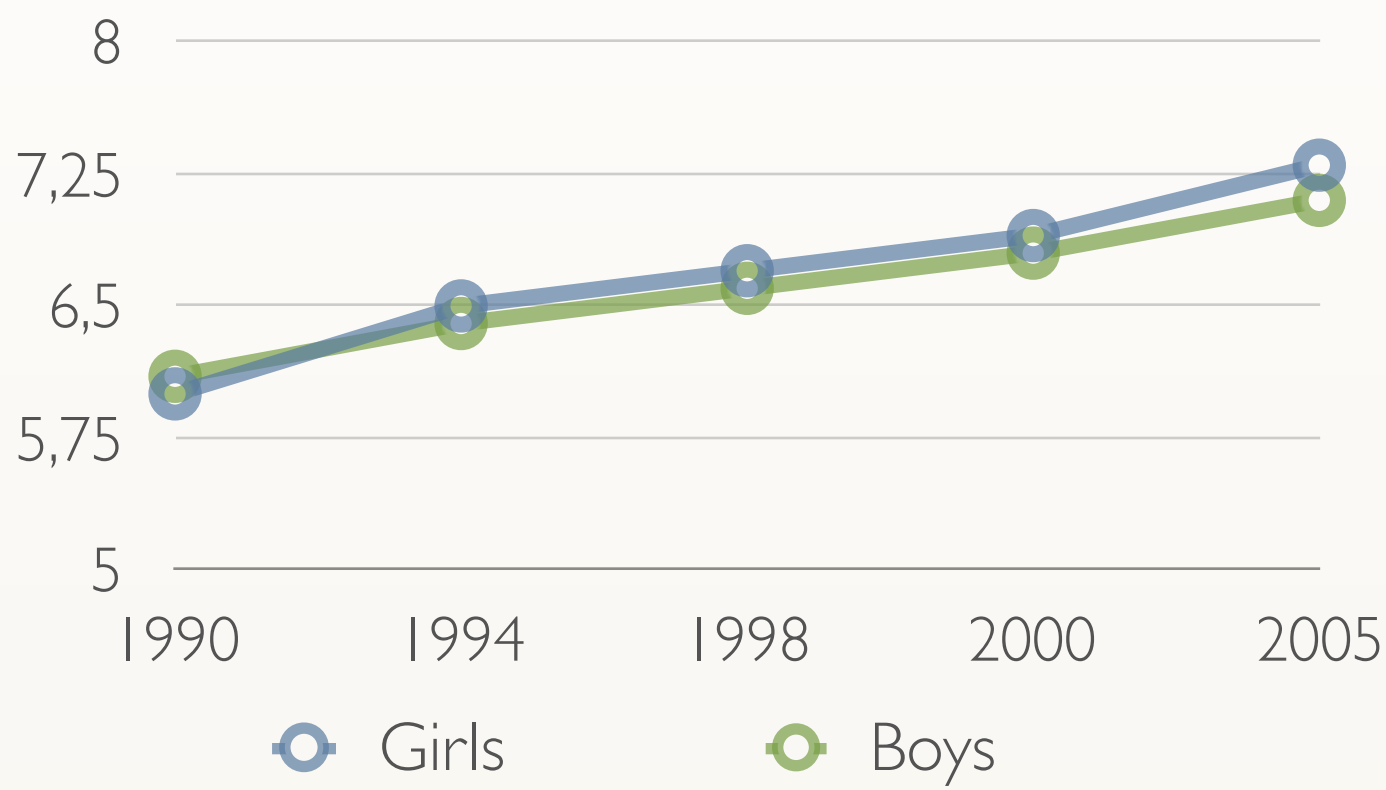


Which is more effective?

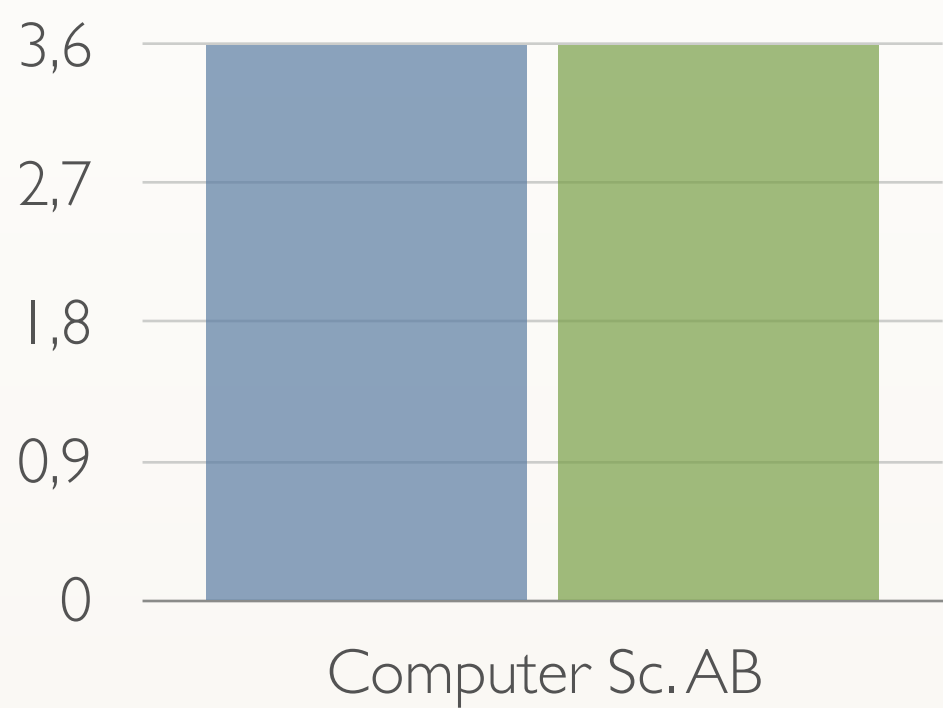


GENDER DIVERSITY IN HIGH SCHOOL

High School Credits Earned in Mathematics and Science, by Gender, 1990–2005



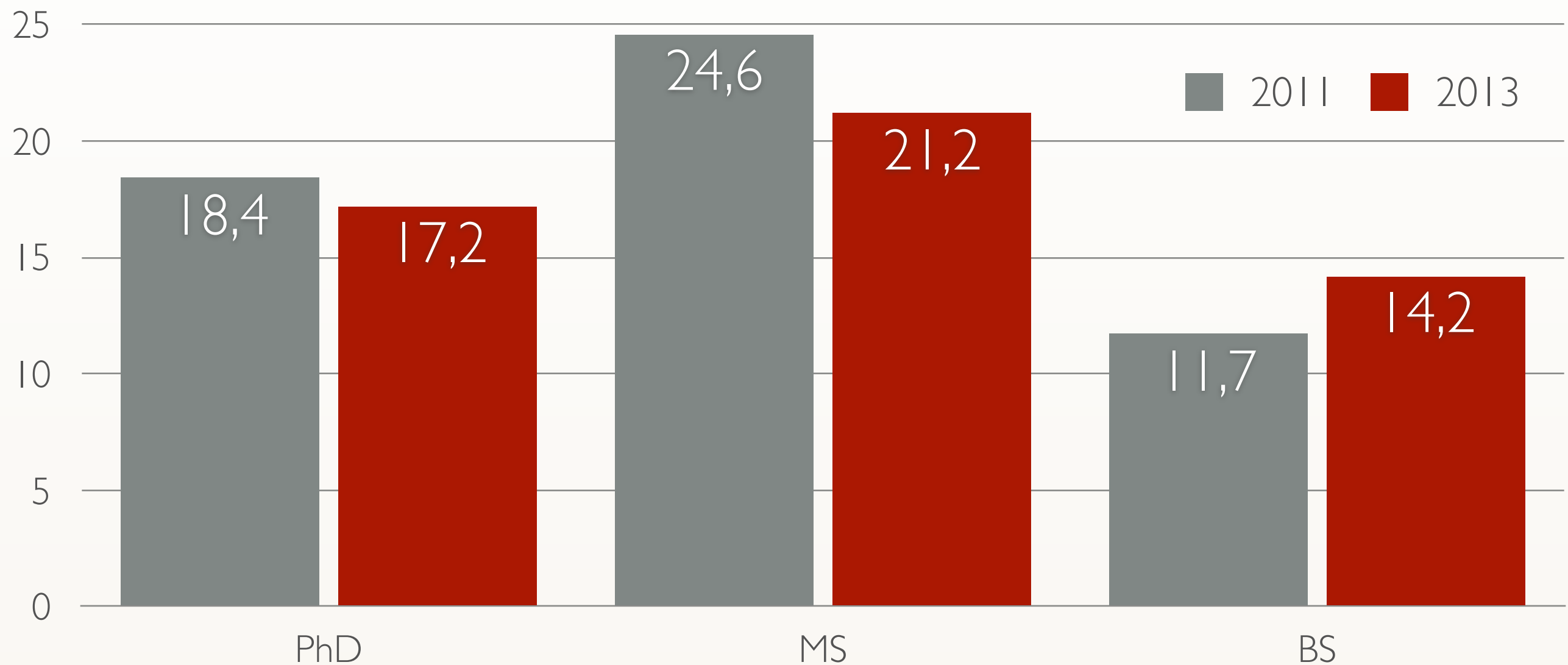
Average Scores on Advanced Placement Tests in Computer Science 2009



No gender differences early

GENDER DIVERSITY IN HIGHER CS EDUCATION

CRA survey across 179 departments



Underrepresentation in CS

WHAT IS THE PROBLEM?

- Stereotype threat
- Self confidence
- Bias in classroom, advising
- Lack of women faculty, mentors, role models
- ...

GENDER DIVERSITY IN TECH COMPANIES

Company	Male	Female
Twitter	90%	10%
Yahoo	85%	15%
Facebook	85%	15%
LinkedIn	83%	17%
Microsoft	83%	17%
Google	82%	18%
Apple	80%	20%

Underrepresentation in tech companies

GENDER DIVERSITY IN OPEN SOURCE SOFTWARE

Company	Male	Female
Twitter	90%	10%
Yahoo	85%	15%
Facebook	85%	15%
LinkedIn	83%	17%
Microsoft	83%	17%
Google	82%	18%
Apple	80%	20%



10.9%

Even worse in OSS!

GENDER DIVERSITY IN OPEN SOURCE SOFTWARE



The “hacker” culture is **male-dominated** and **unfriendly** to women.

[Turkle, S. The Second Self: Computers and the Human Spirit. MIT Press, 2005]



Reports of active **discrimination** and **sexism** towards women.

[Nafus, D. ‘Patches don’t have gender’: What is not open in open source software. New Media & Society 14, 4 (2012), 669–683]

THE EVOLUTION OF THE “SOCIAL PROGRAMMER”



ashley williams
ashleygwilliams

npm, inc
 ridgewood, queens, NYC

[http://ashleygwilliams.github.io/](mailto:ashleygwilliams@gmail.com)
 Joined on Oct 31, 2011

776 Followers
38 Starred
15 Following

Organizations



Contributions Repositories Public activity

Follow



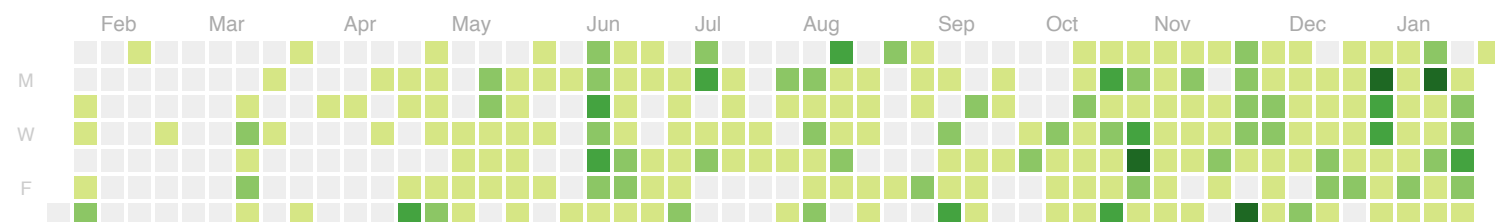
Popular repositories

breakfast-repo	208 ★
a collection of videos, recordings, and podcast...	
x86-kernel	48 ★
a simple x86 kernel, extended with Rust	
ashleygwilliams.github.io	37 ★
hi, i'm ashley. nice to meet you.	
jsconf-2015-deck	32 ★
deck for jsconf2015 talk, "if you wish to learn e...	
ratpack	32 ★
sinatra boilerplate using activerecord, sqlite, a...	

Repositories contributed to

npm/docs	44 ★
The place where all the npm docs live.	
mozilla/publish.webmaker.org	2 ★
The teach.org publishing service for goggles a...	
npm/marky-markdown	104 ★
npm's markdown parser	
artisan-tattoo/assistant-frontend	5 ★
ember client for assistant-API	
npm/npm-camp	1 ★
a community conference for all things npm	

Public contributions



Summary of pull requests, issues opened, and commits. [Learn how we count contributions.](#)

Less More

Contributions in the last year
1,886 total
Jan 24, 2015 – Jan 24, 2016

Longest streak
37 days
October 7 – November 12

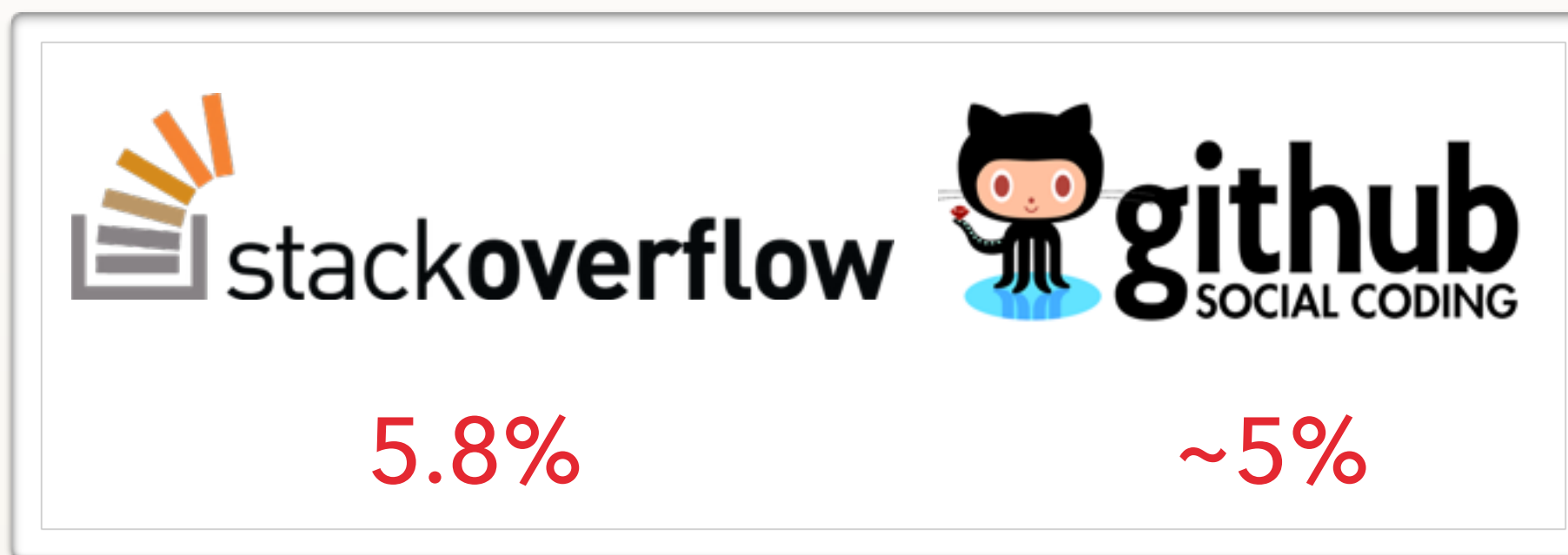
Current streak
7 days
January 18 – January 24

- Programming in a socially networked world: the evolution of the social programmer
C Treude, F Figueira Filho, B Cleary, MA Storey.
FutureCSD-CSCW 2012

- Social coding in GitHub: transparency and collaboration in an open software repository
L Dabbish, C Stuart, J Tsay, J Herbsleb.
CSCW 2012

- Social networking meets software development: Perspectives from GitHub, MSDN, Stack Exchange, and TopCoder
A Begel, J Bosch, MA Storey. *IEEE Software 2013*

GENDER DIVERSITY IN SOCIAL CODING ENVIRONMENTS



- Exploring the data on gender and GitHub repo ownership
Alyssa Frazee. <http://alyssafrazee.com/gender-and-github-code.html>
- Google Diversity (2015) www.google.com/diversity/index.html#chart
- Stack Overflow 2015 Developer Survey (26,086 people from 157 countries)
<http://stackoverflow.com/research/developer-survey-2015#profile-gender>
- Inside Microsoft (2015) <https://goo.gl/nT4Yil>

SOME ANECDOTAL EVIDENCE OF DISCRIMINATION



"I have used a **fake GitHub handle** (my normal GitHub handle is my first name, which is a distinctly female name) **so that people would assume I was male**"

- Perceptions of Diversity on GitHub: A User Survey. [Vasilescu, B.](#), Filkov, V., and Serebrenik, A. International Workshop on Cooperative and Human Aspects of Software Engineering, CHASE, IEEE (2015), 50–56.

SOME ANECDOTAL EVIDENCE OF DISCRIMINATION



Does diversity add
any value in GitHub
teams?

"I have
(my normal GitHub handle is my
first name, which is a distinctly
female name) so that people would
assume I was male"

- Perceptions of Diversity on GitHub: A User Survey. Vasilescu, B., Filkov, V., and Serebrenik, A. International Workshop on Cooperative and Human Aspects of Software Engineering, CHASE, IEEE (2015), 50–56.

DIVERSITY IS RECOGNIZED AS VALUABLE



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“Driver of internal **innovation**
and **business growth**” [Forbes]

DIVERSITY IS RECOGNIZED AS VALUABLE



“Driver of internal **innovation** and **business growth**” [Forbes]

Companies with diverse executive boards have **higher earnings** and **returns on equity** [McKinsey]

DIVERSITY IS RECOGNIZED AS VALUABLE



“Driver of internal **innovation** and **business growth**” [Forbes]

Companies with diverse executive boards have **higher earnings** and **returns on equity** [McKinsey]

BENEFITS:

- access to different networks
- broader views
- creativity
- adaptability
- problem solving
- ...

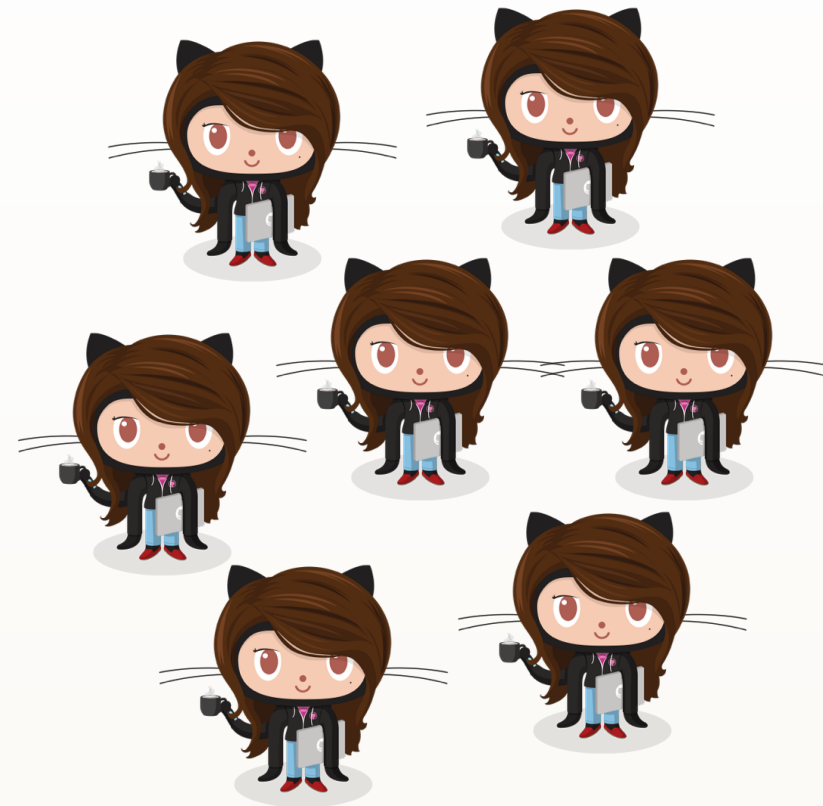
→ INFORMATION PROCESSING THEORY

- Salancik, G. R., and Pfeffer, J. A social information processing approach to job attitudes and task design. Admin. Sci. Quart. 23, 2 (1978), 224–253

DIVERSITY IN SOFTWARE TEAMS?



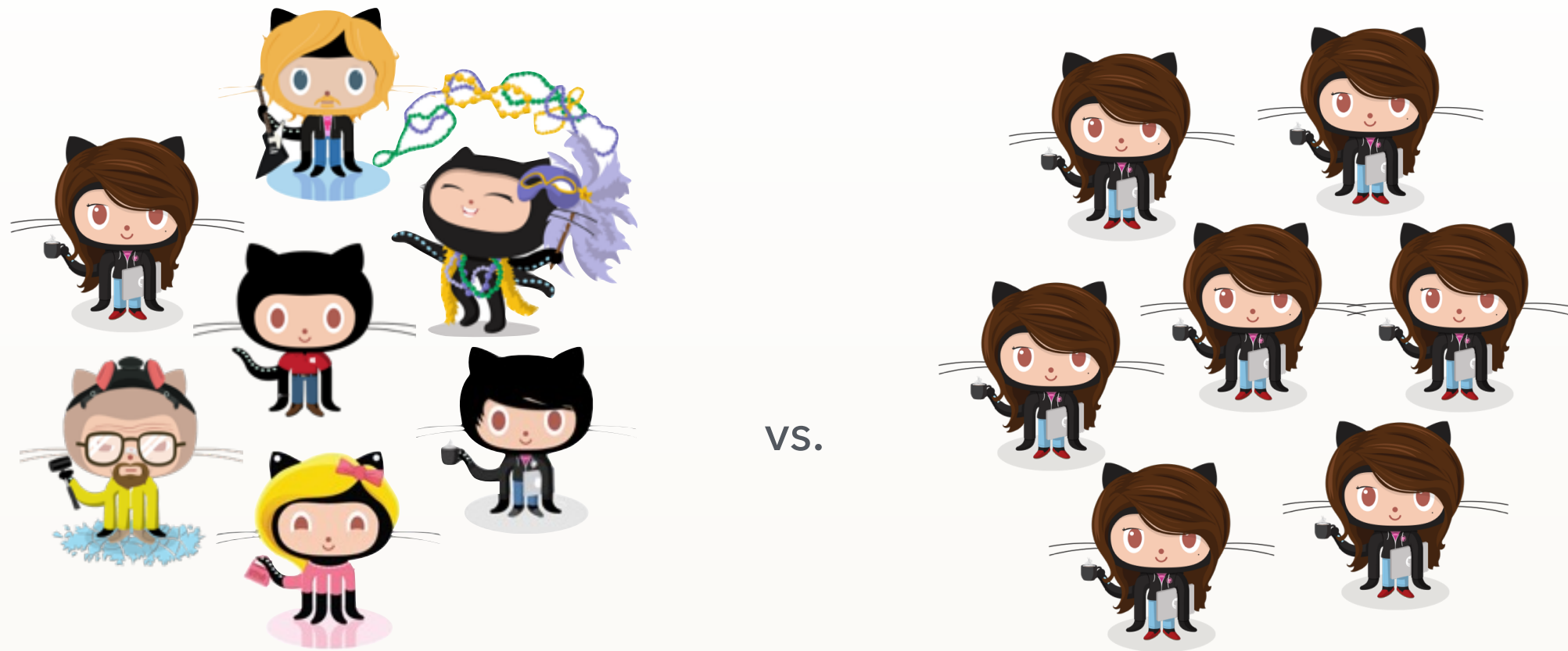
vs.



HIGHER RISK OF:

- communication breakdown
- conflict
- confusion
- stress
- discrimination
- ...

DIVERSITY IN SOFTWARE TEAMS?



HIGHER RISK OF:

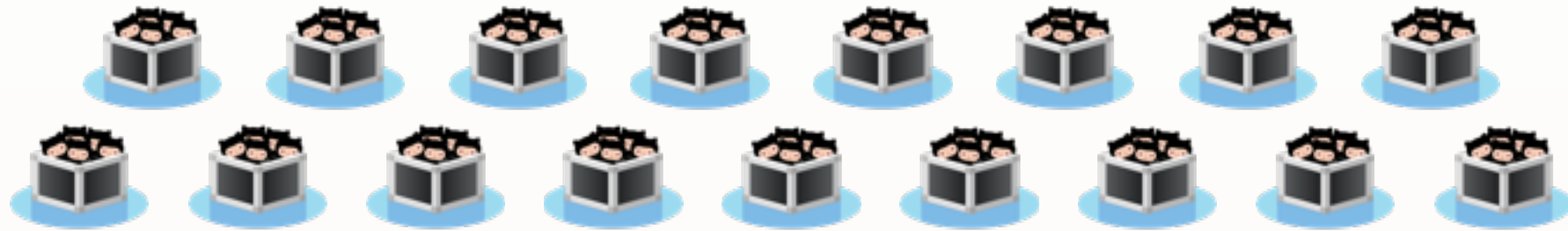
- communication breakdown
- conflict
- confusion
- stress
- discrimination
- ...

→ **SIMILARITY ATTRACTION THEORY**

→ **SOCIAL IDENTITY, SOCIAL CATEGORIZATION THEORY**

NATURAL EXPERIMENT

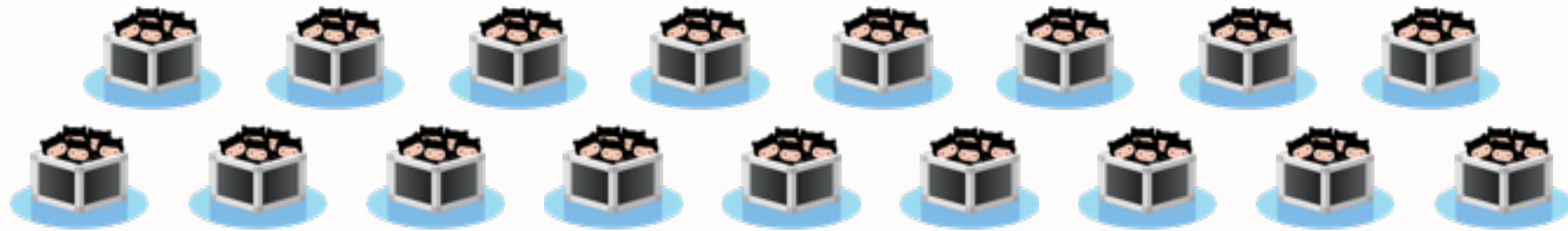
1. Mine data from many **collaborative projects**



- **Gender and tenure diversity in GitHub teams.** Vasilescu, B., Posnett, D., Ray, B., Brand, M.G.J. van den, Serebrenik, A., Devanbu, P., and Filkov, V. CHI Conference on Human Factors in Computing Systems, CHI, ACM (2015), 3789–3798.

NATURAL EXPERIMENT

1. Mine data from many **collaborative projects**



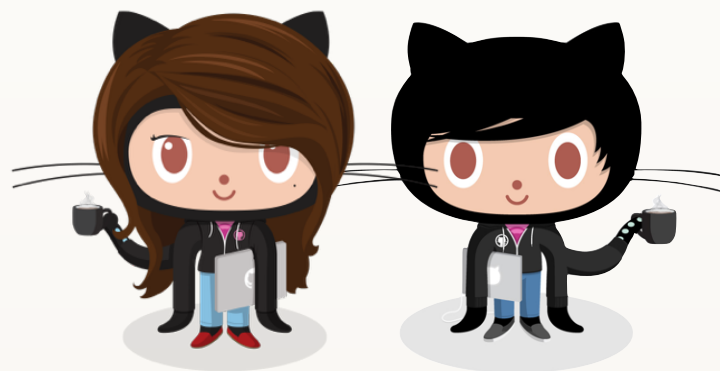
2. Compare **outputs produced per unit time**
in more/less diverse teams

NATURAL EXPERIMENT

1. Mine data from many **collaborative projects**



2. Compare **outputs produced per unit time**
in more/less diverse teams



Gender diversity
= mix women/men

*Simplifying assumption:
gender is binary*



Tenure diversity
= mix junior/senior

GitHub coding experience

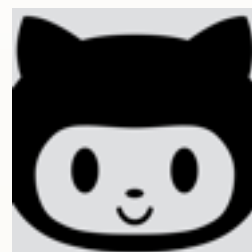
OPPORTUNITIES AND CHALLENGES



World's largest open
source community

Trace data available
@ghtorrent
[Gousios et al]

OPPORTUNITIES AND CHALLENGES



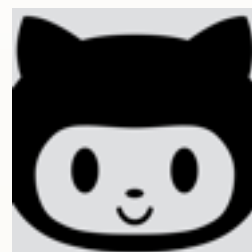
Theoretical



Technical

OSS as meritocracy;
contribution quality as
main driver of impression
formation
[Dabbish et al, Marlow et al]

OPPORTUNITIES AND CHALLENGES



Theoretical



Technical

Demographics are
less salient in OSS
[Riordan & Shore]

OPPORTUNITIES AND CHALLENGES



Theoretical



Anyone can
contribute to any
repository.
Who's on a team?



Technical

OPPORTUNITIES AND CHALLENGES



Theoretical



Gender is not
explicitly recorded



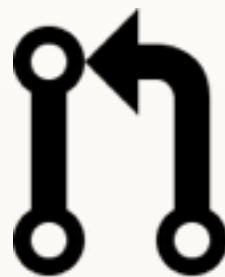
Technical



OPPORTUNITIES AND CHALLENGES



Theoretical



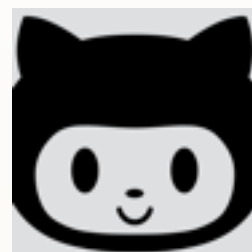
People contribute
under multiple aliases



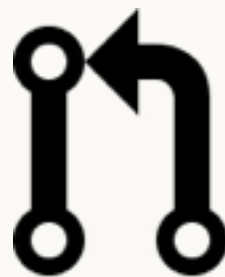
Technical



OPPORTUNITIES AND CHALLENGES



Theoretical



Technical



How to analyze
such large-scale
longitudinal trace
data?

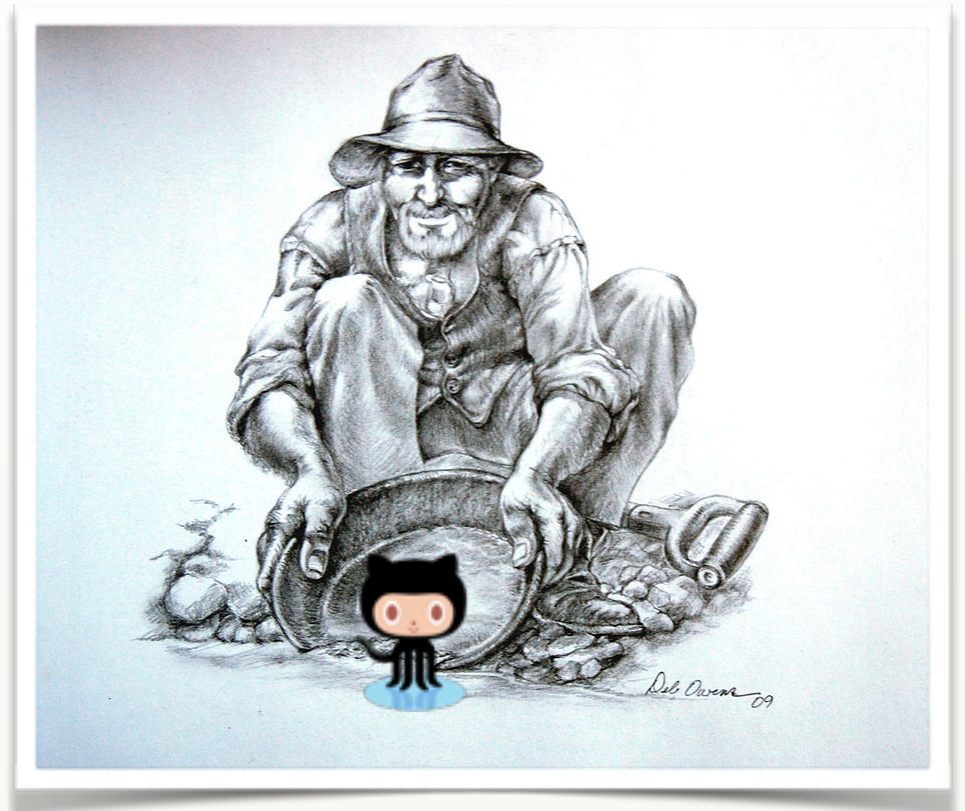
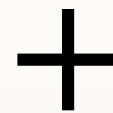
APPROACH: MIXED METHODS

Diversity survey

Welcome to our GitHub diversity survey!

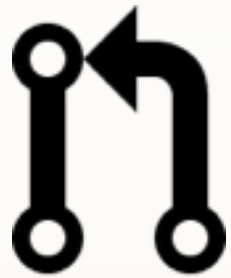
This survey is aimed at developing a better understanding of the national origin in distributed software engineering teams.

Your participation is voluntary and confidential. If you agree to



- Perceptions of Diversity on GitHub: A User Survey. [Vasilescu, B.](#), Filkov, V., and Serebrenik, A. International Workshop on Cooperative and Human Aspects of Software Engineering, CHASE, IEEE (2015), 50–56.

SURVEY: QUESTIONS



What do people perceive constitutes a team?



Do people recognize differences among others on their team?

Which differences are more prominent?



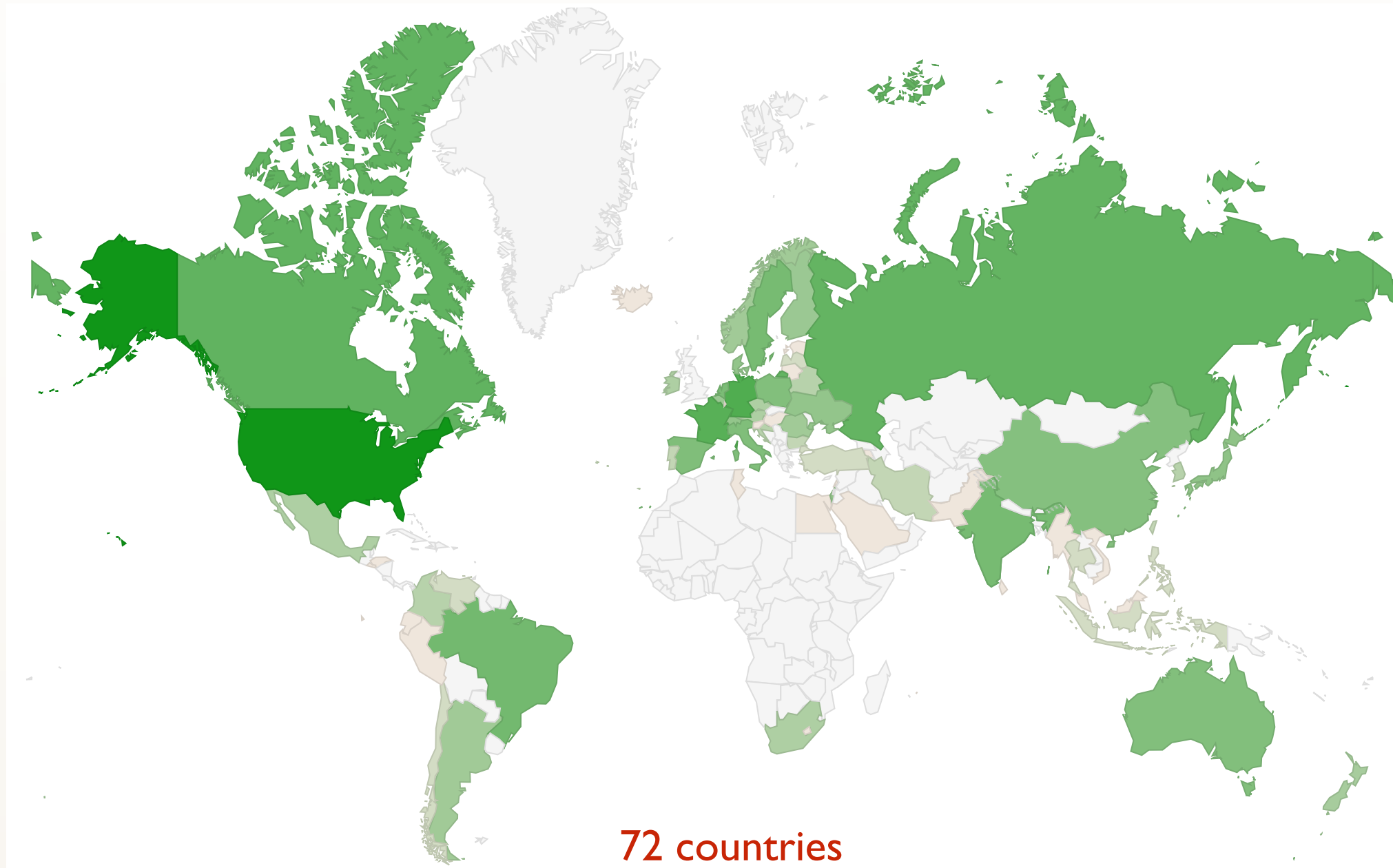
How is diversity perceived to influence collaboration?

SURVEY: GEOGRAPHY (1)



4,500 invitations, 816 responses

F 24%
M 75%

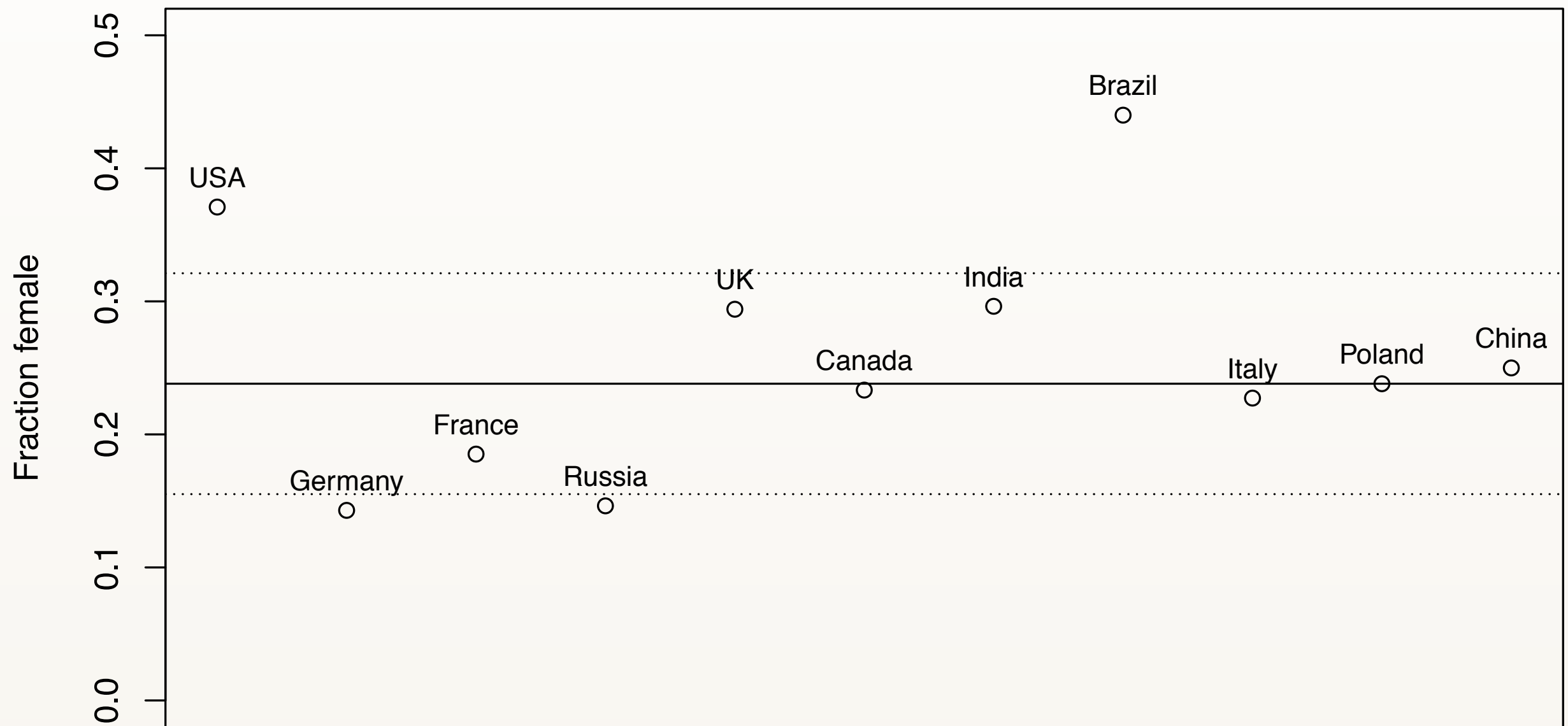


SURVEY: GEOGRAPHY (2)



4,500 invitations, 816 responses

F 24%
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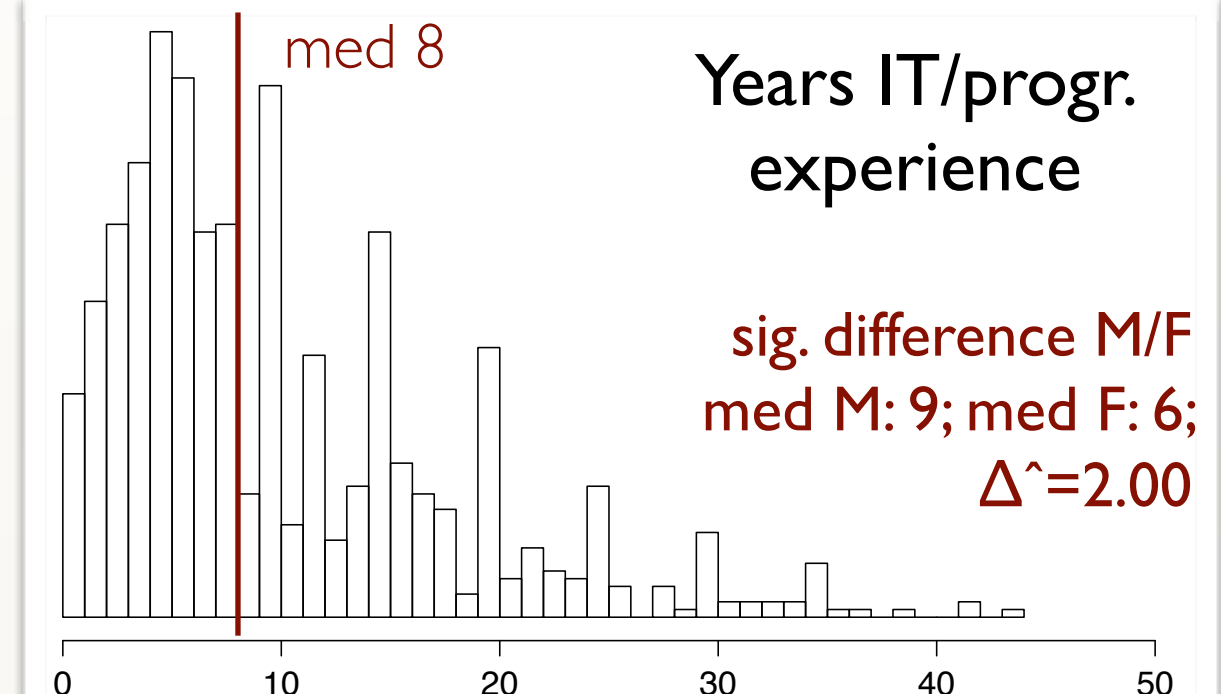
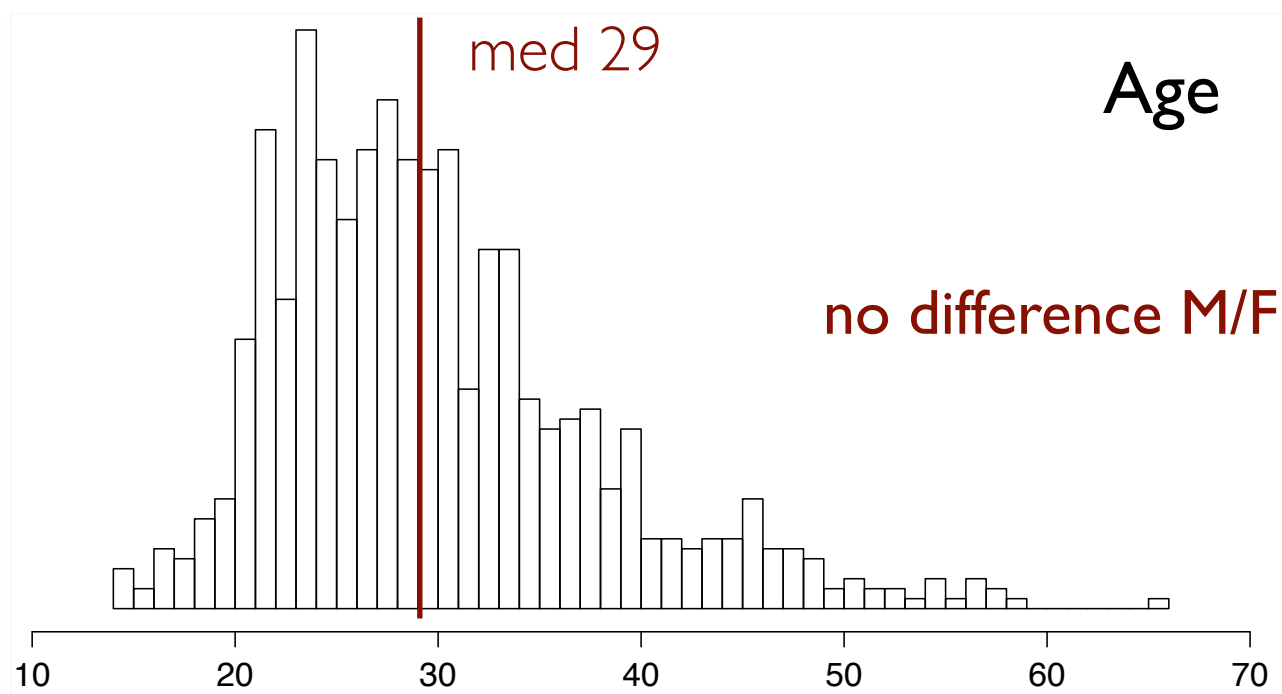


SURVEY: AGE & EXPERIENCE



4,500 invitations, 816 responses

F 24%
M 75%



SURVEY: OCCUPATIONS



4,500 invitations, 816 responses

F 24%
M 75%

Occupation	%
Web developer	59.70
Manager / Team leader	21.50
Student	20.64
Desktop software developer	21.25
Mobile application developer	19.16
IT staff / System administrator	15.48
Academic	13.51
Other	13.14
Database administrator	9.95
Embedded application developer	9.46
I don't work in tech	2.58

SURVEY: OCCUPATIONS + MEN



4,500 invitations, 816 responses

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SURVEY: OCCUPATIONS + WOMEN



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SURVEY: TEAM COMPOSITION



Whom do you consider part of your team?



- The repository owner and others who can push directly
- People who contribute code frequently
- People who work on my particular feature/branch

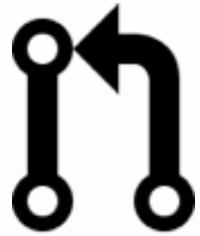


less inclusive

more inclusive

- Everyone who does something in this repository

SURVEY: TEAM COMPOSITION



Whom do you consider part of your team?



- The repository owner and others who can push directly
- People who contribute code frequently
- People who work on my particular feature/branch

▲ less inclusive
▼ more inclusive

#1 (72%)

- Everyone who does something in this repository

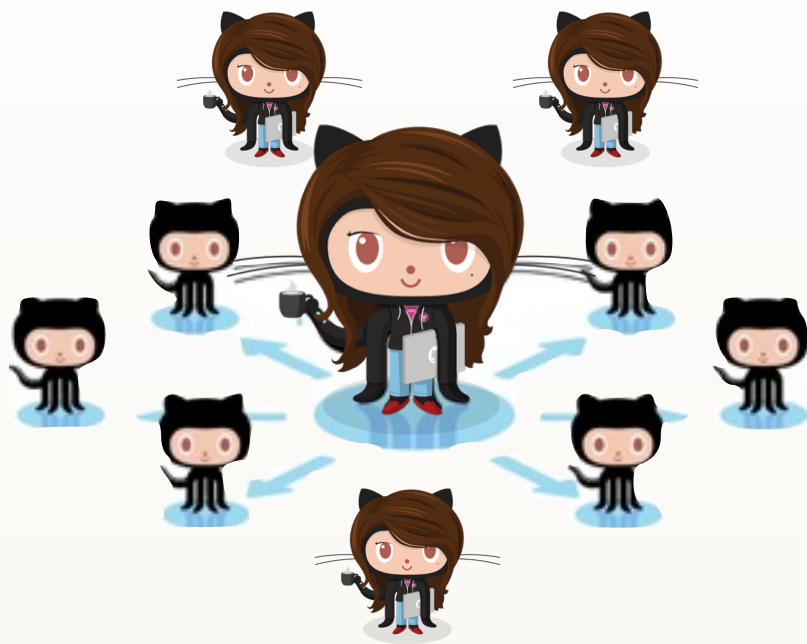
Everyone

SURVEY: SALIENCE OF DEMOGRAPHICS



Which of the following characteristics of your team members are you aware of?

... for (none other / few other / most other) team members



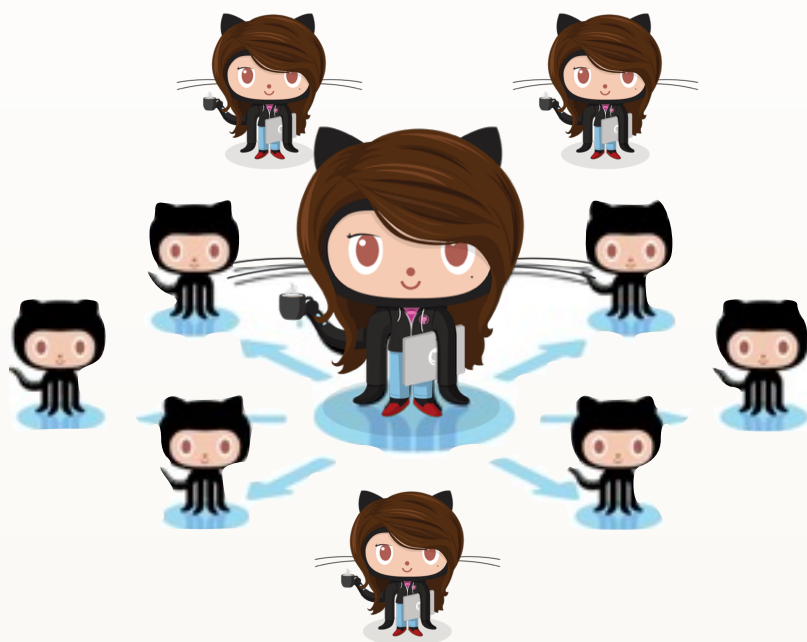
- Programming skills
- Social skills
- Gender
- Ethnicity
- Overall GitHub experience
- Reputation as programmer
- Country of residence
- Personality
- Age
- Educational level
- Real name
- Hobbies
- Employment
- Political views

SURVEY: SALIENCE OF DEMOGRAPHICS



Which of the following characteristics of your team members are you aware of?

... for (none other / few other / most other) team members



<—> Demographics not salient
is OSS [Riordan & Shore]

• Programming skills	74%
• Gender	48%
• Real name	45%
• Social skills	42%
• Country of residence	40%
• Personality	39%
• Reputation as programmer	31%
• Ethnicity	30%
• Employment	30%
• GitHub experience	28%
• Educational level	26%
• Age	23%
• Hobbies	11%
• Political views	4%

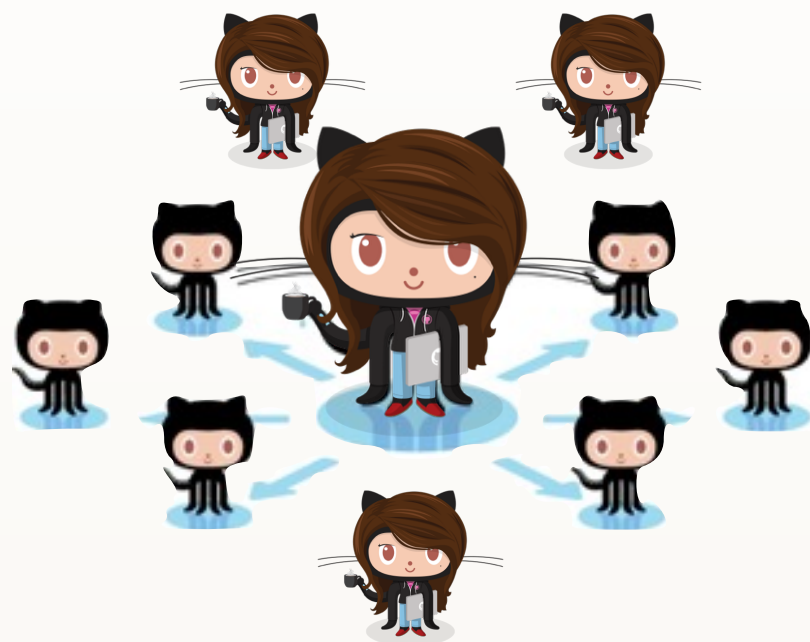
Developers are aware of each other's gender

SURVEY: SALIENCE OF DEMOGRAPHICS + WOMEN



Which of the following characteristics of your team members are you aware of?

... for (none other / few other / most other) team members



- | | |
|----------------------------|-----|
| • Programming skills | 74% |
| • Gender | 48% |
| • Real name | 45% |
| • Social skills | 42% |
| • Country of residence | 40% |
| • Personality | 39% |
| • Reputation as programmer | 31% |
| • Ethnicity | 30% |
| • Employment | 30% |
| • GitHub experience | 28% |
| • Educational level | 26% |
| • Age | 23% |
| • Hobbies | 11% |
| • Political views | 4% |

SURVEY: VIEWS ON DIVERSITY (1)



Experiences working in a diverse team

“code sees no color or gender”

“any demographic identity is irrelevant”

“more about the contributions to the code than the ‘characteristics’ of the person”

Meritocracy; no effects of diversity

SURVEY: VIEWS ON DIVERSITY (2)



Experiences working in a diverse team

“diverse viewpoints often lead to lively discussions and new ideas”

“in general it is always **enriching** to communicate with someone different”

“diversity in the body of folks willing to interact and contribute works to **strengthen the usability** of the library”

Positive effects of diversity

SURVEY: VIEWS ON DIVERSITY (3)



Experiences working in a diverse team

Gender related

“I have used a fake GitHub handle (my normal GitHub handle is my first name, which is a distinctly female name) **so that people would assume I was male**”

“interactions are usually positive too, with occasional sexism, but **nothing more than one encounters in the rest of life**”

“... caused me to **leave a project**”

Negative effects of diversity

APPROACH: MIXED METHODS

Diversity survey

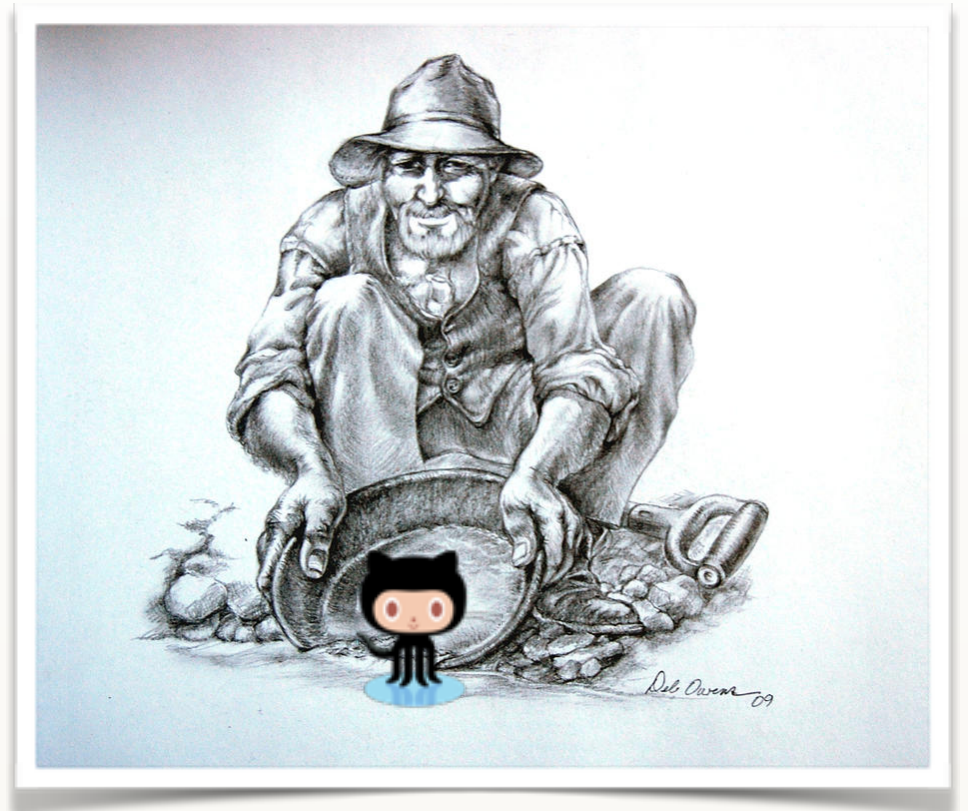
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+



The team is everyone

Gender is surprisingly salient

Positive/negative/no effects of diversity

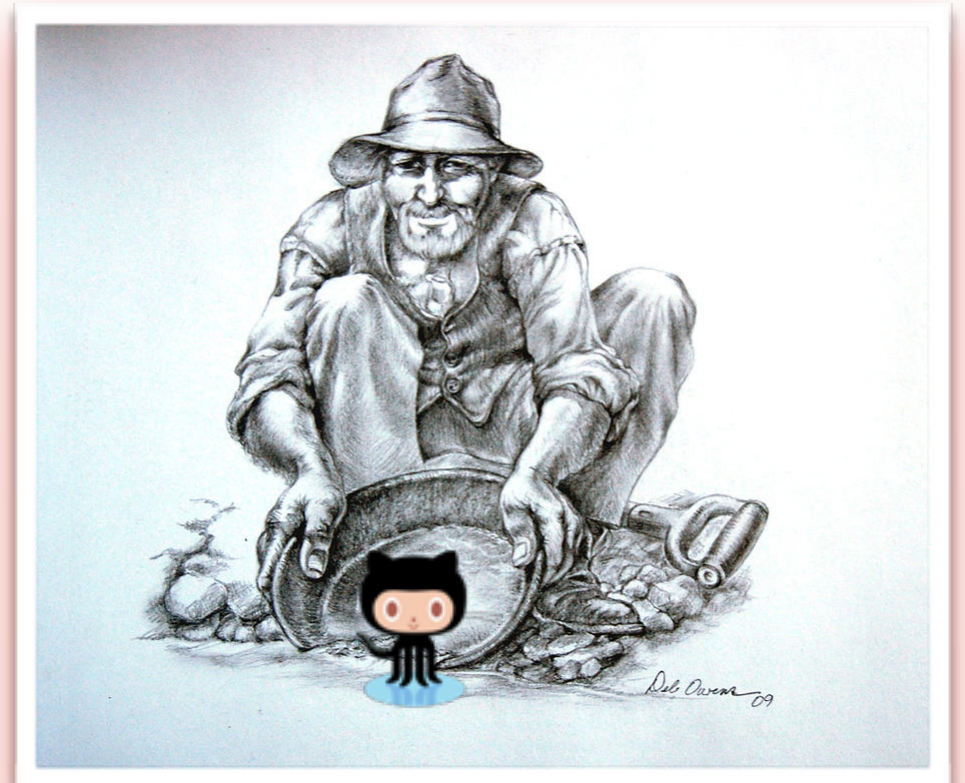
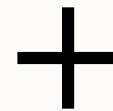
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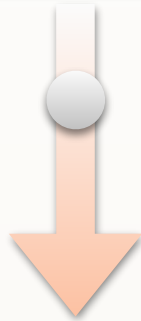
MINING GITHUB

2.6M projects

@ghtorrent Jan 2014 data dump
[Gousios et al]
<http://ghtorrent.org>

MINING GITHUB

2.6M projects



Active projects:

- Jan 1, 2008 - Jan 2, 2014
- ≥ 100 commits
- ≥ 90 days
- ≥ 4 contributors

MINING GITHUB

2.6M projects



Infer genders
(93% precision)

Contributions Repositories Publi...

Popular repositories

- [bvasiles.github.io](#)
My website
- [diversity](#)
A data set for social diversity studies of GitHu...
- [flask_assets_tutorial](#)
Maxime Bouroumeau-Fuseau's tutorial on flas...
- [gntorrent.org](#)
The GHTorrent project website
- [ght_unmasking_aliases](#)

Contributions

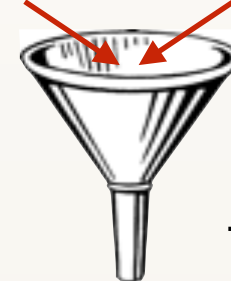
Apr May Jun Jul Aug Sep

Bogdan Vasilescu

University of California
Davis, CA
[http://bvasiles.github.io](#)
Joined on Jul 3, 2012

Bing Maps + Heuristics

Bogdan + USA



Name frequency tables
for 30 countries

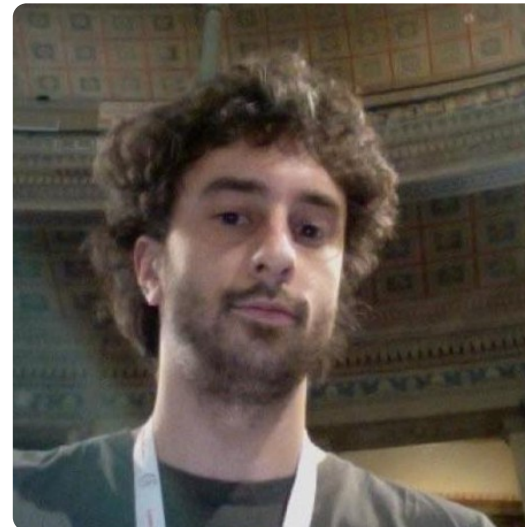
male

MINING GITHUB

2.6M projects



Search GitHub



Andrea Reginato
andreareginato

Lelylan
Milan

Italy



Search GitHub



Andrea Hidalgo
andreah90

Columbus, OH

USA

Location matters!

MINING GITHUB

2.6M projects



Merge aliases



INTUITION:

Laurent Gautier - laurent@cbs.dtu.dk

Laurent Gautier - s010592@student.dtu.dk

Laurent - lgautier@gmail.com

- lgautier@altern.org

MINING GITHUB

2.6M projects



Merge aliases



INTUITION:

- first name

Laurent Gautier - laurent@cbs.dtu.dk

Laurent Gautier - s010592@student.dtu.dk

Laurent - lgautier@gmail.com

- lgautier@altern.org

MINING GITHUB

2.6M projects



Merge aliases



INTUITION:

- first name
- email prefix

Laurent Gautier - laurent@cbs.dtu.dk

Laurent Gautier - s010592@student.dtu.dk

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- lgautier@altern.org

MINING GITHUB

2.6M projects



Merge aliases



INTUITION:

- first name
- email prefix
- first initial + last name
- ...

Laurent Gautier - laurent@cbs.dtu.dk

Laurent **Gautier** - s010592@student.dtu.dk

Laurent - lgautier@gmail.com

- lgautier@altern.org

MINING GITHUB

2.6M projects

Compute
variables



Response

Productivity
(#commits/quarter)



Turnover (fraction
team new w.r.t.
prev. quarter)

MINING GITHUB

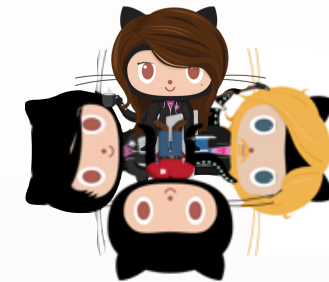
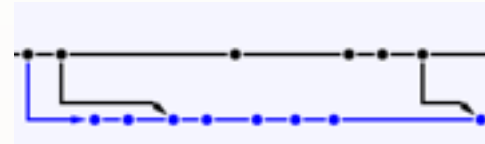
2.6M projects

Compute
variables



Response

Productivity
(#commits/quarter)



Turnover (fraction
team new w.r.t.
prev. quarter)

Independent



Gender diversity
(Blau index)



Tenure diversity
(coeff. variation)

- project
- overall coding

MINING GITHUB

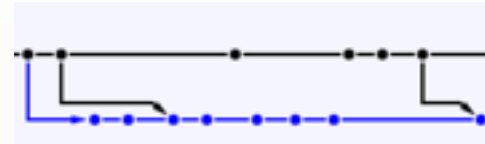
2.6M projects

Compute
variables



Response

Productivity
(#commits/quarter)



Turnover (fraction
team new w.r.t.
prev. quarter)

Independent



Gender diversity
(Blau index)



Tenure diversity
(coeff. variation)

- project
- overall coding



project B timeline



project A timeline

MINING GITHUB

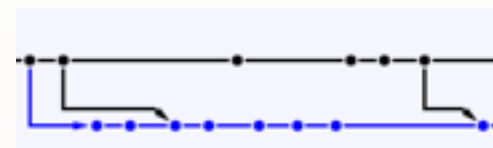
2.6M projects

Compute
variables



Response

Productivity
(#commits/quarter)



Turnover (fraction
team new w.r.t.
prev. quarter)

Independent



Gender diversity
(Blau index)



Tenure diversity
(coeff. variation)

- project
- overall coding

Controls

Human
resources

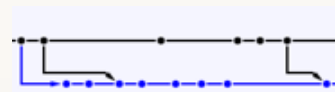


Team size



Experience

Project
size



Total commits

Evolution of GitHub
& time passing



Project age



Time

Popularity /
Distributed
development



Comments



Forks

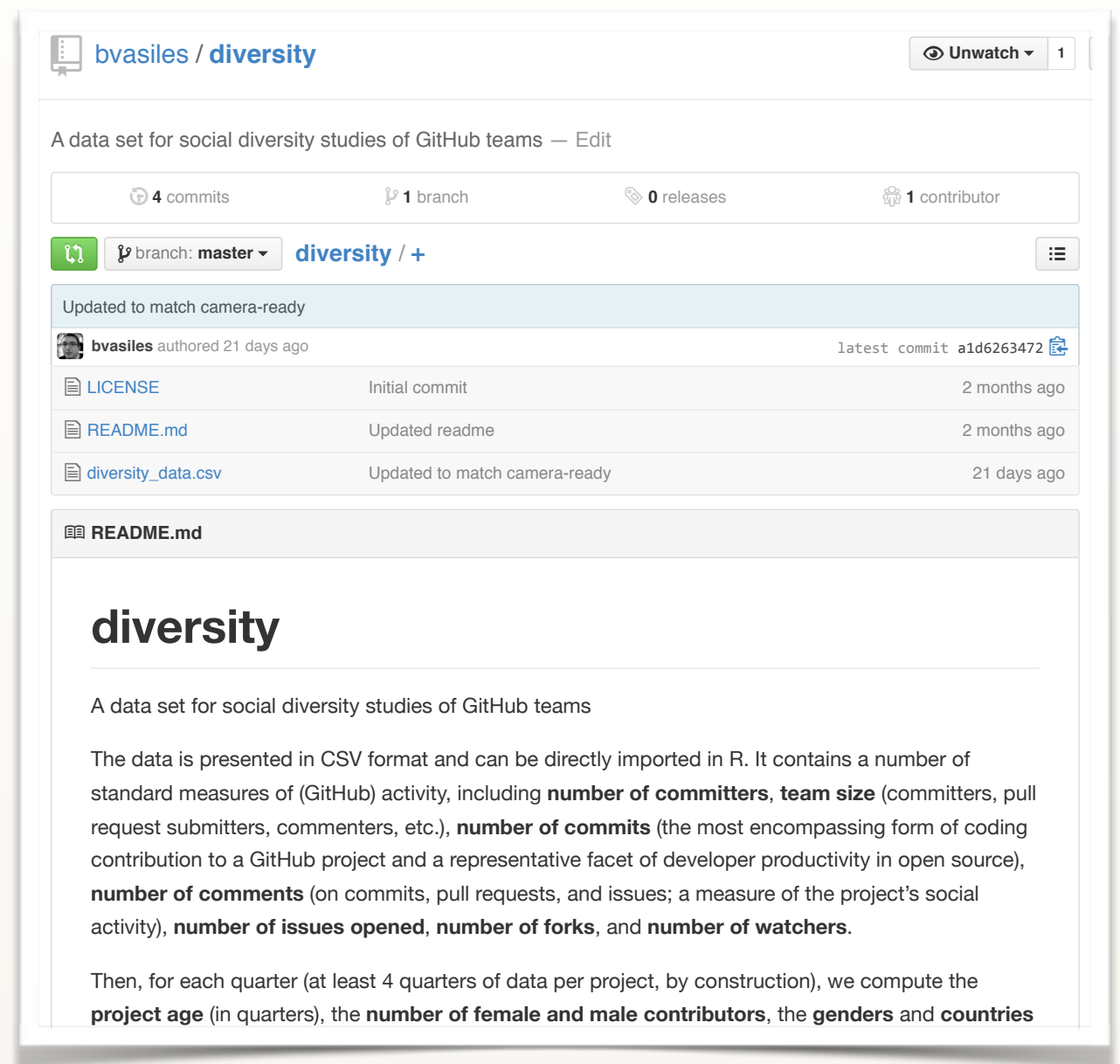
MINING GITHUB

Mining github SOCIAL CODING

2.6M projects



23K projects
(671K devs, 10.7M commits)



The screenshot shows the GitHub repository page for 'bvasiles / diversity'. At the top, it says 'bvasiles / diversity' with an 'Unwatch' button and a count of '1'. Below this, it states 'A data set for social diversity studies of GitHub teams — Edit'. The repository statistics show '4 commits', '1 branch', '0 releases', and '1 contributor'. The current branch is 'master'. A commit history table is displayed, showing the latest commit 'a1d6263472' by 'bvasiles' 21 days ago. The table lists files: 'LICENSE' (Initial commit, 2 months ago), 'README.md' (Updated readme, 2 months ago), and 'diversity_data.csv' (Updated to match camera-ready, 21 days ago). Below the table, the 'README.md' content is shown, starting with the title 'diversity' and a description: 'A data set for social diversity studies of GitHub teams'. The README further explains that the data is in CSV format, can be imported in R, and contains various measures of GitHub activity like number of committers, team size, number of commits, number of comments, number of issues opened, number of forks, and number of watchers. It also mentions the computation of project age, number of female and male contributors, genders, and countries.

[Vasilescu et al, MSR'15]

- http://bvasiles.github.io/papers/msr_data15.pdf
- <https://github.com/bvasiles/diversity>

MULTIVARIATE REGRESSION

```
productivity ~ #team + #forks + ... + prj_age  
              + gender_diversity + tenure_diversity
```


MULTIVARIATE REGRESSION

productivity \sim **#team** + **#forks** + ... + **prj_age**
+ gender_diversity + tenure_diversity

Project	Created on	Project age	Total #commits	#Forks	Time	#Commits	#Comments	Team size	Gender diversity	Commit tenure diversity	Turnover
A	2011-02-15	12	557	51	Q2	47	26	9	0.25	0.47	0.67
					Q5	19	12	10	0.00	0.93	0.75
					Q6	7	13	12	0.25	0.54	0.67
					Q7	56	53	20	0.00	0.56	0.87
					...						
B	2010-09-21	11	2075	578	Q4	71	169	83	0.03	0.66	0.87
					Q5	116	219	93	0.05	0.73	0.56
					Q6	186	367	119	0.06	0.80	0.86
					Q7	129	453	114	0.08	0.85	0.82
					...						

MULTIVARIATE REGRESSION

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productivity ~ #team + #forks + ... + prj_age  
+ gender_diversity + tenure_diversity  
+ (1 | prj_id)
```

Project	Created on	Project age	Total #commits	#Forks	Time	#Commits	#Comments	Team size	Gender diversity	Commit tenure diversity	Turnover
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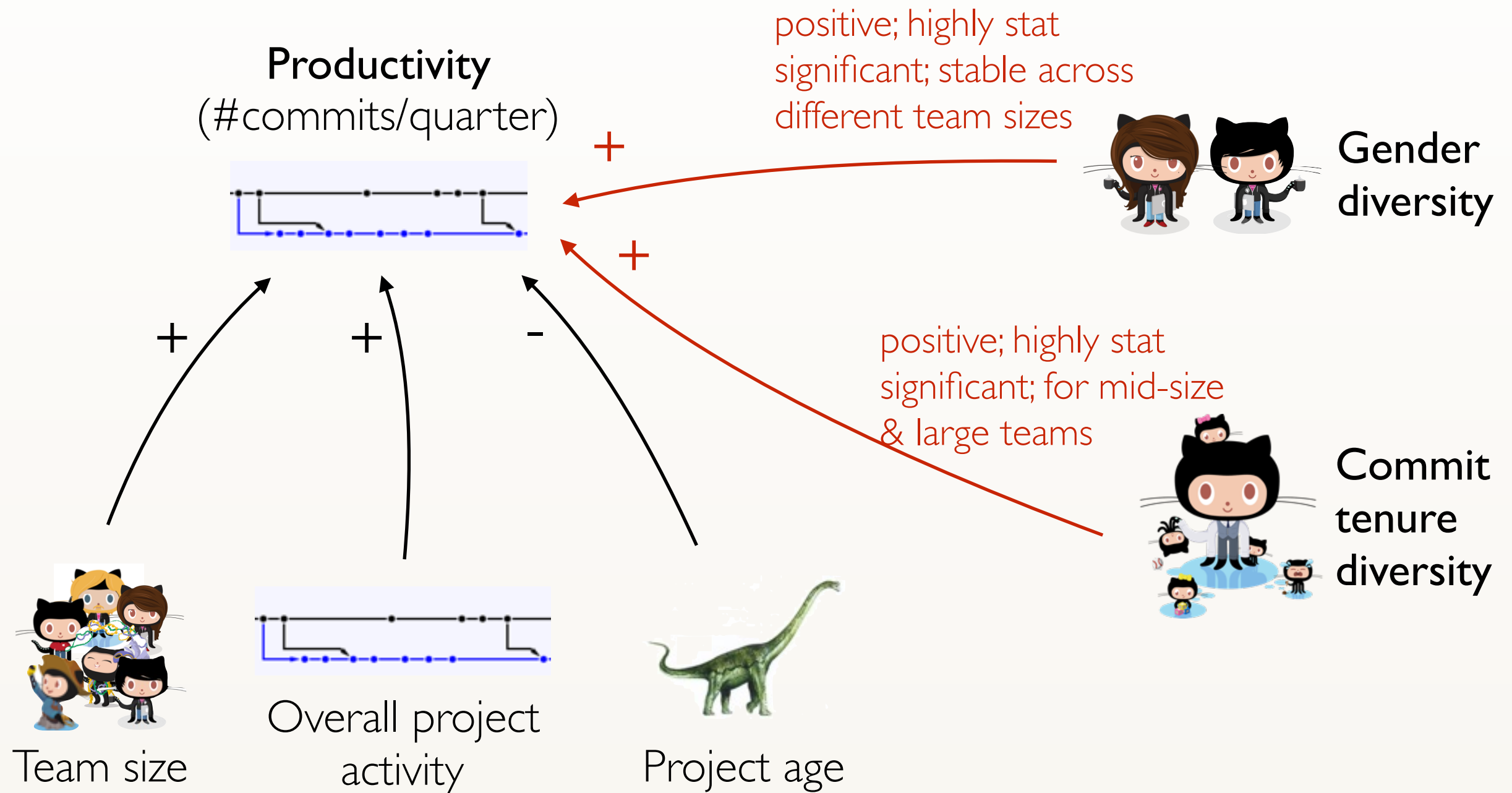
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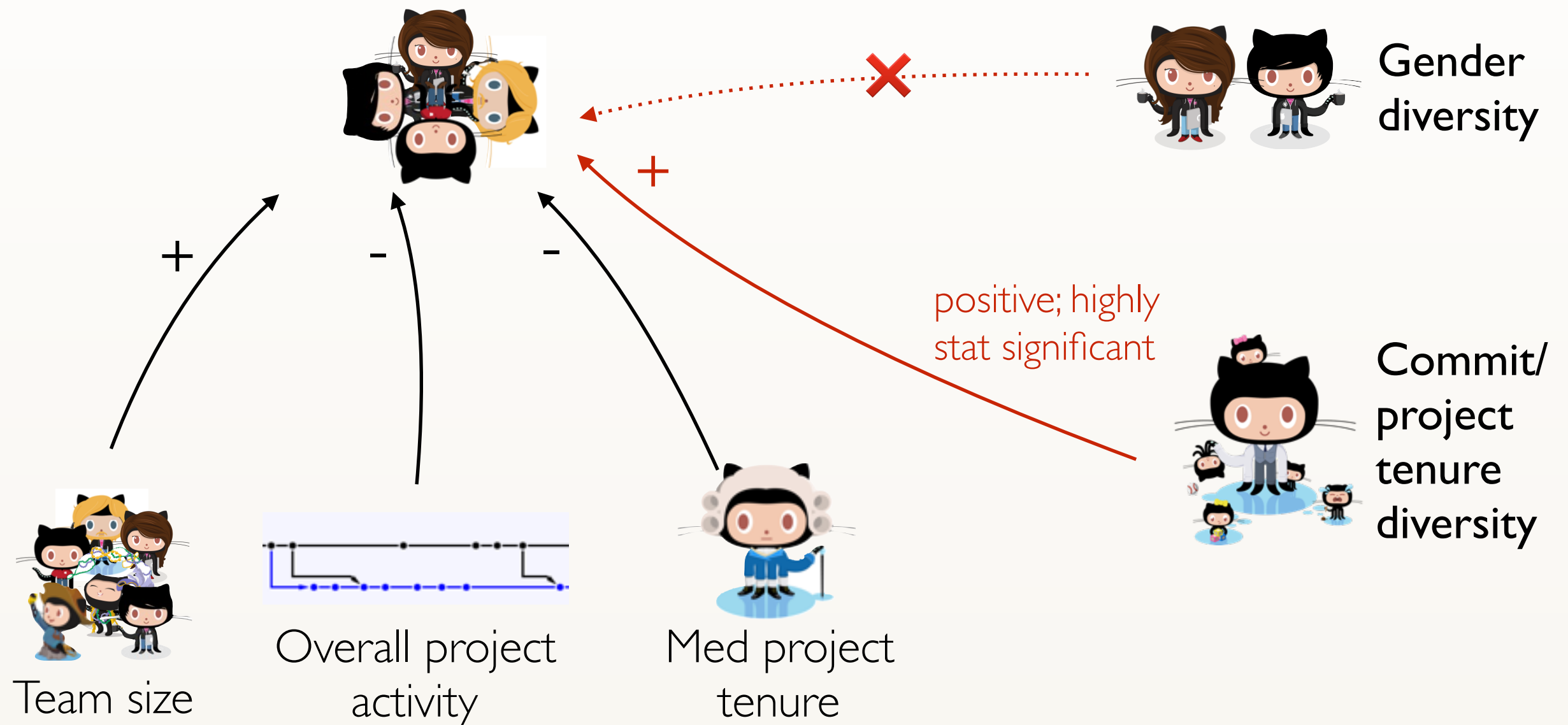
INCREASED DIVERSITY CORRELATES TO HIGHER PRODUCTIVITY



But small effects!

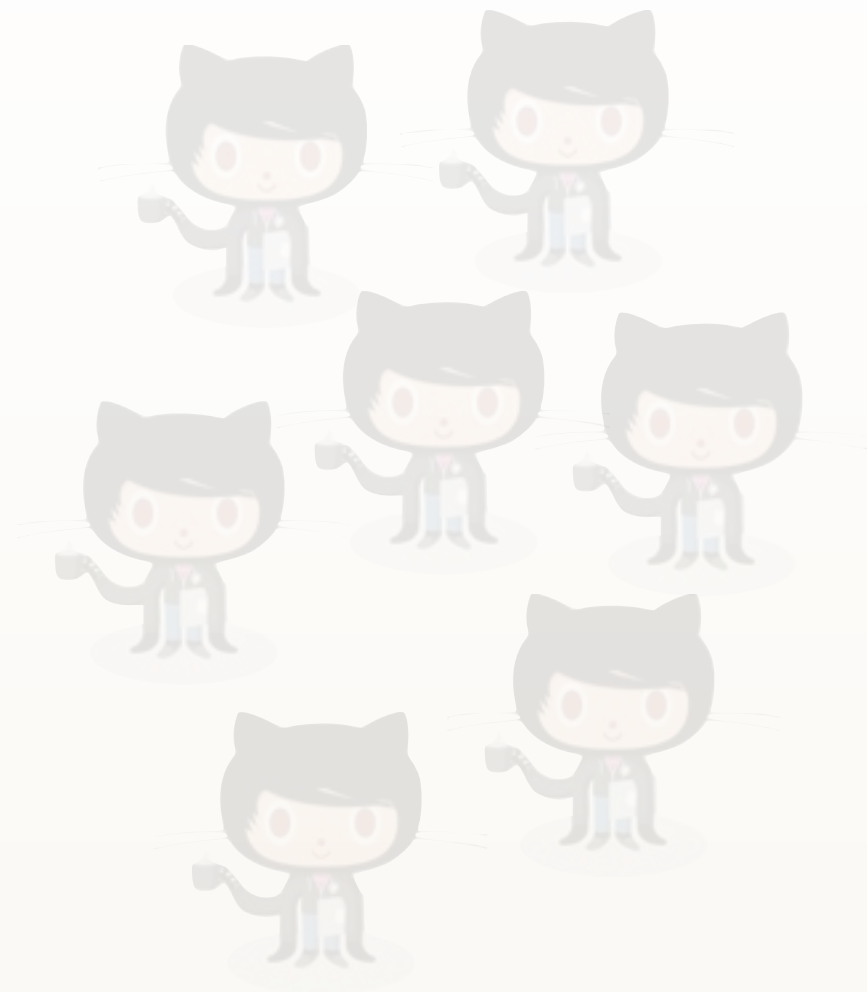
NO EFFECT OF GENDER DIVERSITY ON TURNOVER

Turnover (fraction team new w.r.t. prev. quarter)



But small effects!

Which is more effective?



Other confounds held fixed, **higher team diversity (gender & tenure)** is associated with **increased code production**,

HOW CAN WE IMPROVE THINGS?



10.9%



18%



17%



stackoverflow

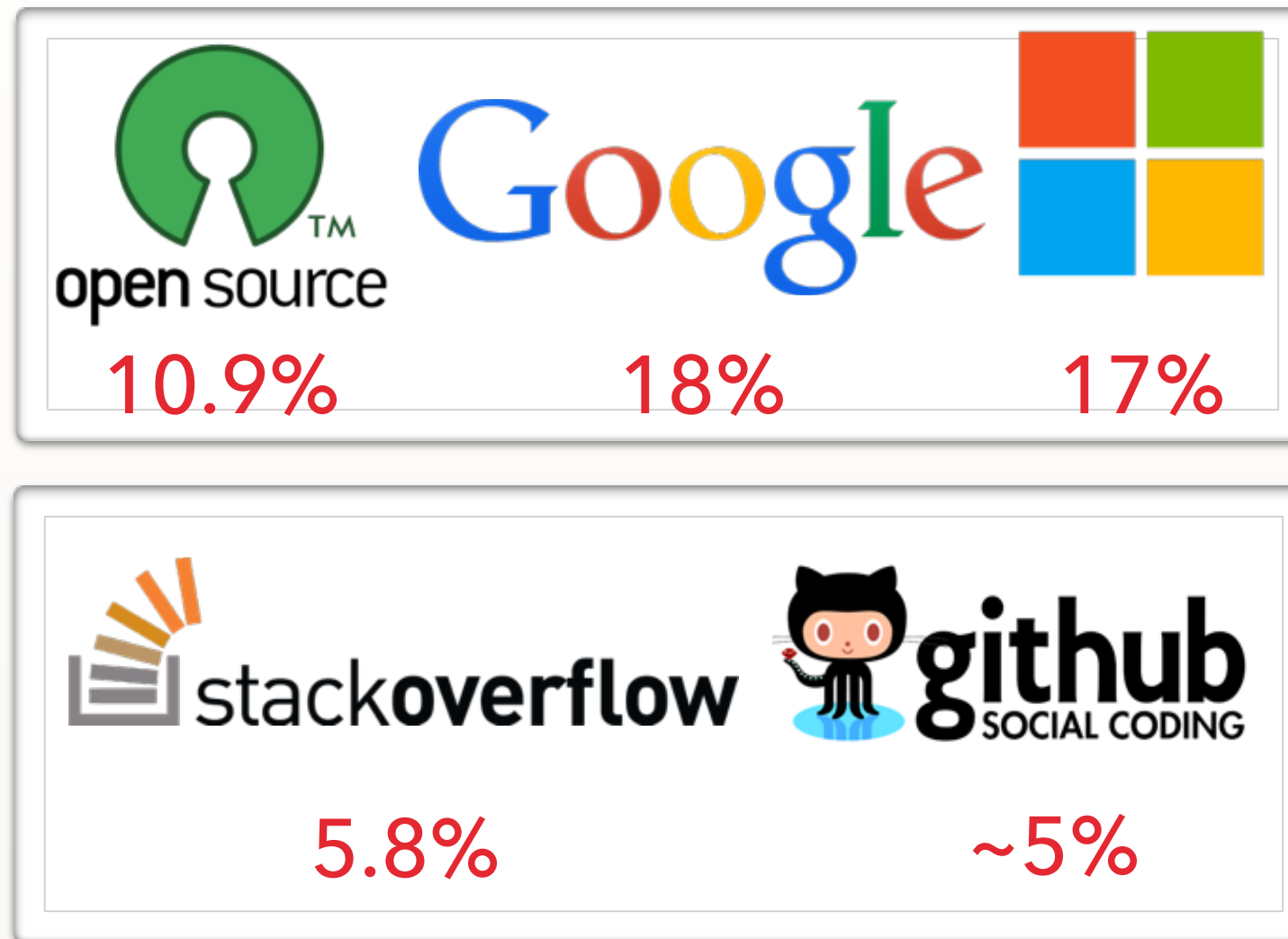
5.8%



github
SOCIAL CODING

~5%

HOW CAN WE IMPROVE THINGS?



Community culture + Platform design

GENDER BIASES

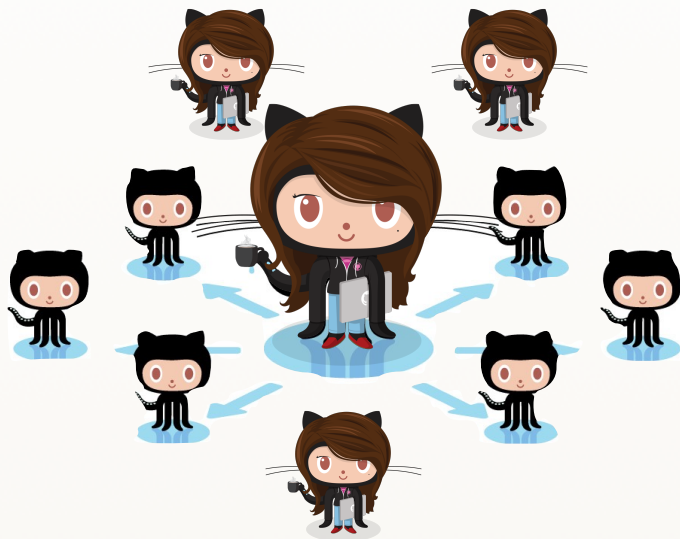
SURVEY: SALIENCE OF DEMOGRAPHICS



Which of the following characteristics of your team members are you aware of?



... for (none other / few other / most other) team members

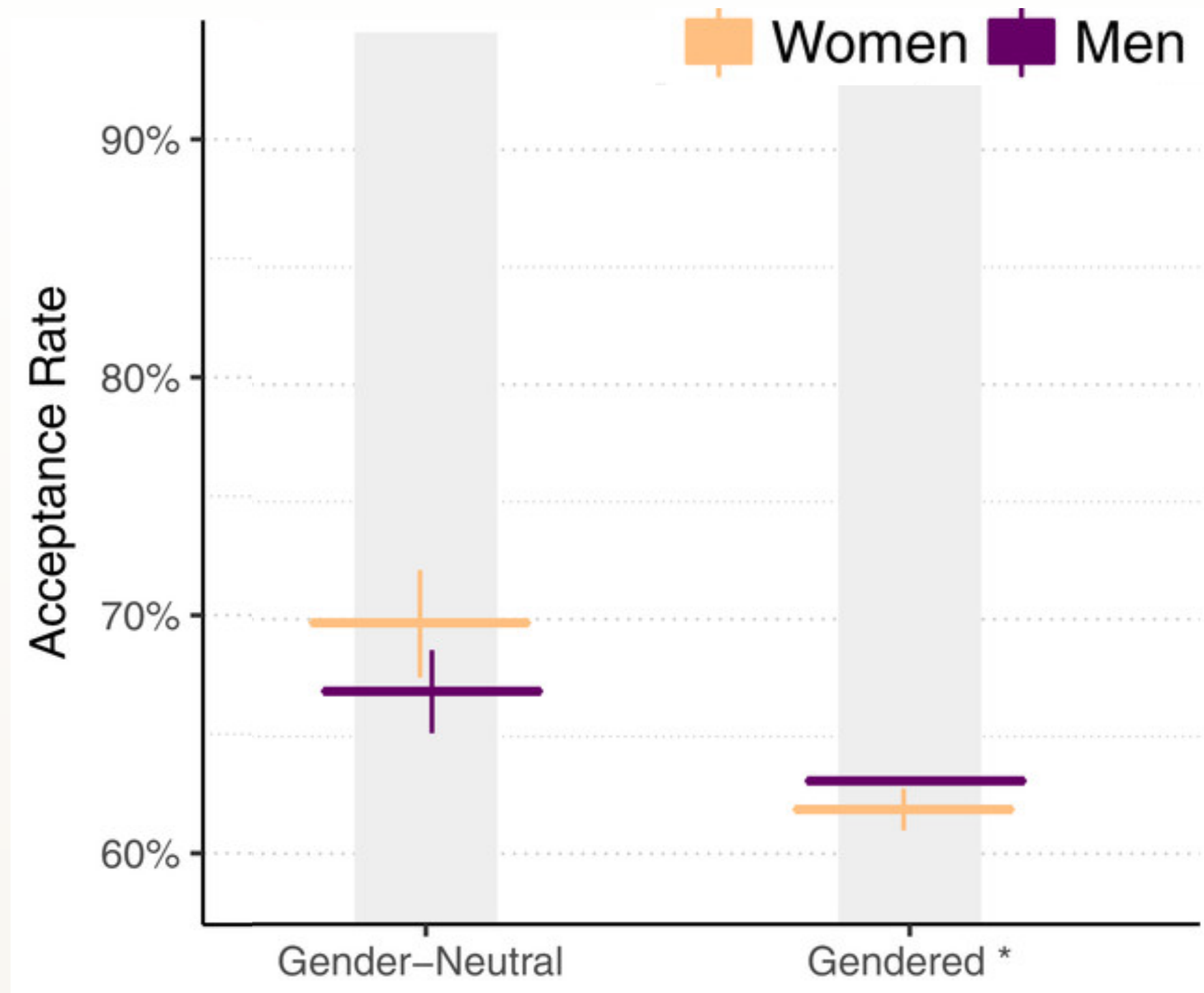


<—> Demographics not salient
is OSS [Riordan & Shore]

• Programming skills	74%
• Gender	48%
• Real name	45%
• Social skills	42%
• Country of residence	40%
• Personality	39%
• Reputation as programmer	31%
• Ethnicity	30%
• Employment	30%
• GitHub experience	28%
• Educational level	26%
• Age	23%
• Hobbies	11%
• Political views	4%

Developers are aware of each other's gender

GENDER BIASES – PULL REQUEST ACCEPTANCE



GAMIFICATION – STACK OVERFLOW



Stack Overflow

Q&A for professional and enthusiast programmers
(7,176,478 total users)

Type to find users:



Jon Skeet

554 6962 7774

member for: 8 years, 8 months



Darin Dimitrov

179 2694 2500

member for: 8 years, 7 months



BalusC

237 2698 2871

member for: 7 years, 9 months

Why is sub



5133



1238

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#1

all time rank

948,505

all time reputation

#2

all time rank

734,602

all time reputation

#3

all time rank

728,504

all time reputation

GAMIFICATION - GITHUB

https://github.com/ashleygwilliams



ashley williams
ashleygwilliams

npm, inc
 ridgewood, queens, NYC

 <http://ashleygwilliams.github.io/>
 Joined on Oct 31, 2011

776

Followers

38

Starred

15

Following

Organizations



Contributions

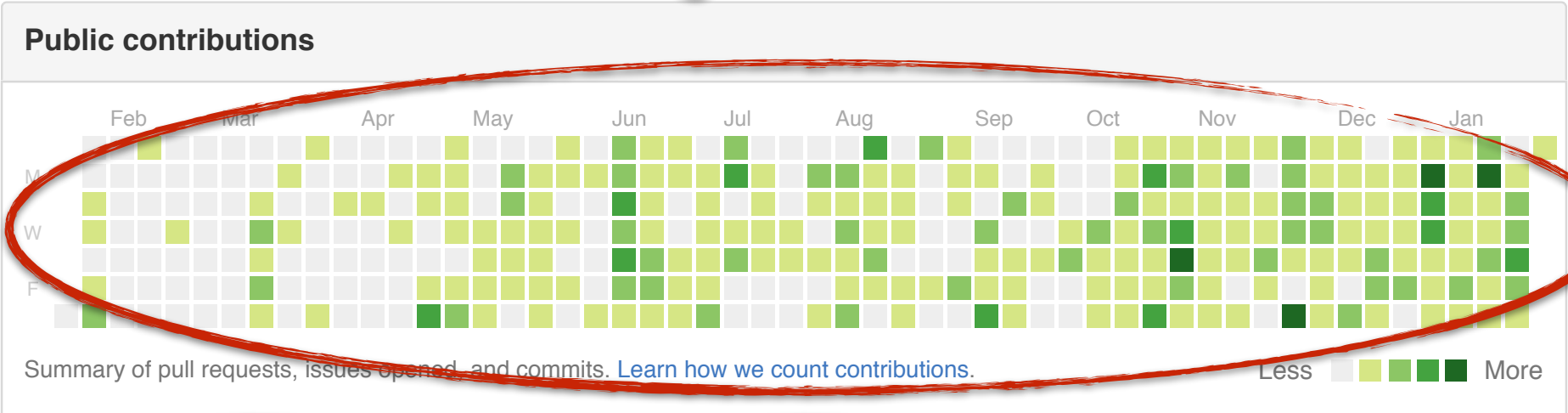
Repositories

Public activity

Follow

Popular repositories		
	breakfast-repo	208 ★
a collection of videos, recordings, and podcast...		
	x86-kernel	48 ★
a simple x86 kernel, extended with Rust		
	ashleygwilliams.github.io	37 ★
hi, i'm ashley. nice to meet you.		
	jsconf-2015-deck	32 ★
deck for jsconf2015 talk, "if you wish to learn e...		
	ratpack	32 ★
sinatra boilerplate using activerecord, sqlite, a...		

Repositories contributed to		
	npm/docs	44 ★
The place where all the npm docs live.		
	mozilla/publish.webmaker.org	2 ★
The teach.org publishing service for goggles a...		
	npm/marky-markdown	104 ★
npm's markdown parser		
	artisan-tattoo/assistant-frontend	5 ★
ember client for assistant-API		
	npm/npm-camp	1 ★
a community conference for all things npm		



Contributions in the last year

1,886 total

Jan 24, 2015 – Jan 24, 2016

Longest streak

37 days


October 7 – November 12

Current streak

7 days




January 18 – January 24

INCLUSIVENESS – GAMIFICATION?



Stack Overflow
Q&A for professional and enthusiast programmers
(7,176,478 total users)

Type to find users:

	Jon Skeet 554 6962 7774 member for: 8 years, 8 months	#1 all time rank	948,505 all time reputation
	Darin Dimitrov 179 2694 2500 member for: 8 years, 7 months	#2 all time rank	734,602 all time reputation
	BalusC 237 2698 2871 member for: 7 years, 9 months	#3 all time rank	728,504 all time reputation

Why is sub


▲ If I run the compares

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ashley williams
ashleygwilliams

npm, inc
ridgewood, queens, NYC

<http://ashleygwilliams.github.io/>
Joined on Oct 31, 2011






776 Followers 38 Starred 15 Following

Organizations








Contributions **Repositories** **Public activity** [Follow](#)

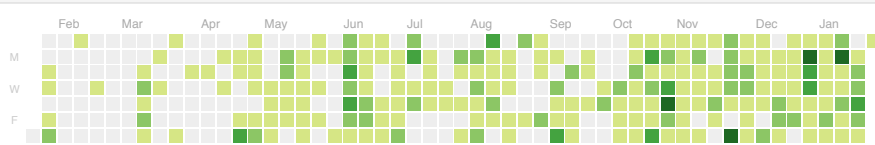
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	npm/npm-camp a community conference for all things npm	1 ★

Public contributions



Summary of pull requests, issues opened, and commits. [Learn how we count contributions.](#) Less More

Contributions in the last year Jan 24, 2015 – Jan 24, 2016 1,886 total	Longest streak October 7 – November 12 37 days	Current streak January 18 – January 24 7 days
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Women disengage quicker.

Gender, representation and online participation: A quantitative study.

Vasilescu, B., Capiluppi, A., and Serebrenik, A. *Interacting with Computers* 2014

Women shy away from competition and men embrace it.

Muriel Niederle and Lise Vesterlund. **Do women shy away from competition? Do men compete too much?** *The Quarterly Journal of Economics*, 122(3):1067–1101, 2007.

ACKNOWLEDGEMENTS



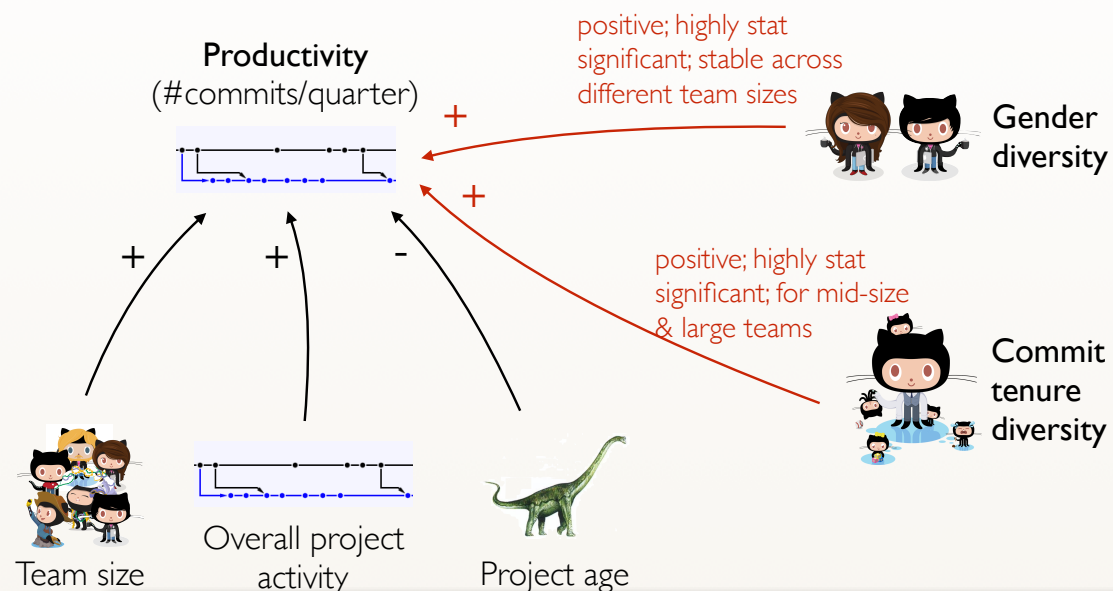
- Baishakhi Ray
- Alexander Serebrenik
- Vladimir Filkov
- Prem Devanbu
- Daryl Posnett
- Mark van den Brand



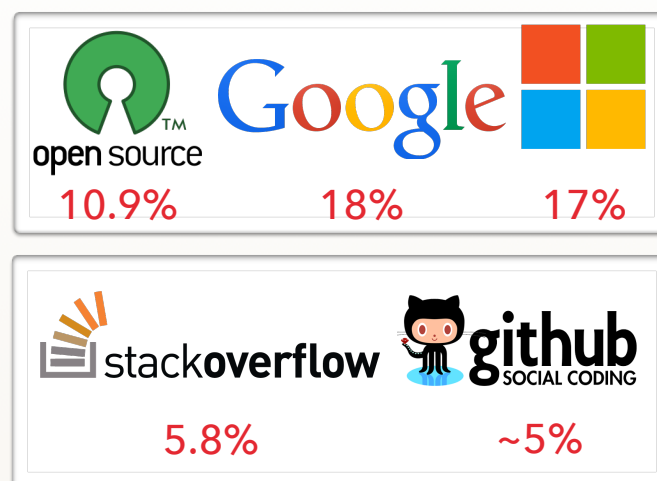
GENDER DIVERSITY IN ONLINE SOFTWARE TEAMS

#Istand
withCEU
#aCEUval
vagyok

INCREASED DIVERSITY CORRELATES TO HIGHER PRODUCTIVITY



HOW CAN WE IMPROVE THINGS?



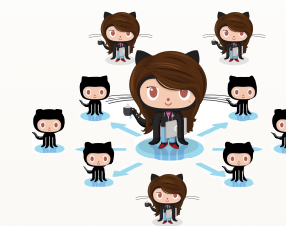
Community culture + Platform design

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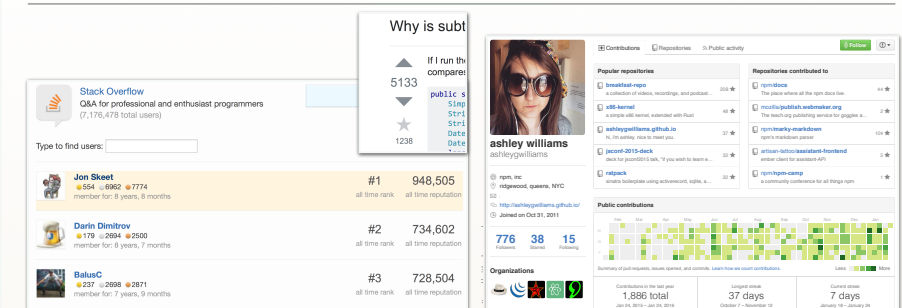


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