

Adding Sparkle to Social Coding: An Empirical Study of Repository Badges in the npm Ecosystem

Asher Trockman, Shurui Zhou, Christian Kästner, Bogdan Vasilescu ICSE '18, May 27-June 3, 2018, Gothenburg, Sweden





Carnegie Mellon University

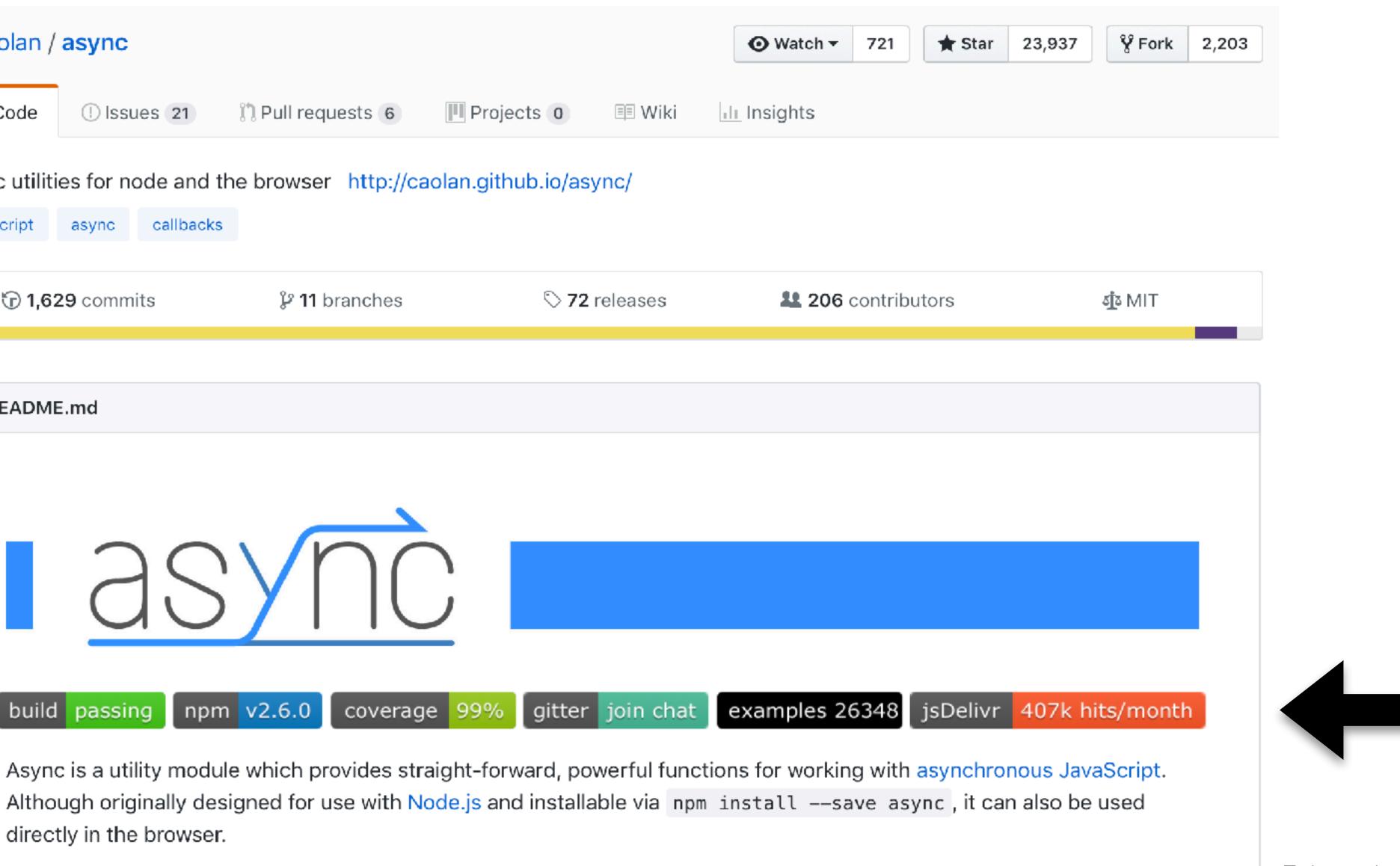


GitHub Repository Badges

📮 caolan /	async				
<> Code	() Issues 21	🗓 Pull requ	ests 6	💷 Proje	cts
Async utiliti javascript	ies for node and t async callbacks	he browser	http://cad	olan.gith	ub.
Ē 1,6	29 commits	ຼິມ 11 bi	ranches		(
	E.md				
	<u>as</u>	Yr	\mathcal{D}		
build	passing npm	v2.6.0	coverage	99%	q
	c is a utility modu				var

directly in the browser.





Enlarged to show detail.



Key features: Transparency & signaling

Code Issues 578	רסjects ס דו Wiki 🗊 און Projects און 🗊 און 🗊 און און און און דענענענענענענענענענענענענענענענענענענענ		★ Star 18,38	4 ¥ Fork	2,196			Use	۲G	
📤 Simplified HTTP request clie	ent.							030		
T 2,199 commits	🖗 17 branches 🔊 134 releases	270 contributor	's z	∱≊ Apache-2	0	Contributions	E Repositories	う Public activity	,	ម <mark>្</mark> មិ Follow
Branch: master - New pull reque	st	Create new file Upload fi	les Find file	Clone or do	wnload 🔻	Popular reposito	ries		Repositories co	ntributed to
mikeal committed on Sep 27, 2017	7 2.83.1		Latest commit 25	3c5e5 on Sep	27, 2017	breakfast-rep a collection of vice	0 leos, recordings, and po	208 ★	npm/docs The place where	all the npm docs live.
🖿 .github	small change to template wording			ay	ear ago	📮 x86-kernel		48 ★		h.webmaker.org
examples	Adds example for Tor proxy			2 ye	ars ago	a simple x86 keri	nel, extended with Rust		The teach.org p	Iblishing service for goggles a
🖿 lib	refactor(lint): replace eslint with standard (#25)	79)		11 mor	ths ago	hi, i'm ashley. nic	_	37 ★	npm/ marky-m	
in tests	lint fix, PR from pre-standard was merged with	passing tests		10 mor	ths ago	jsconf-2015-d	eck		artisan-tattoo/	assistant-frontend
.gitignore	Updating deps.			5 mor	ths ago		15 talk, "if you wish to le	32 ★	ember client for	
.travis.yml	Add Node.js v8 to Travis CI			7 mor	ths ago	📮 ratpack		32 ★	npm/ npm-ca	
CHANGELOG.md	Update changelog			11 mor	ths ago	sinatra boilerplat	e using activerecord, sq	lite, a	a community cor	nference for all things npm
	Update contributing guidelines			2 ye	ars ago	Public contributi	ons			
	Adding license information.			7 ye	ars ago	Feb Mar		lus Iul	Aug	Oct Nov Dec Jan
	Projects		776 Followers Organizati	38 Starred	15 Following	M	Apr May	ommits. Learn how we c	Aug Sep	
REDEL			ب ال		5	1,880	in the last year <mark>5 t0tal</mark> – Jan 24, 2016	37	est streak days - November 12	Current streak 7 days January 18 – January 24









Key features: Transparency & signaling

⊑ request / request				⊙ Watch -	417 \star S	Star 18
↔ Code ① Issues 578 ① F	Pull requests 52	III Projects 0	🗏 Wiki	Insights		
📤 Simplified HTTP request client.						
7 2,199 commits	🖗 17 branches	© 134 r	eleases	\$<u>8</u> 270 c	ontributors	
Branch: master - New pull request				Create new file	Upload files	Find fil
mikeal committed on Sep 27, 2017 2.8	3.1				Late	st comm
🖬 .github	small change to te	mplate wording				
examples	Adds example for	Tor proxy				
🖬 lib	refactor(lint): repla	ace eslint with star	ndard (#2579))		
tests	lint fix, PR from pr	e-standard was m	erged with p	assing tests		
.gitignore	Updating deps.					
.travis.yml	Add Node.js v8 to	Travis Cl				
CHANGELOG.md	Update changelog	J				
	Update contributir	ng guidelines				
	Adding license info	ormation.				

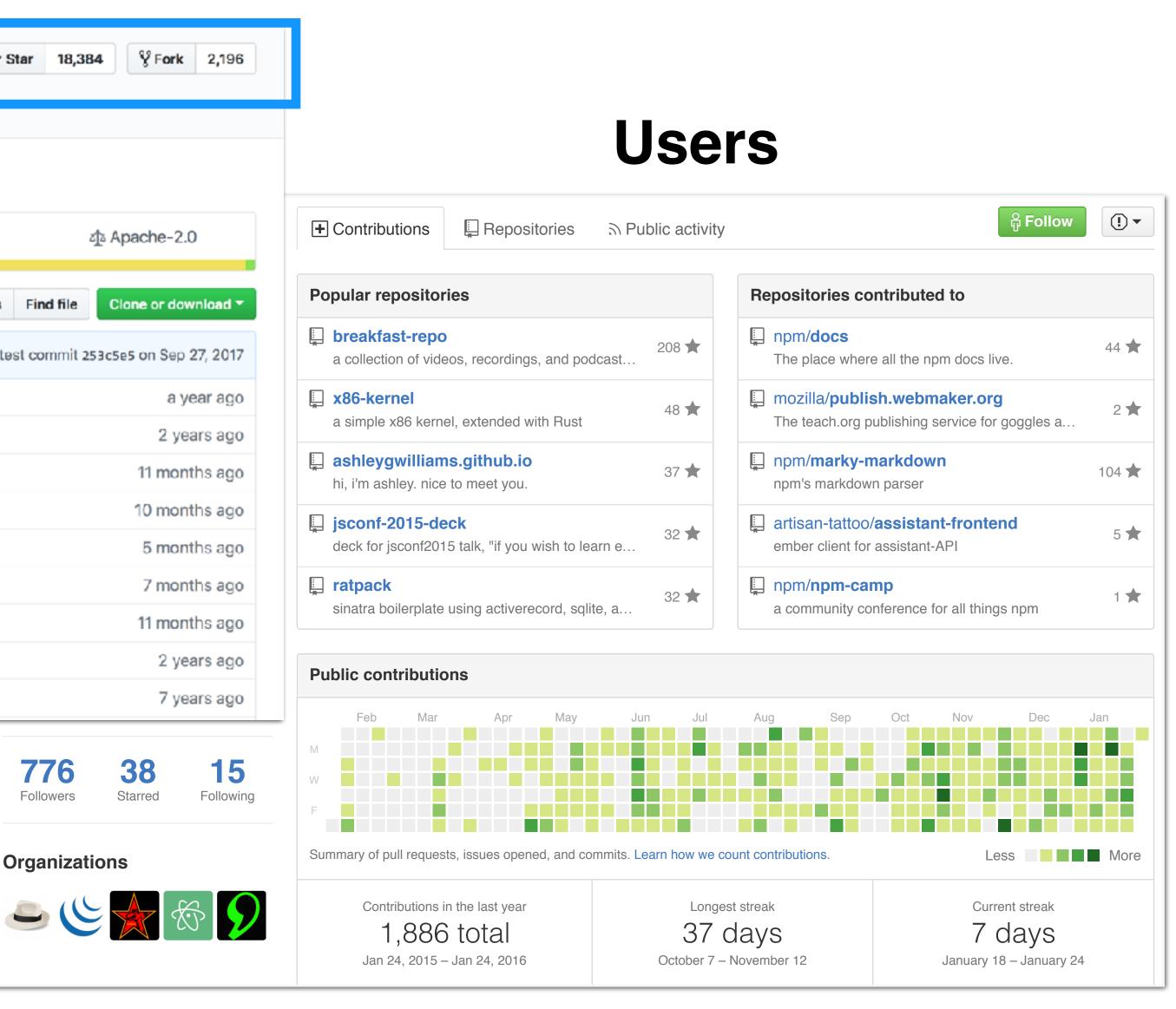
Projects



Organizations







Key features: Transparency & signaling

Code Issues 578	11 Pull requests 52 III Projects 0 III W	o Watch - 417 iki III Insights	★ Star 18,384	¥ Fork 2,196					
A Simplified HTTP request cli	ent.						Use	rs	
7 2,199 commits	₽ 17 branches © 134 releases	270 contributo	rs Ճুձ	Apache-2.0	Contributions	E Repositories	A Public activity	,	မှို Follow
Branch: master - New pull reque	est	Create new file Upload	files Find file	Clone or download -	Popular reposito	ories		Repositories co	ntributed to
is mikeal committed on Sep 27, 201	7 2.83.1		Latest commit 253	:5e5 on Sep 27, 2017	breakfast-rep a collection of vie	o deos, recordings, and p	208 ★	npm/docs	e all the npm docs live.
🖬 .github	small change to template wording			a year ago	📮 x86-kernel		48 ★	-	sh.webmaker.org
examples	Adds example for Tor proxy			2 years ago	a simple x86 ker	nel, extended with Rus	t		ublishing service for goggles a
🖿 lib	refactor(lint): replace eslint with standard (#	2579)		11 months ago	hi, i'm ashley. nic	-	37 ★	npm/ marky-n npm's markdow	1
tests	lint fix, PR from pre-standard was merged w	ith passing tests		10 months ago	jsconf-2015-c	leck		artisan-tattoo/	assistant-frontend
.gitignore	Updating deps.			5 months ago		015 talk, "if you wish to	32 ★	ember client for	
.travis.yml	Add Node.js v8 to Travis CI			7 months ago	Tatpack			npm/ npm-ca	
CHANGELOG.md	Update changelog			11 months ago	sinatra boilerplat	e using activerecord, s	qlite, a	a community co	nference for all things npm
	Update contributing guidelines			2 years ago	Public contribut	ions			
	Adding license information.			7 years ago	Feb Ma		.lun .lul	Aug Sep	Oct Nov Dec Jan
	Projects		776 Followers	38 15 Starred Following	F				
			Organizatio	ns	Summary of pull reque	ests, issues opened, and	commits. Learn how we c	ount contributions.	Less
R 🗐 D E L					.,	s in the last year 6 t0tal 5 – Jan 24, 2016	37	est streak days - November 12	Current streak 7 days January 18 – January 24









Badges are Reliable Signals



dependencies up to date of up-to-date and secure dependencies

coverage 94% of the presence of tests in pull requests

downloads 654/month



of **popularity**

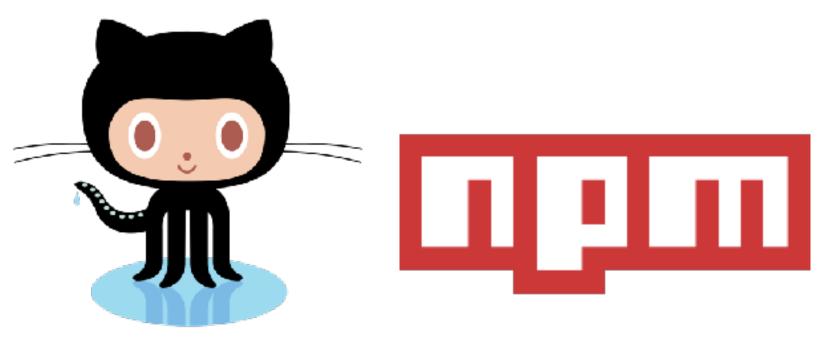
Mixed methods study



Survey

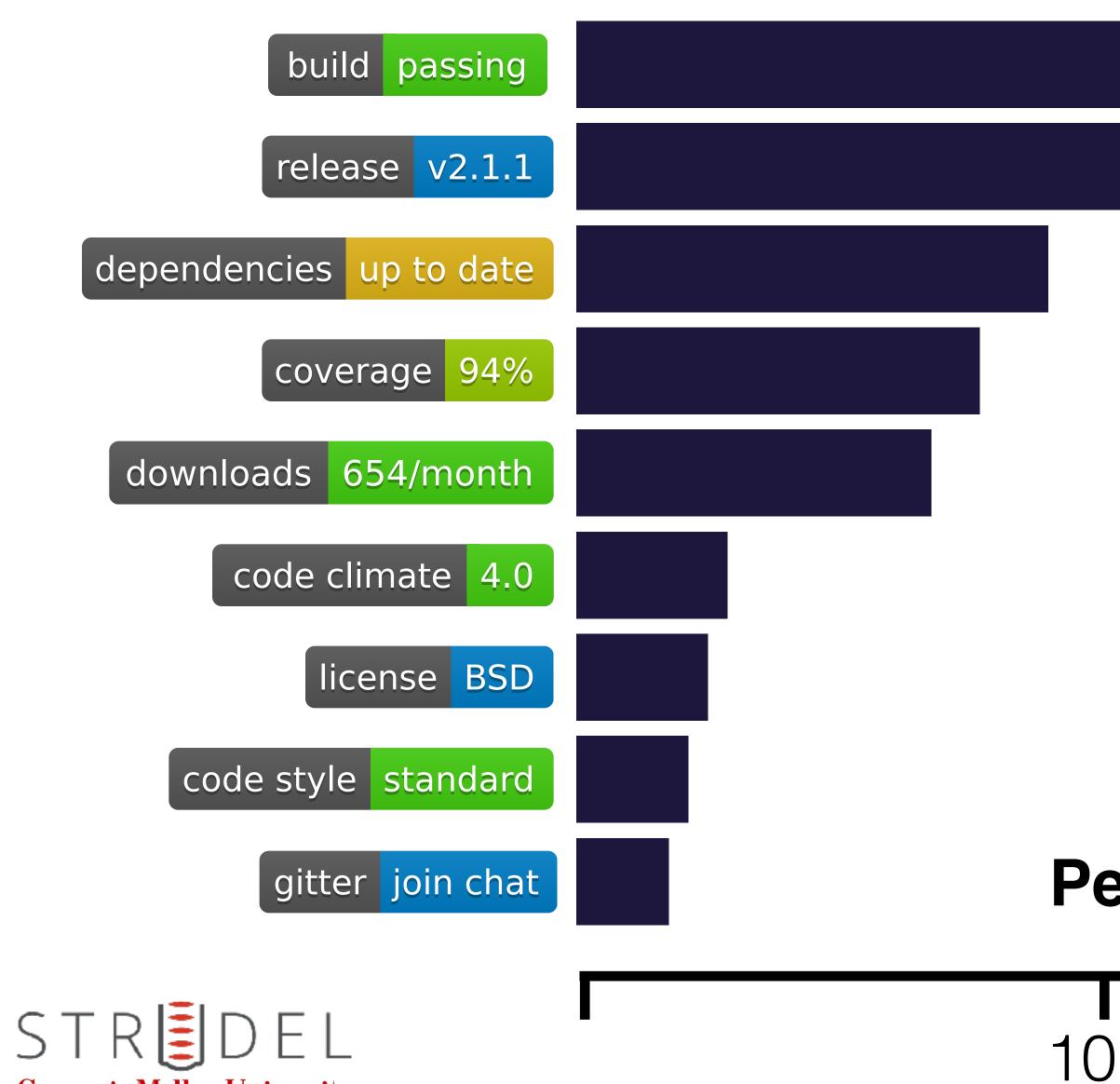
- 32 maintainers, 57 contributors
- Maintainers:
 - What do you intend to signal?
 - What effects do you expect?
- Contributors:
 - What do badges tell you?

STREDEL Carnegie Mellon University



Repository Mining

- 294,941 npm packages
- Mined badge adoptions/removals from README files
- Measured proxies for code quality, test suite quality, popularity, dependency freshness, ...

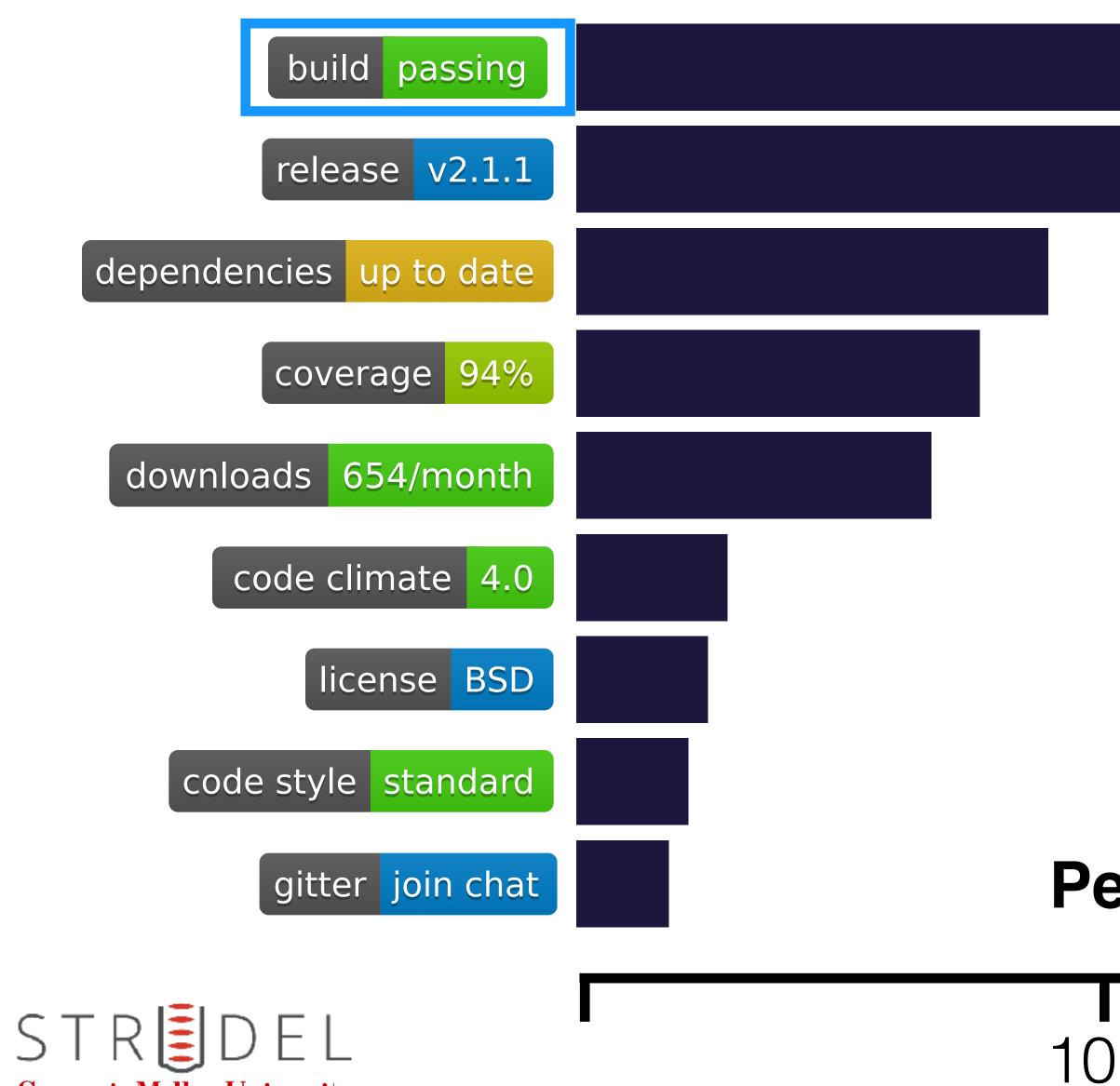


Carnegie Mellon University

Percent of packages





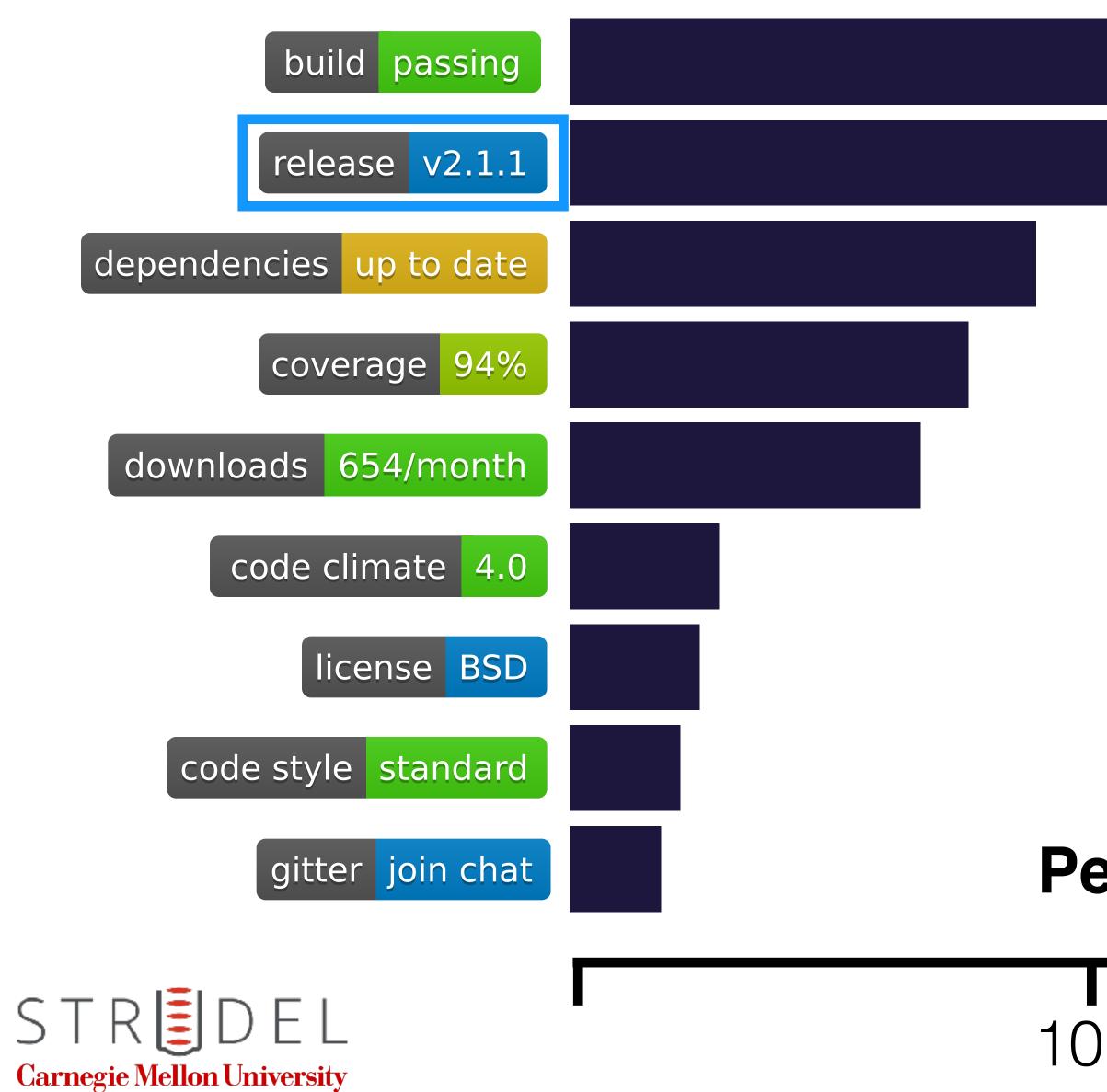


Carnegie Mellon University

Percent of packages



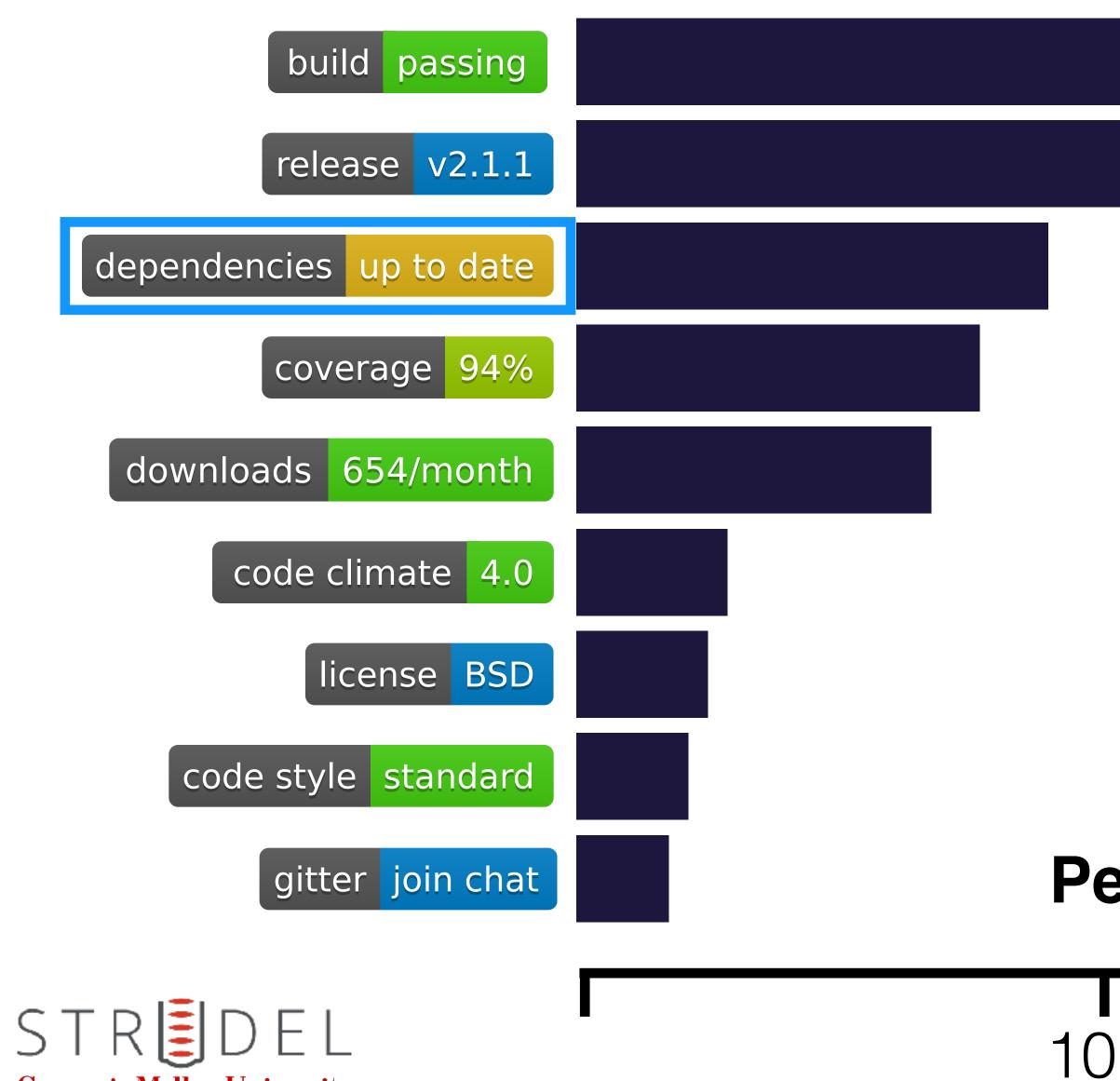




Percent of packages





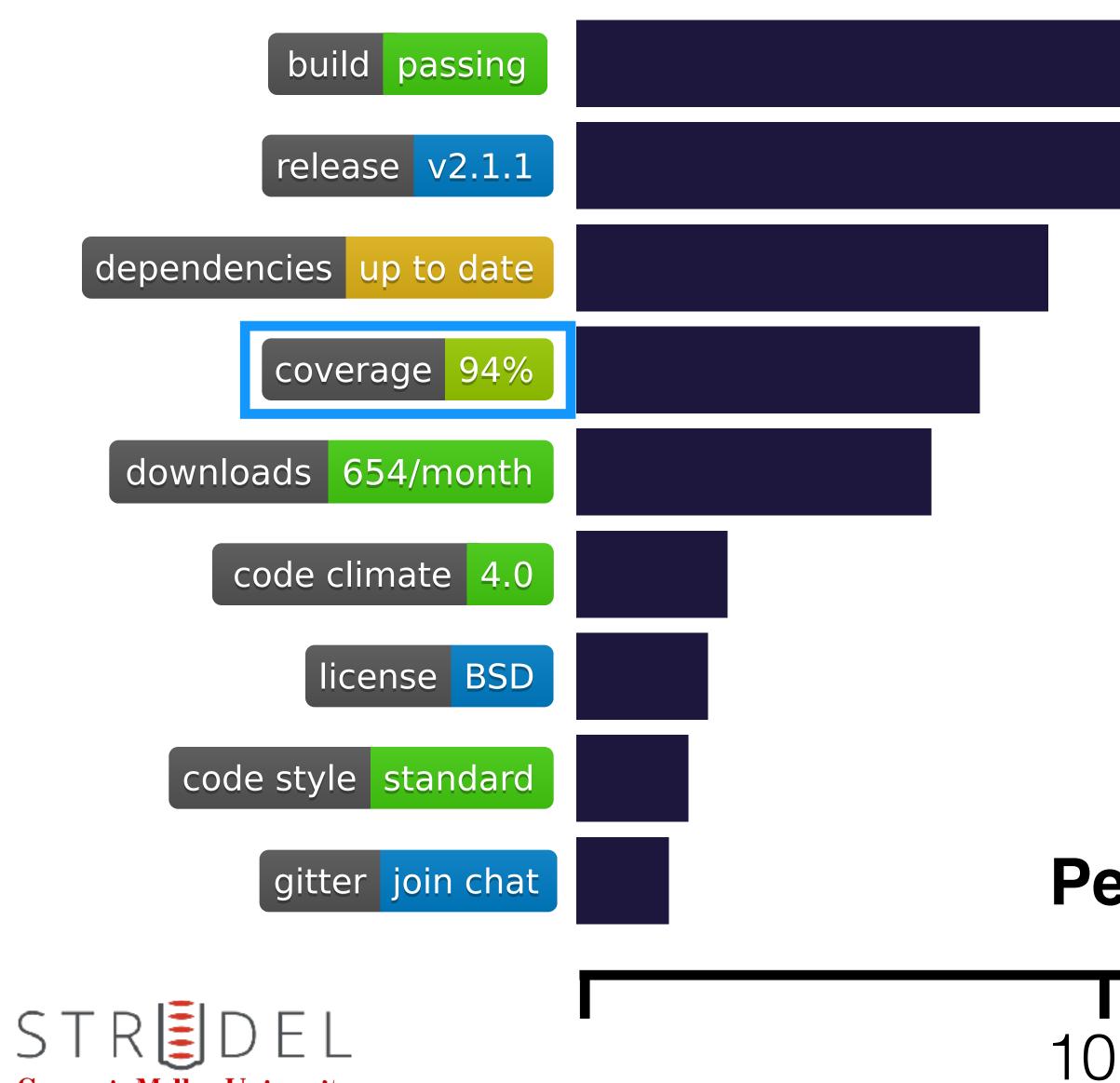


Carnegie Mellon University

Percent of packages





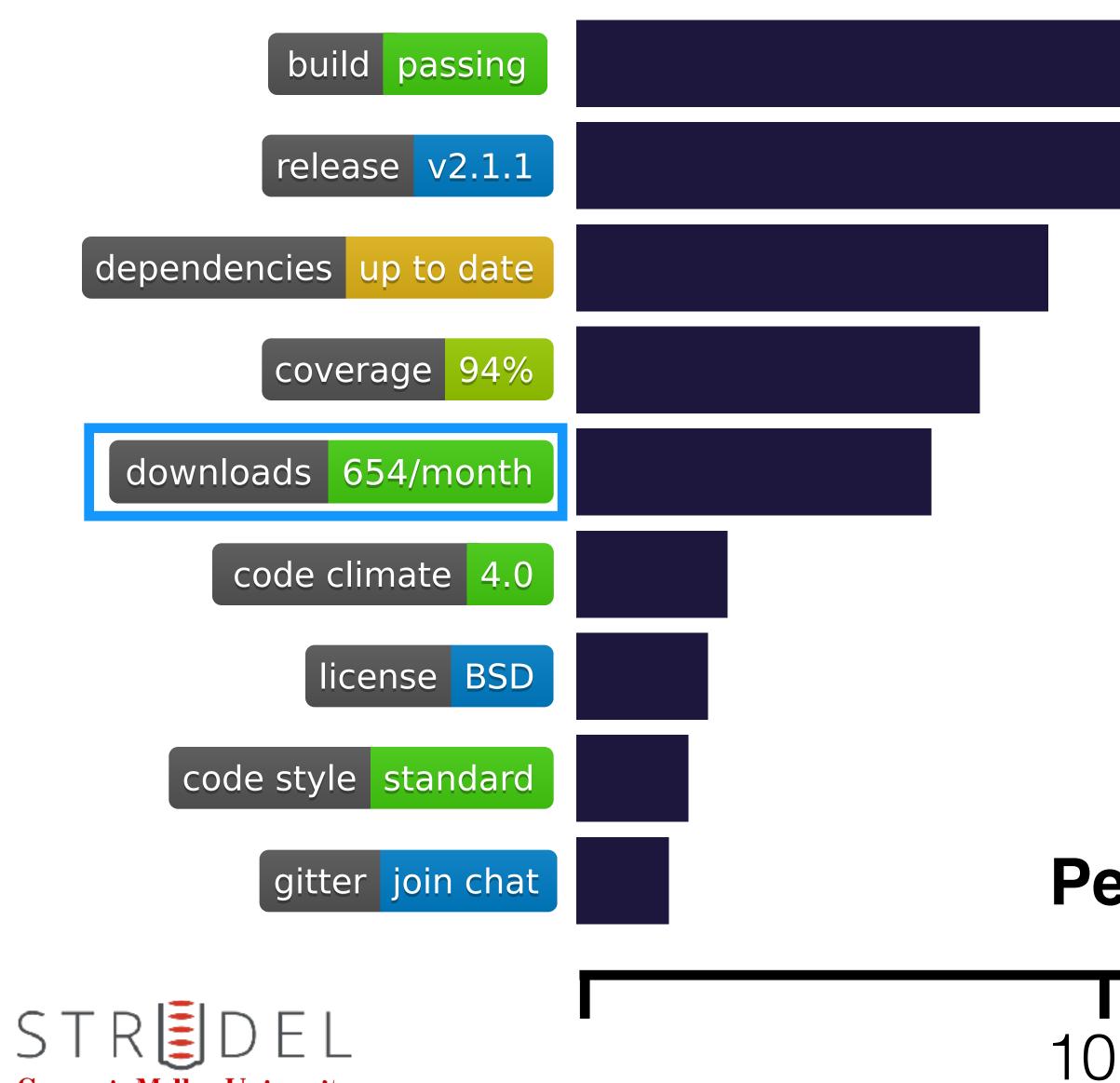


Carnegie Mellon University

Percent of packages







Carnegie Mellon University

Percent of packages





What do developers expect from badges?

- *32* Maintainers
 - What do you intend to signal?
 - What effects do you expect?
- 57 Contributors
 - What do badges tell you?



"welcoming contributions"

"expectations of contribution quality"

"dedicated to offering support"

"reduced chances of conflicting versions of dependencies"

"indicator of product quality"









Correlation

If all you saw was the badge, how much would that tell you?

Regression Analysis

How much more does the badge tell you, relative to existing signals?

STREDEL **Carnegie Mellon University**



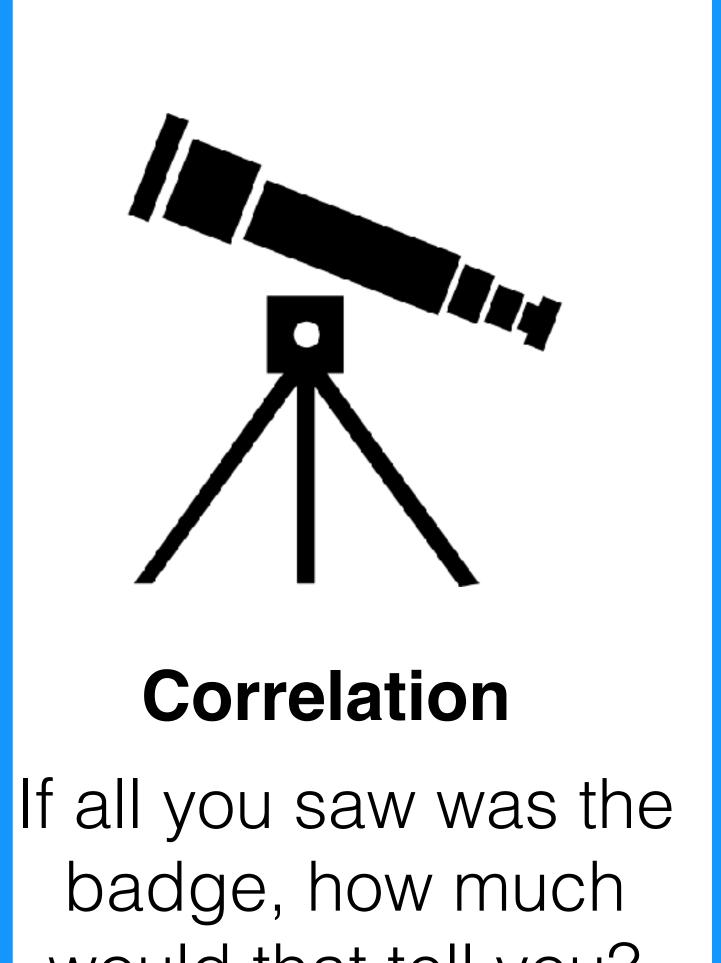


Time Series Analysis

How do things change after adding the badge?







would that tell you? STR DEL

Carnegie Mellon University

Regression Analysis

How much more does the badge tell you, relative to existing signals?







Time Series Analysis

How do things change after adding the badge?



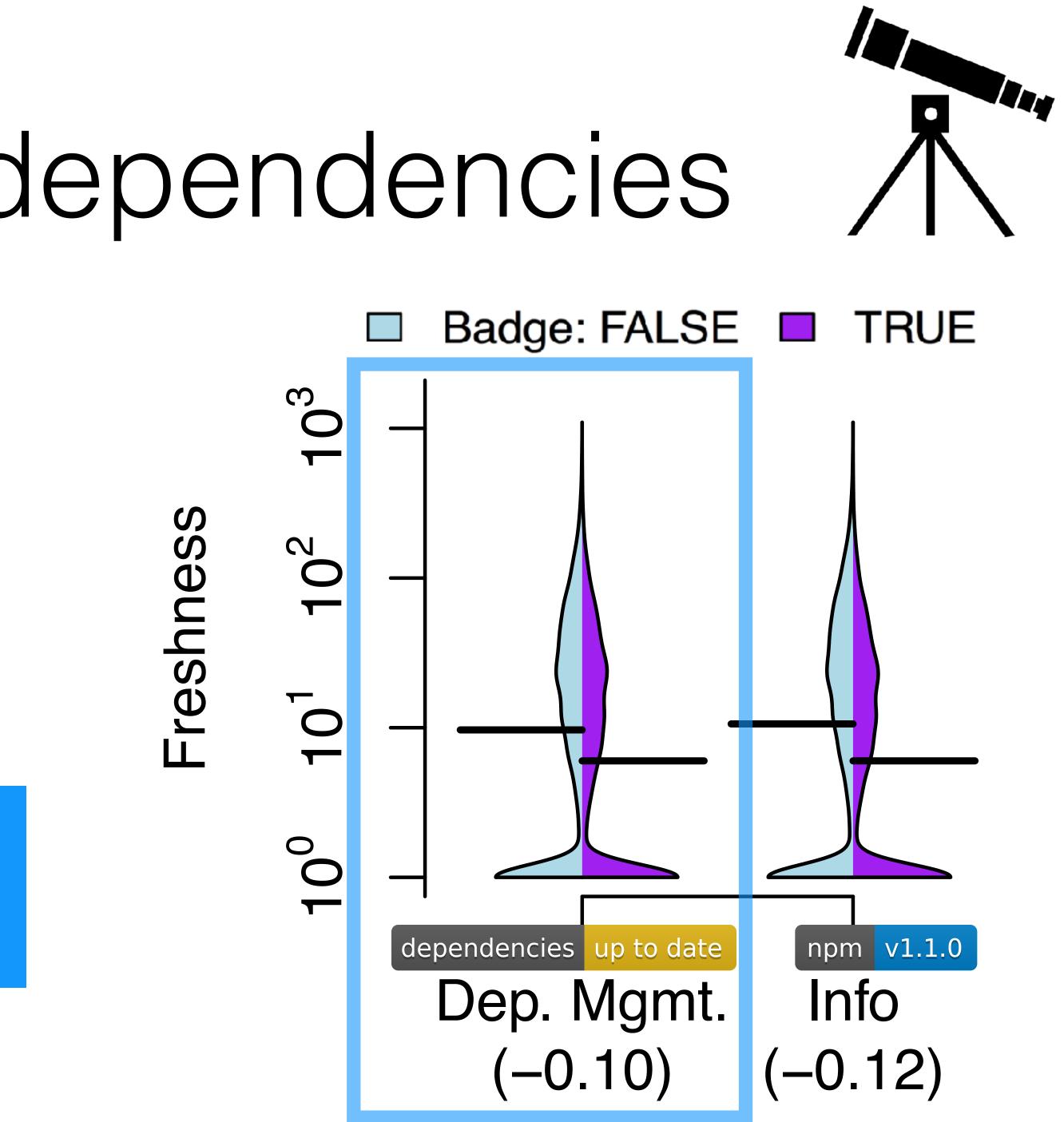


Step 1: Correlation Signals of fresh dependencies

- Based on survey: The adoption of dependency management badges correlates with fresher dependencies
- Freshness metric: lower is better
 - (More up-to-date deps.)

Result: Dep. badges correlate with fresher dependencies







Correlation

If all you saw was the badge, how much would that tell you?

STR DEL **Carnegie Mellon University**



Regression Analysis

How much more does the badge tell you, relative to existing signals?

Analysis



Time Series Analysis

How do things change after adding the badge?





Step 2: Regression Analysis Signals of fresh dependencies

- Based on survey: The adoption of dependency management badges correlates with fresher dependencies
- Freshness metric: *lower* is better
 - (More up-to-date deps.)

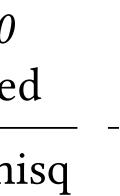
Result: Dep. badges are *the best* signals of fresh dependencies





	Basic Mod response: <i>fresht</i> 17.3% deviance e	ness = 0	Full Mod response: <i>freshi</i> 17.4% deviance e	ness = 0
	Coeffs (Err.)	LR Chisq	Coeffs (Err.)	LR Ch
(Inter	c.) $3.54 (0.03)^{***}$		$3.50 (0.03)^{***}$	
Dep.	$-1.78(0.01)^{***}$	32077.8^{***}	$-1.79(0.01)^{***}$	32292.
RDep	$0.22 (0.01)^{***}$	610.3^{***}	$0.21 (0.01)^{***}$	560.
Stars	$-0.08(0.00)^{***}$	301.4^{***}	$-0.09(0.00)^{***}$	311.
Contr			$-0.25(0.01)^{***}$	548.
lastU	$-0.65(0.01)^{***}$		`	
	encies up to date		$0.24 (0.03)^{***}$	116.
npm v	1.1.0		$0.11(0.02)^{***}$	48.
depend	encies up to date : npm	v1.1.0	-0.05(0.04)	1.
hasOt	her		0.01(0.01)	
		*** <i>D</i> < (0.001. ** p < 0.0	1. * p <

 $p < 0.001, {}^{**}p < 0.01, {}^{*}p < 0.05$









Correlation

If all you saw was the badge, how much would that tell you?

Regression Analysis

How much more does the badge tell you, relative to existing signals?

STREDEL Carnegie Mellon University

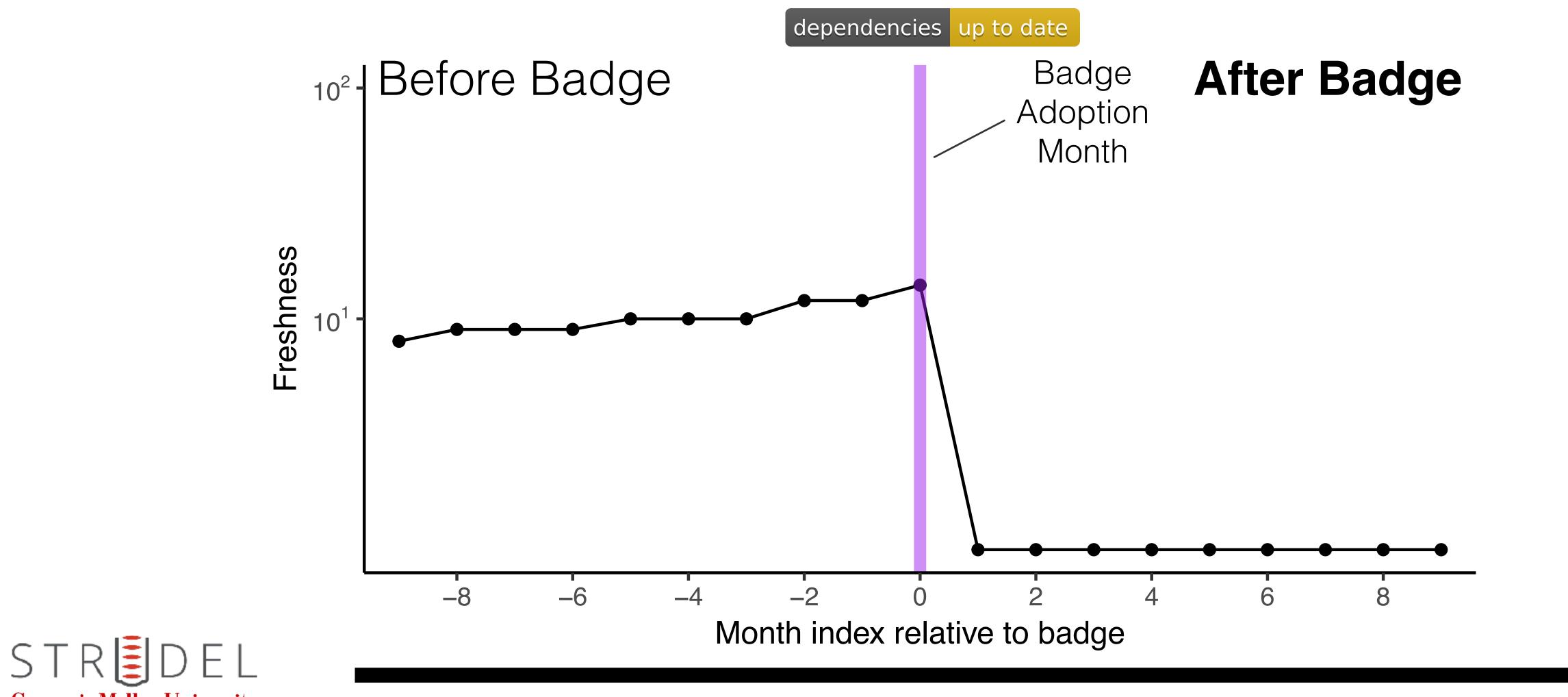
Analysis



Time Series Analysis

How do things change after adding the badge?

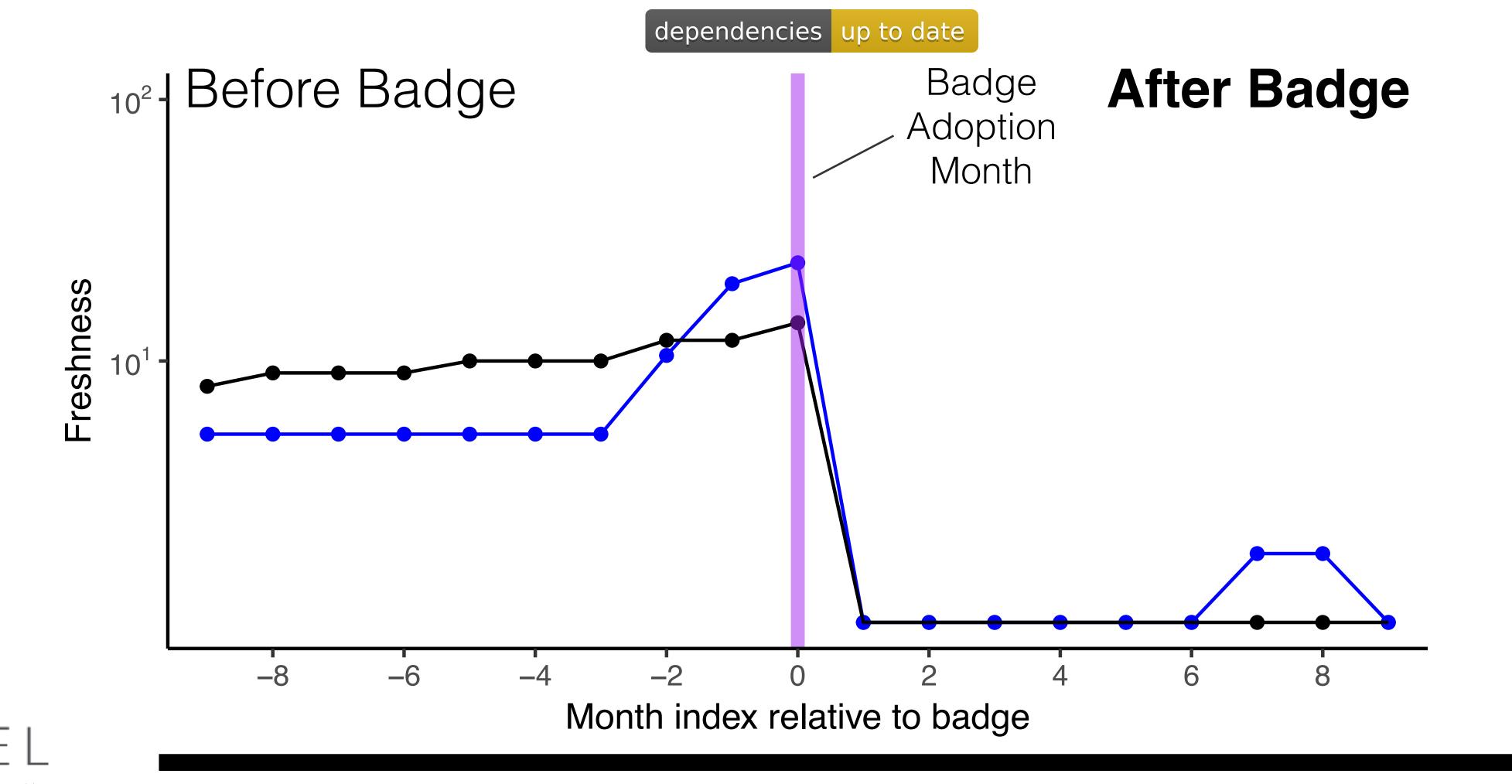




Carnegie Mellon University



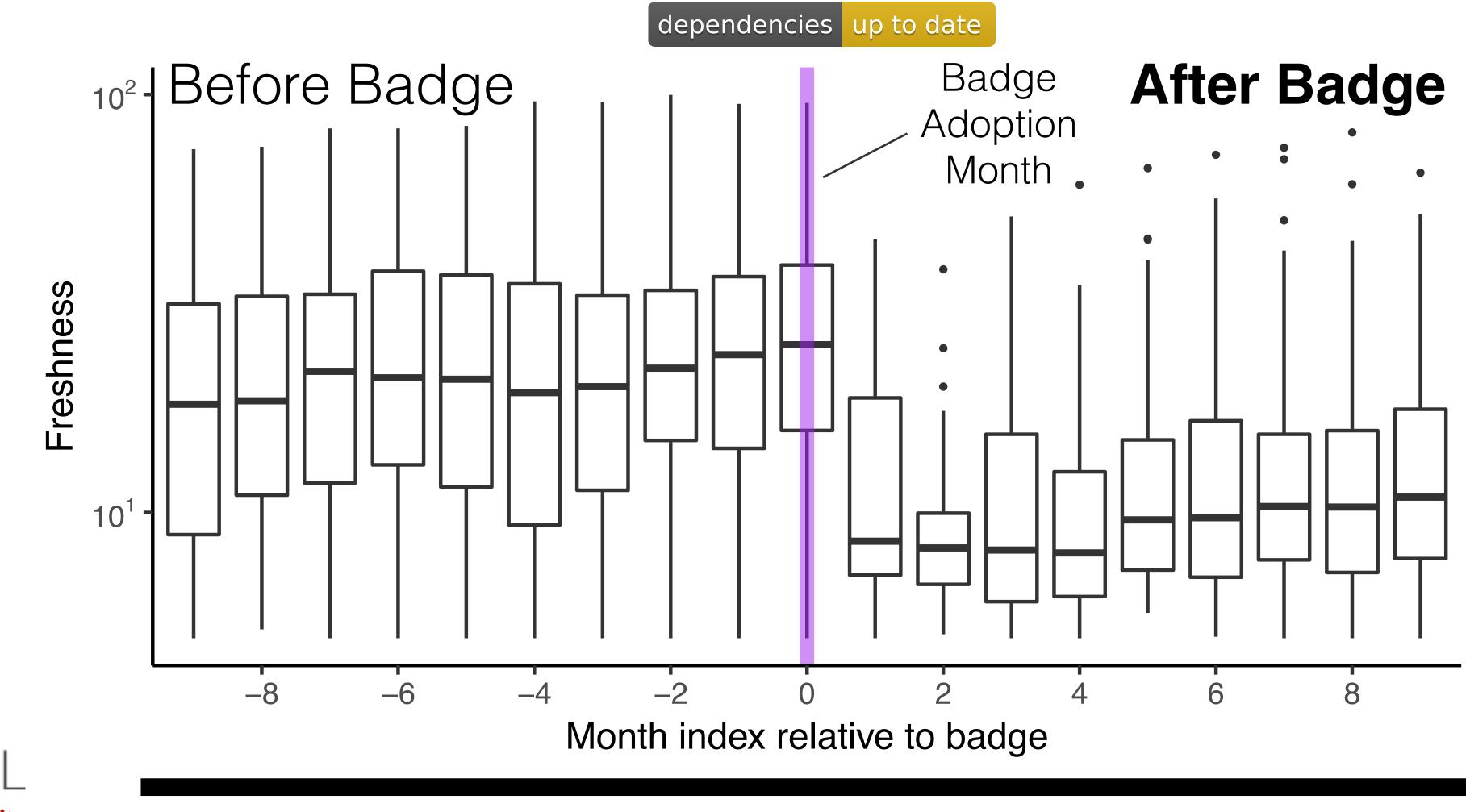




STREDEL Carnegie Mellon University



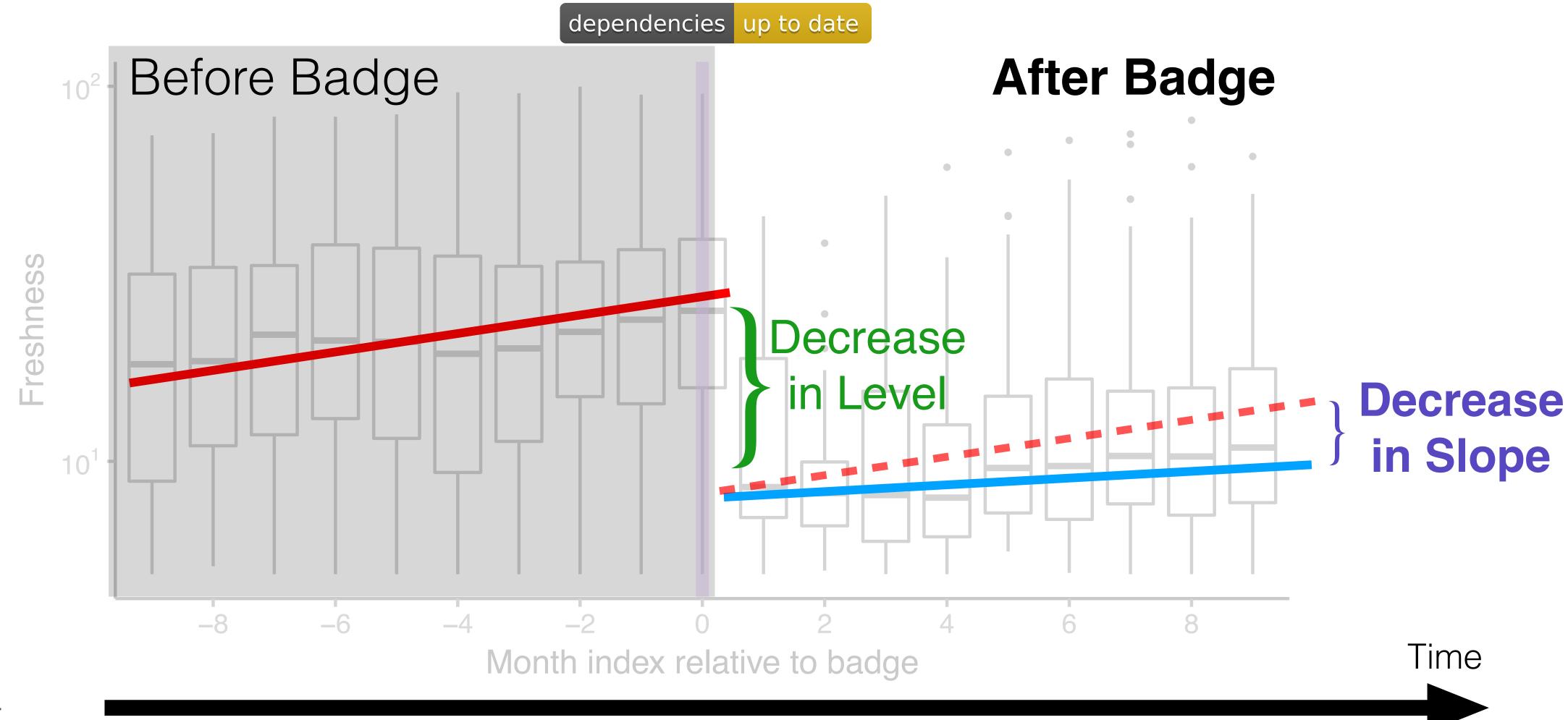




STREDEL Carnegie Mellon University







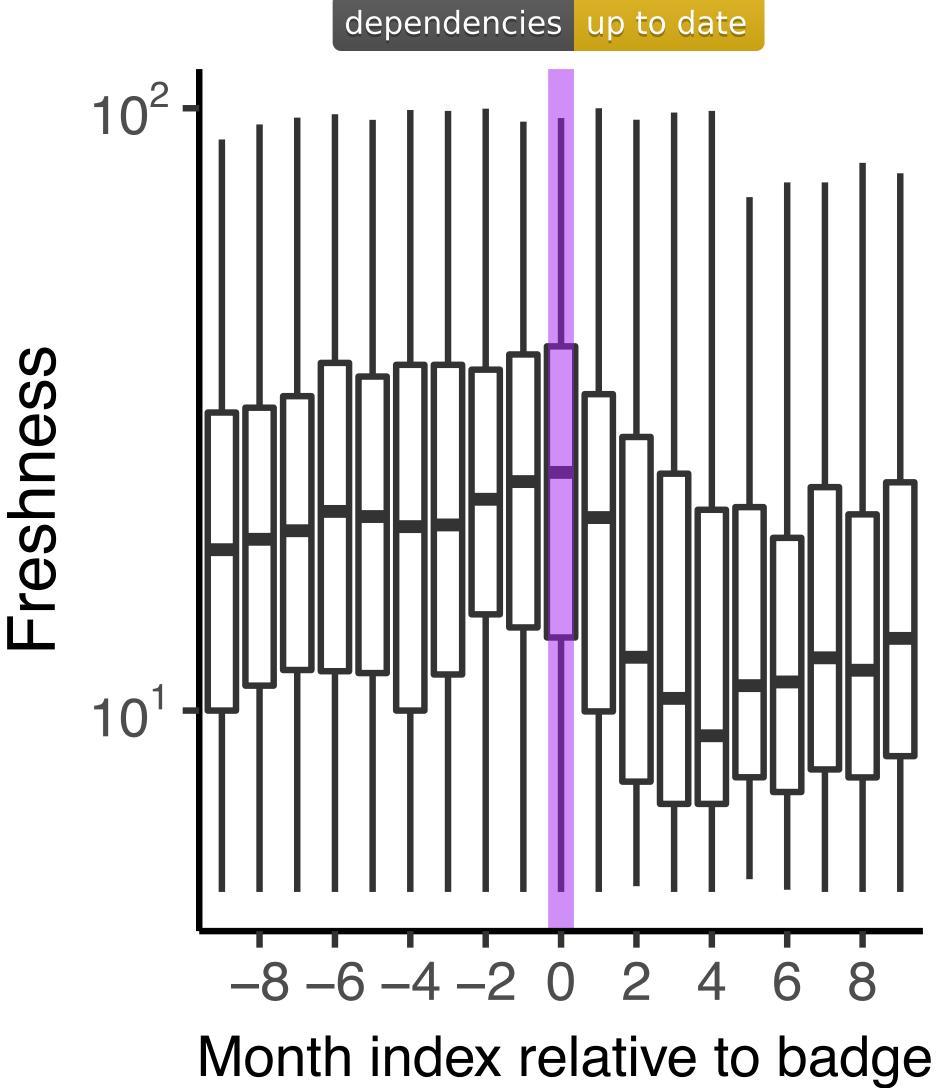
STREDEL **Carnegie Mellon University**



- Based on survey: The adoption of dependency management badges correlates with fresher dependencies
- Freshness metric: *lower* is better
 - (More up-to-date deps.)

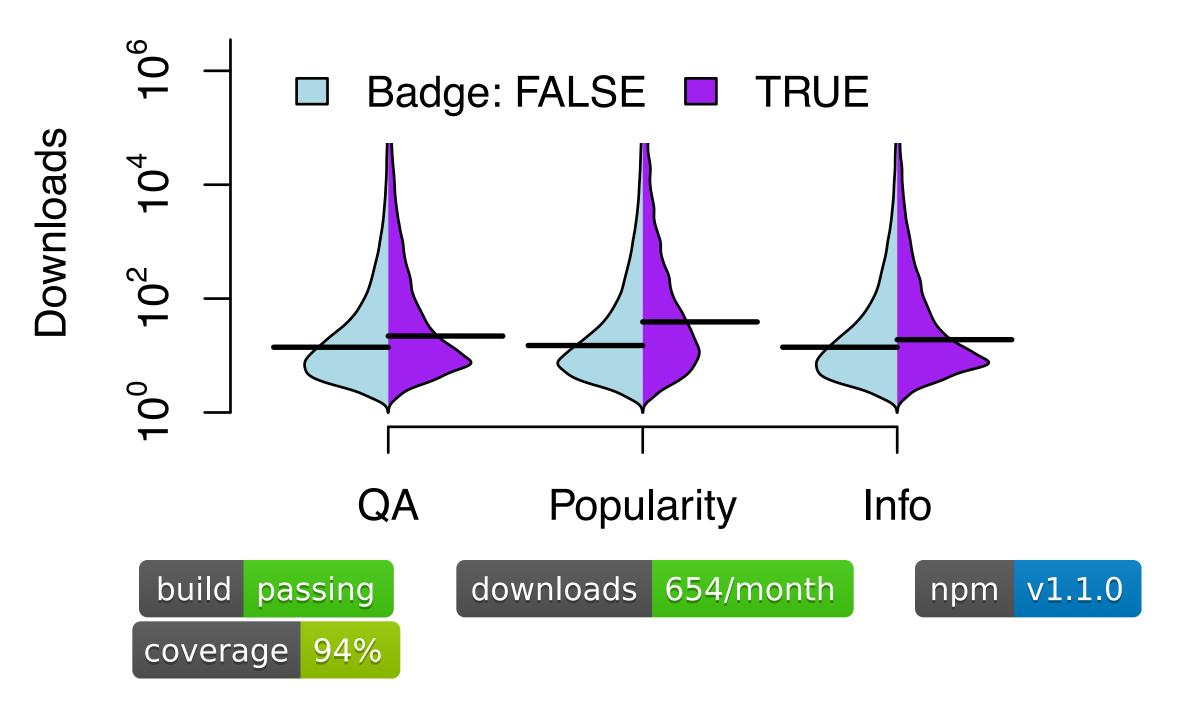
Result: Dep. badges indicate *improved dep. management practices*





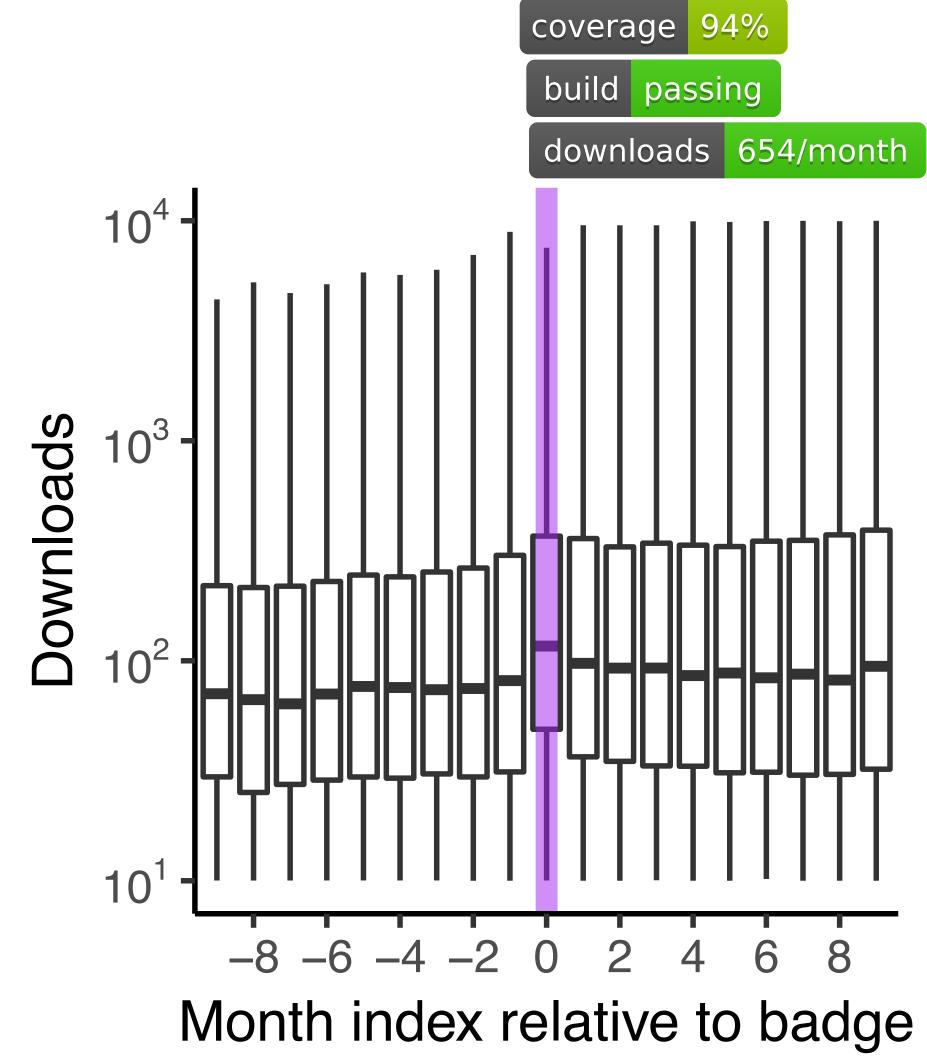


Signals of popularity

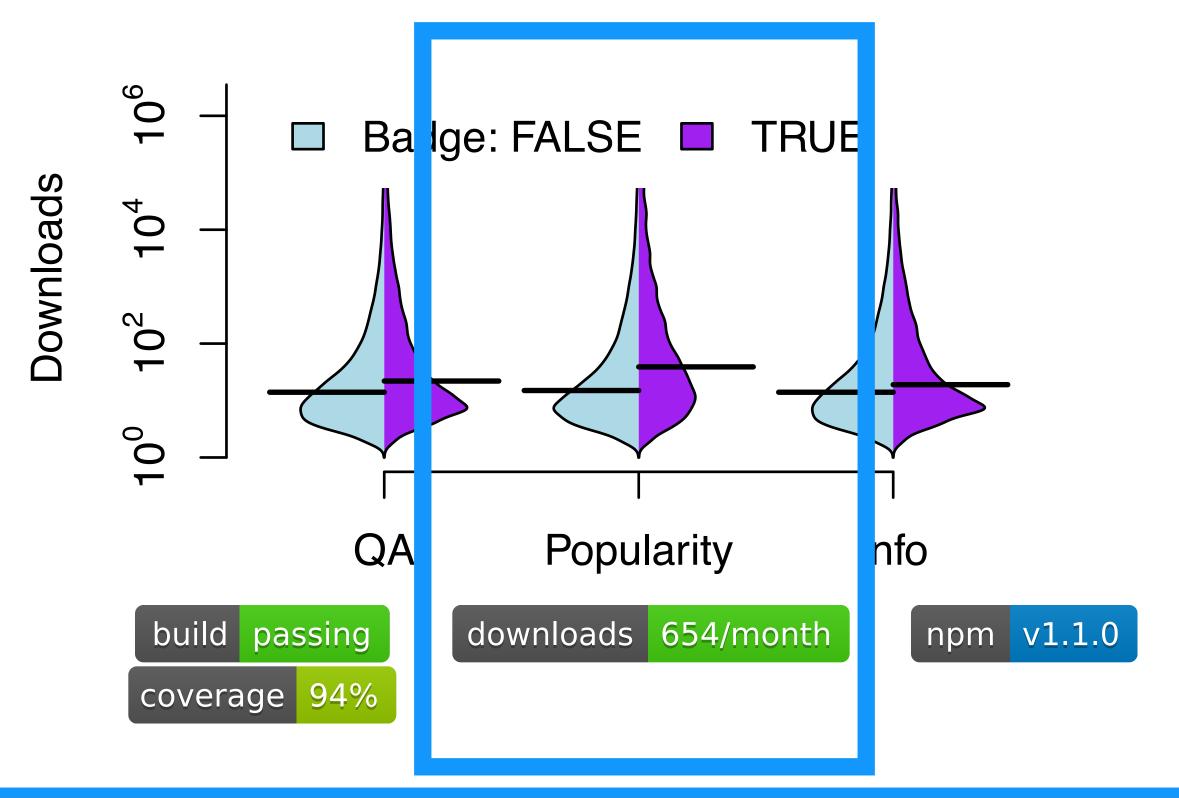


Result: Dep. badges are mostly reliable signals of popularity



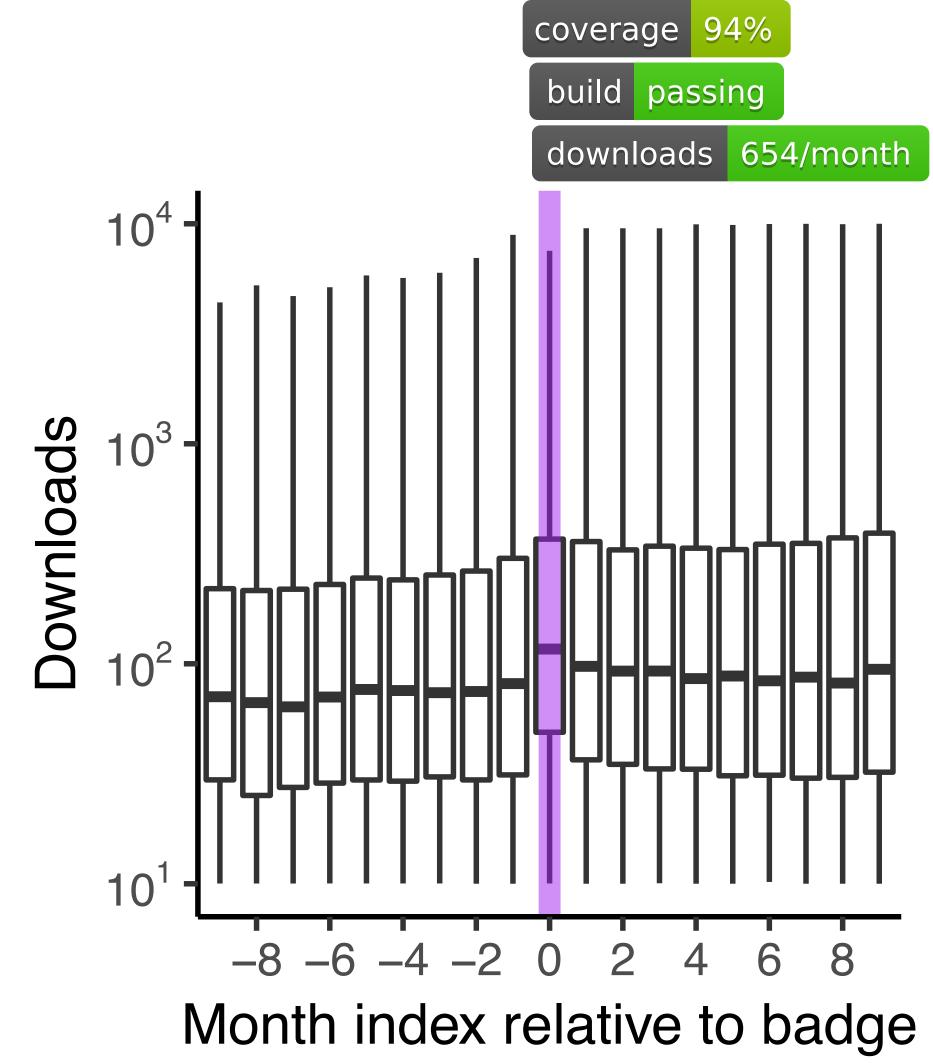


Signals of popularity

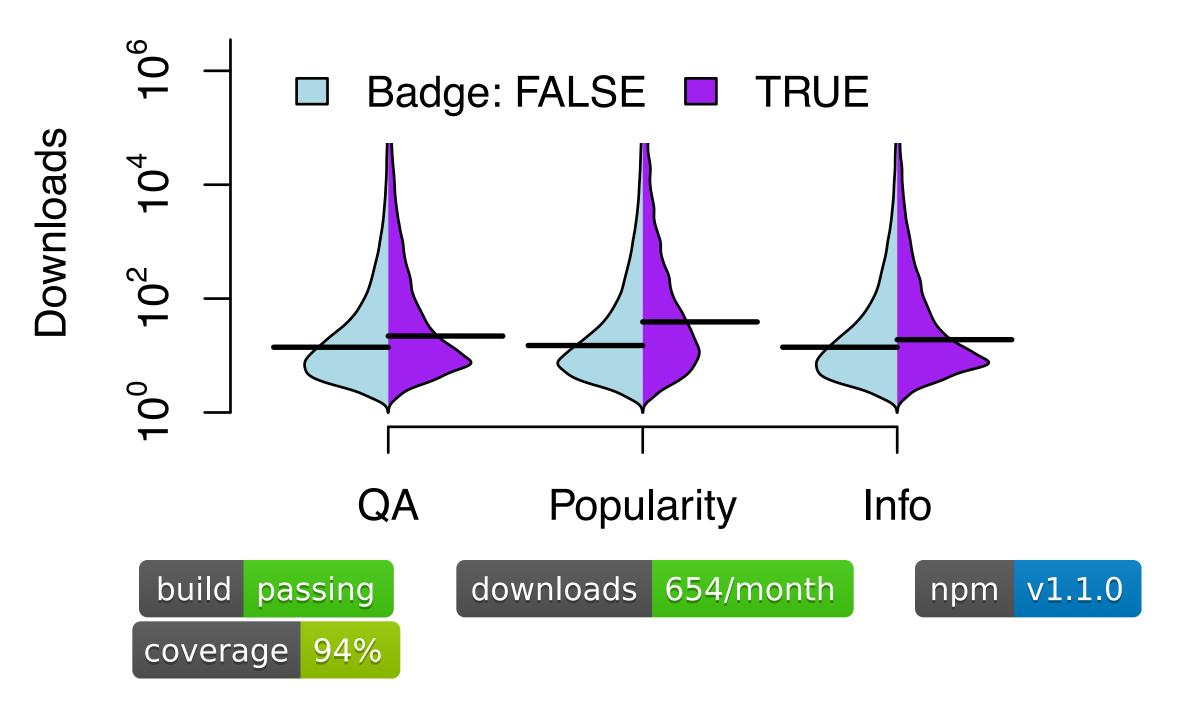


Result: Dep. badges are mostly reliable signals of popularity



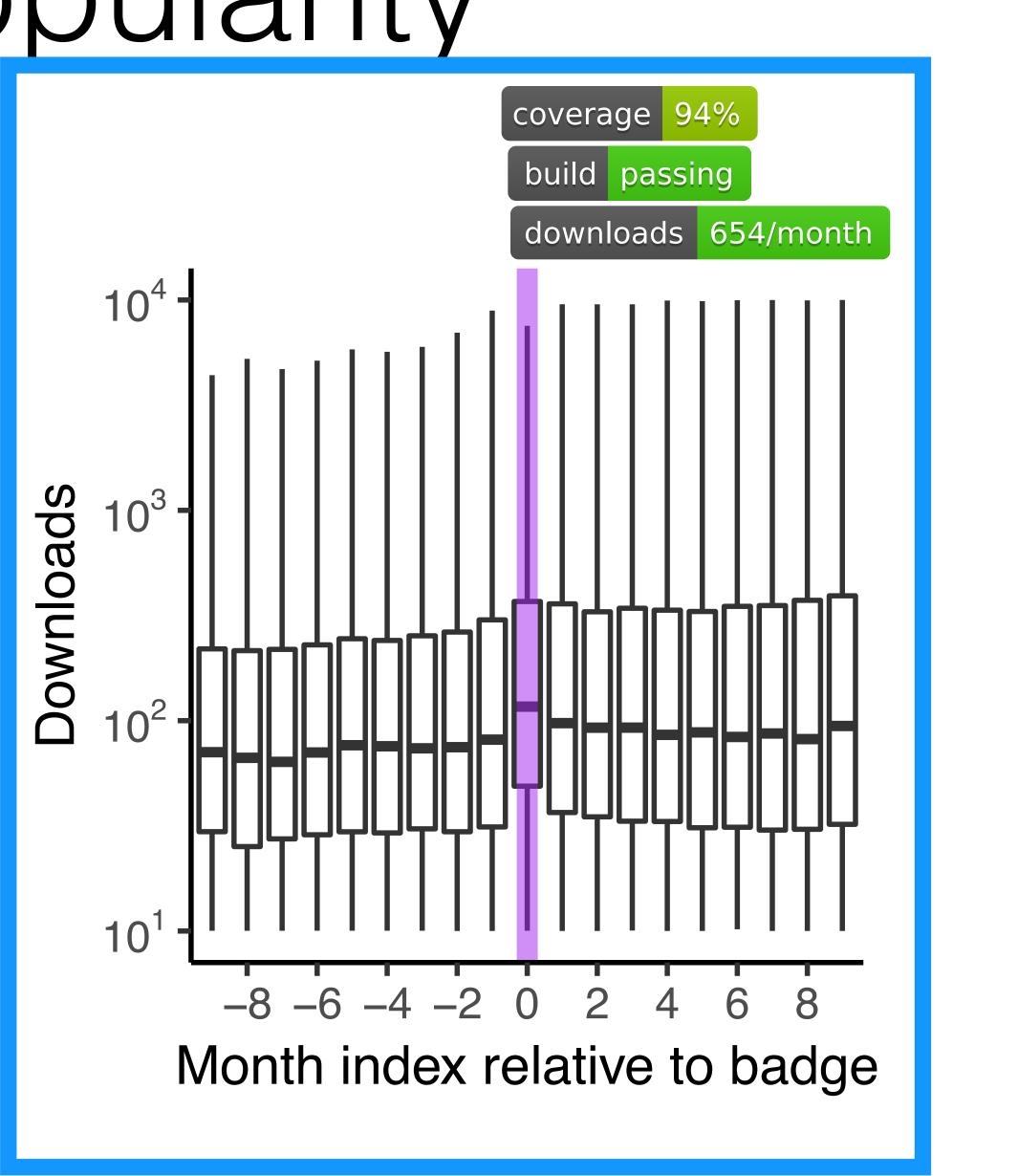


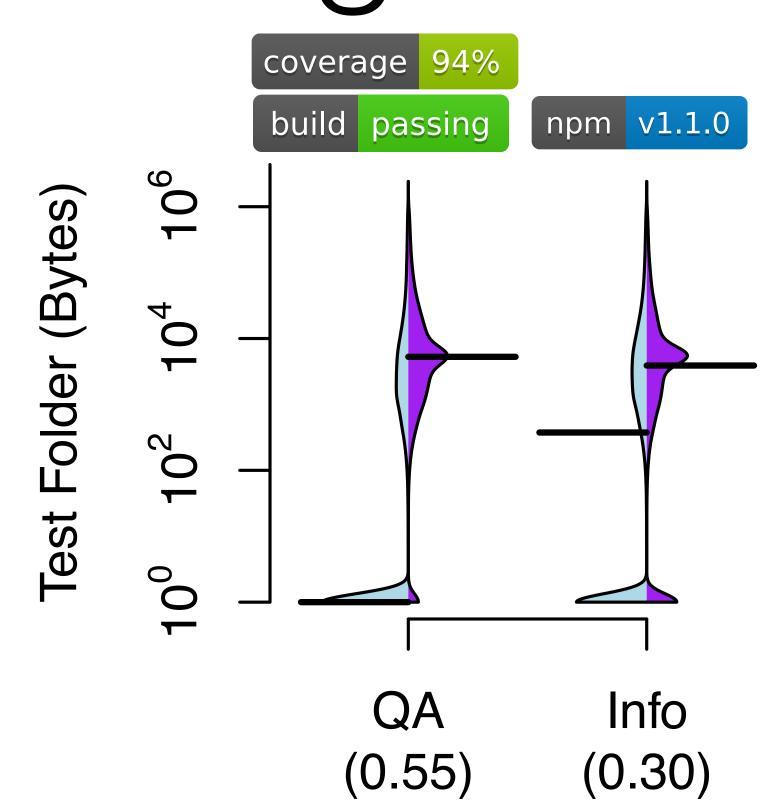
Signals of popularity



Result: Dep. badges are mostly reliable signals of popularity

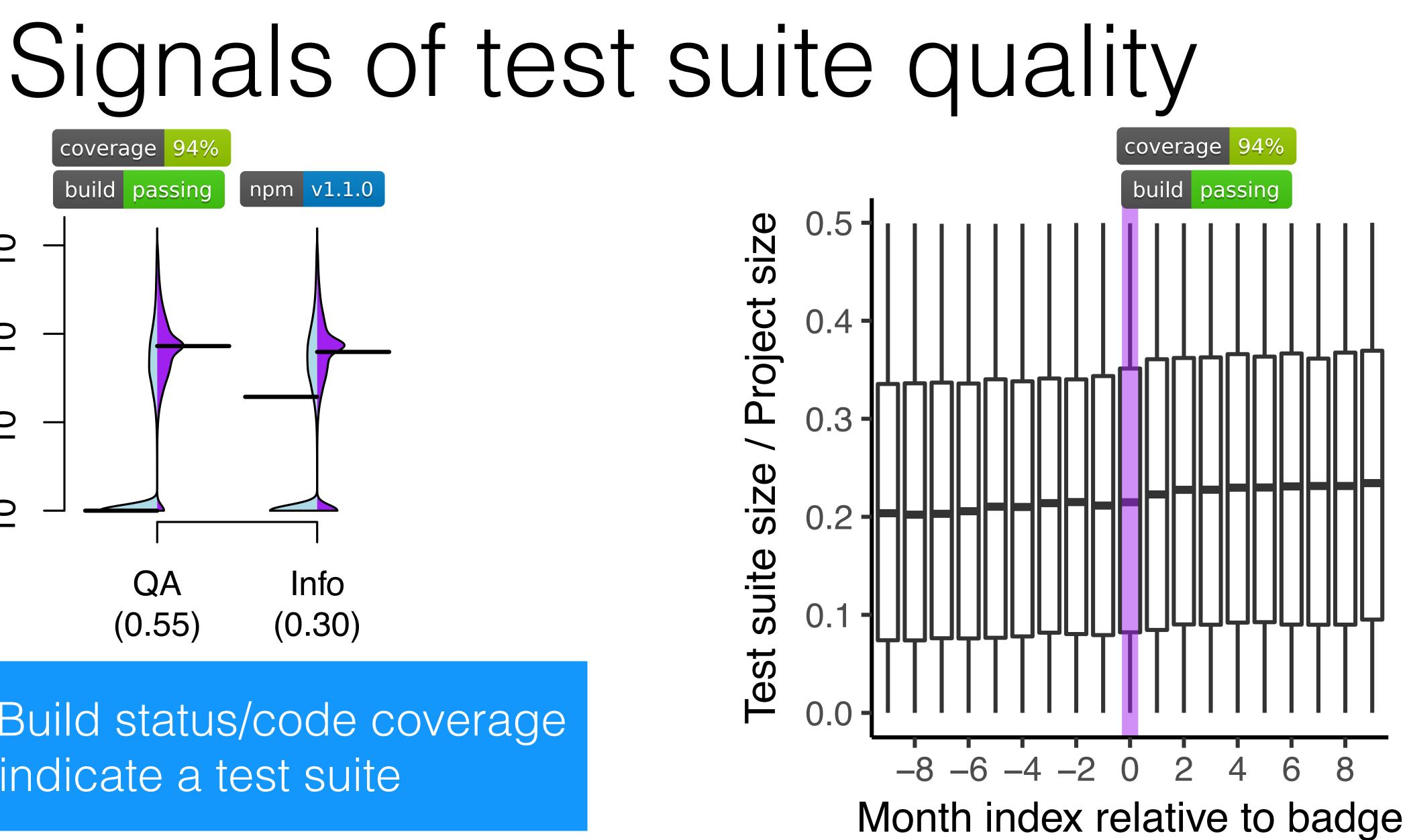






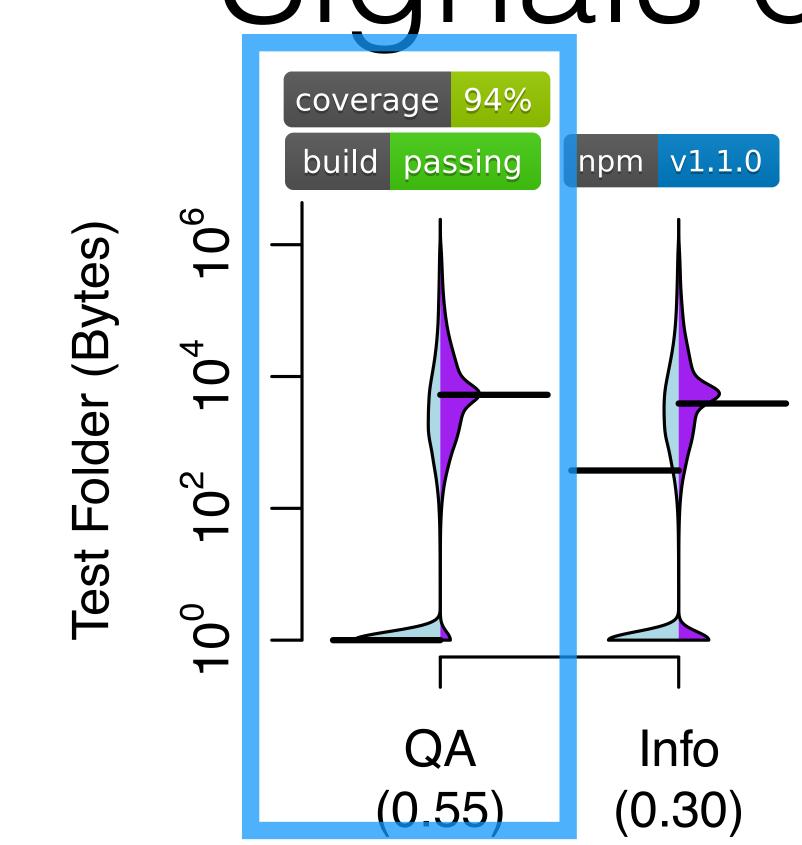
Result: Build status/code coverage badges indicate a test suite





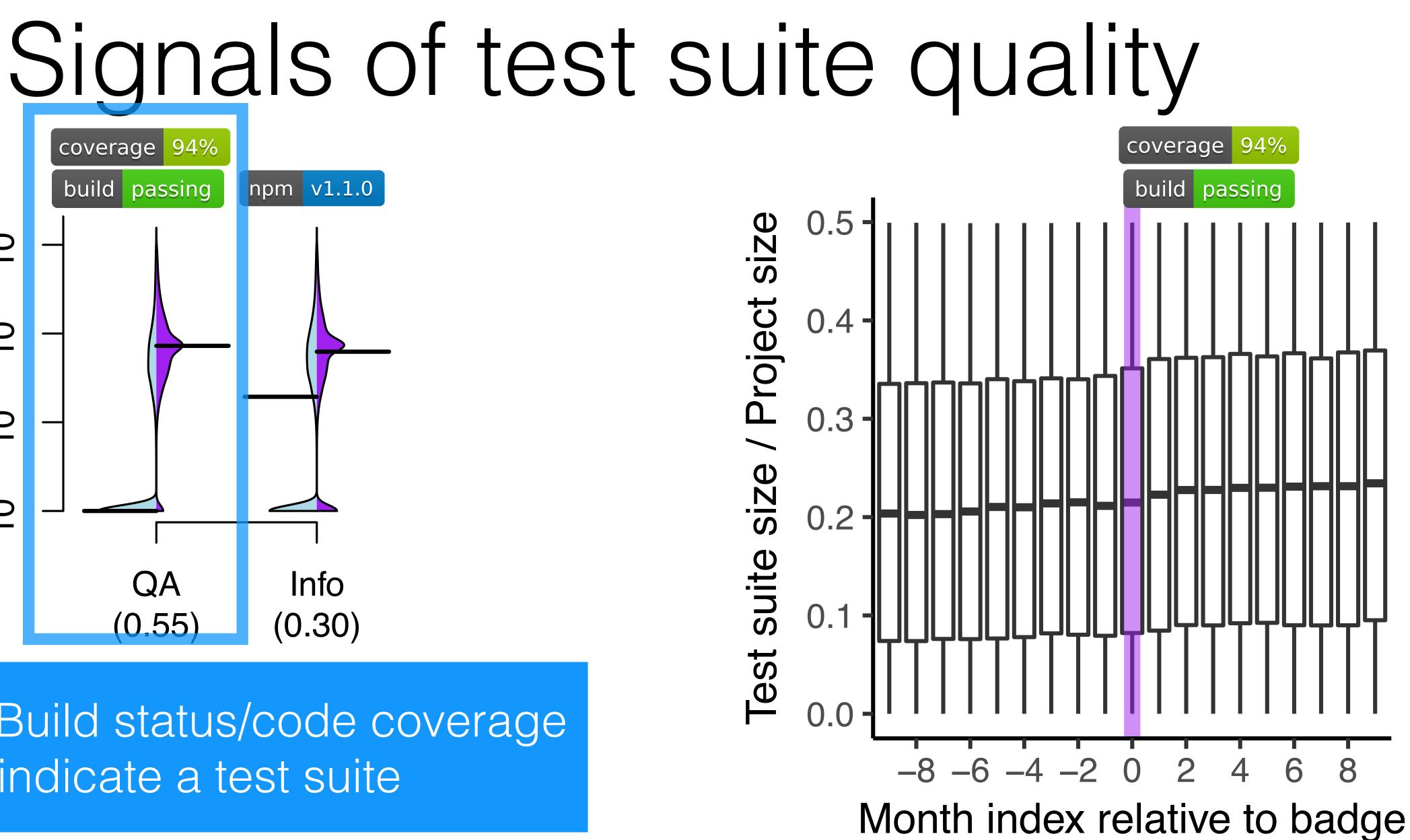






Result: Build status/code coverage badges indicate a test suite

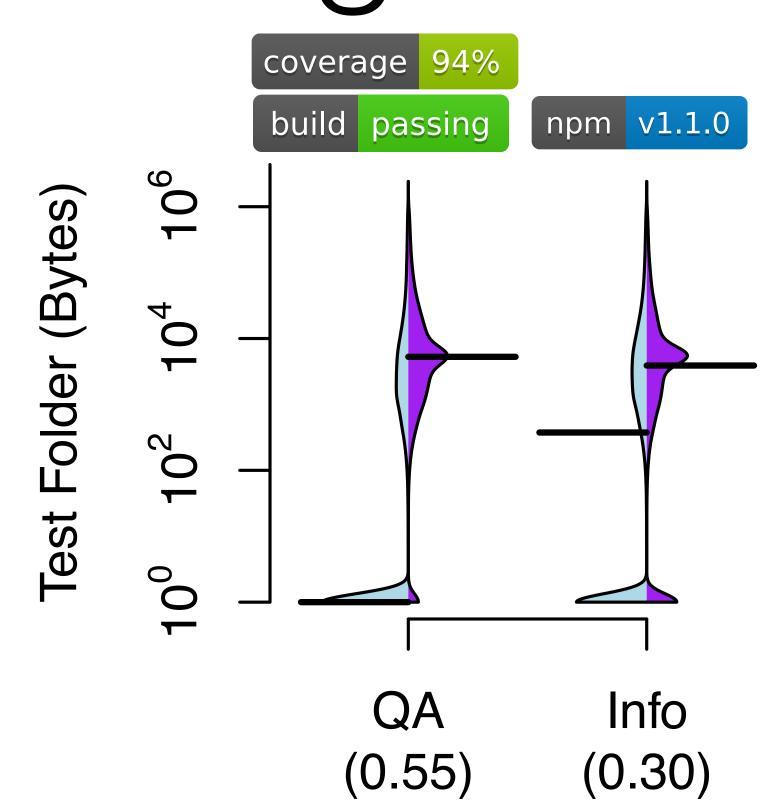






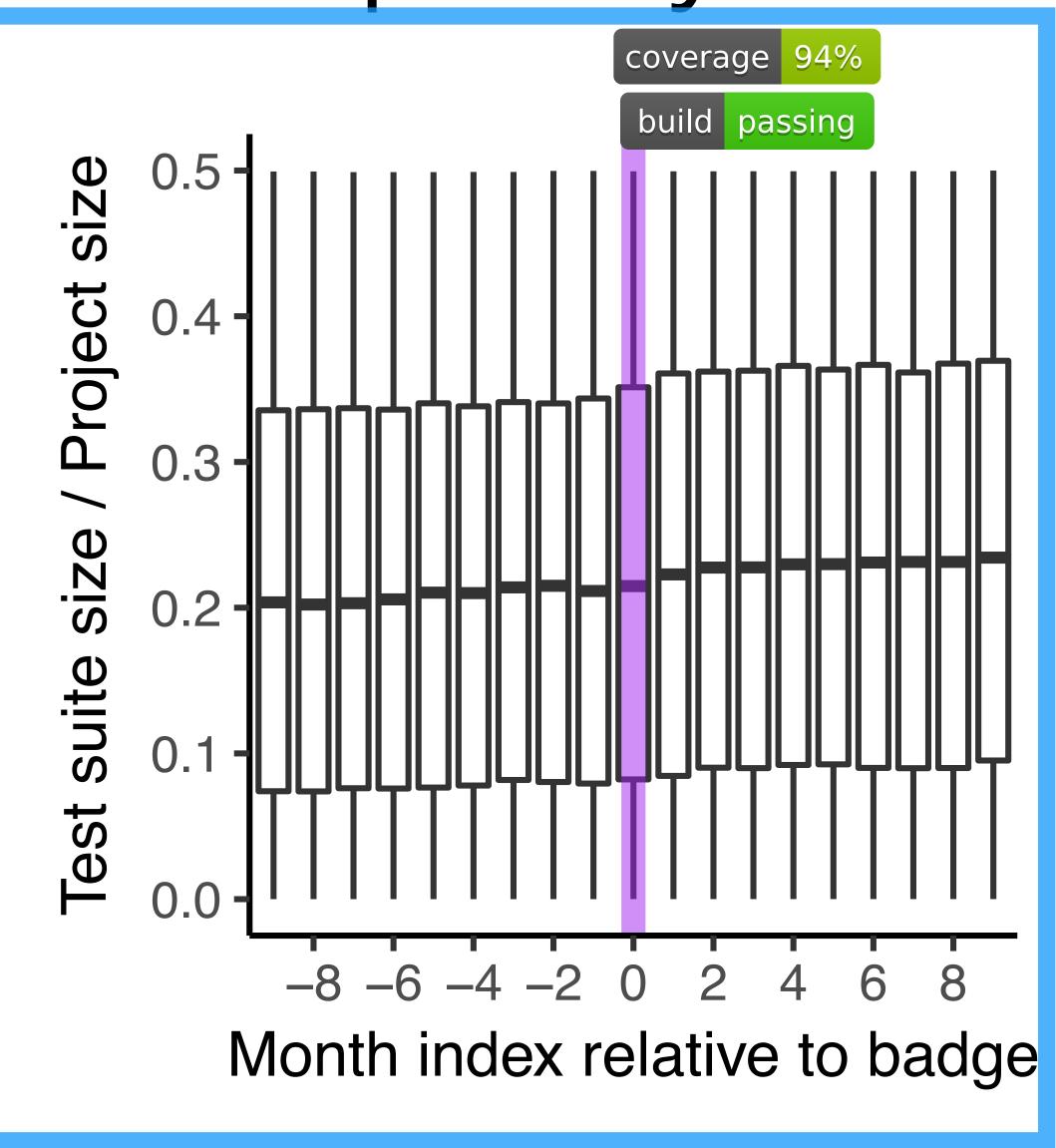


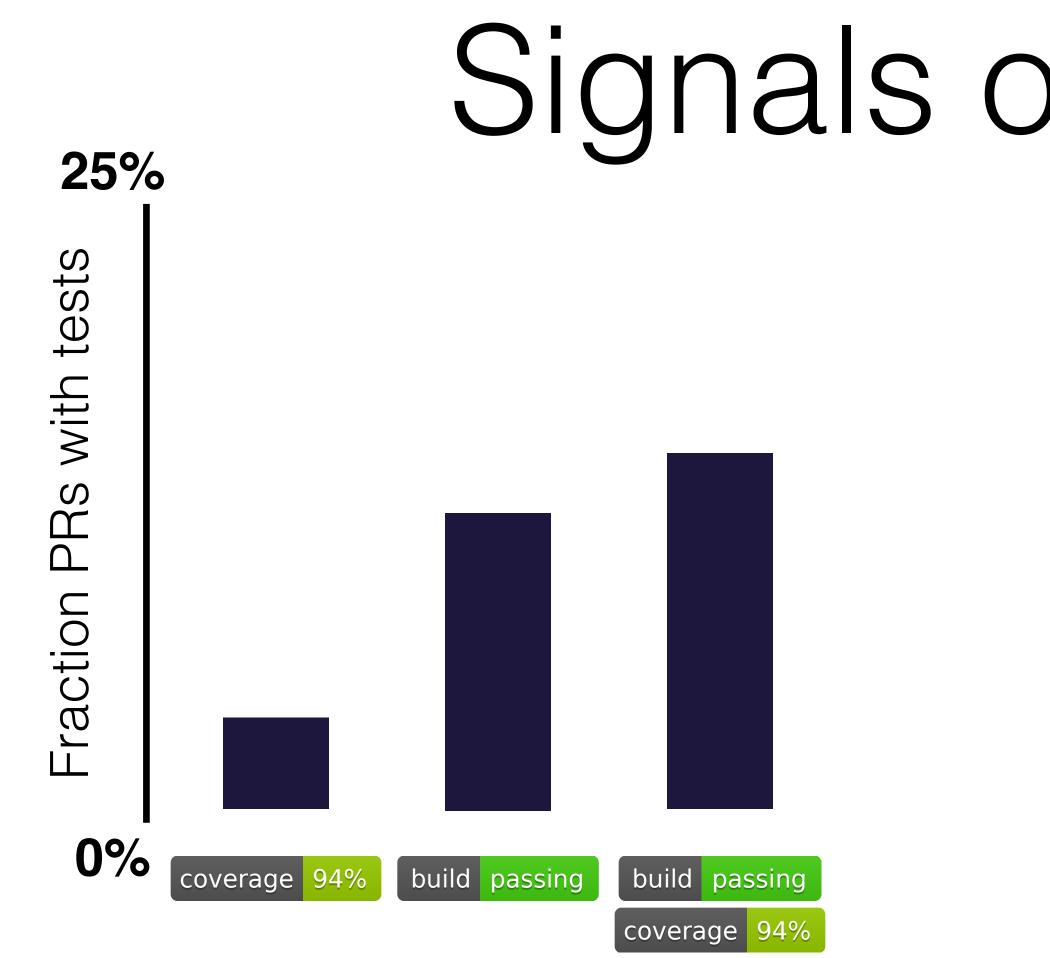
Signals of test suite quality



Result: Build status/code coverage badges indicate a test suite



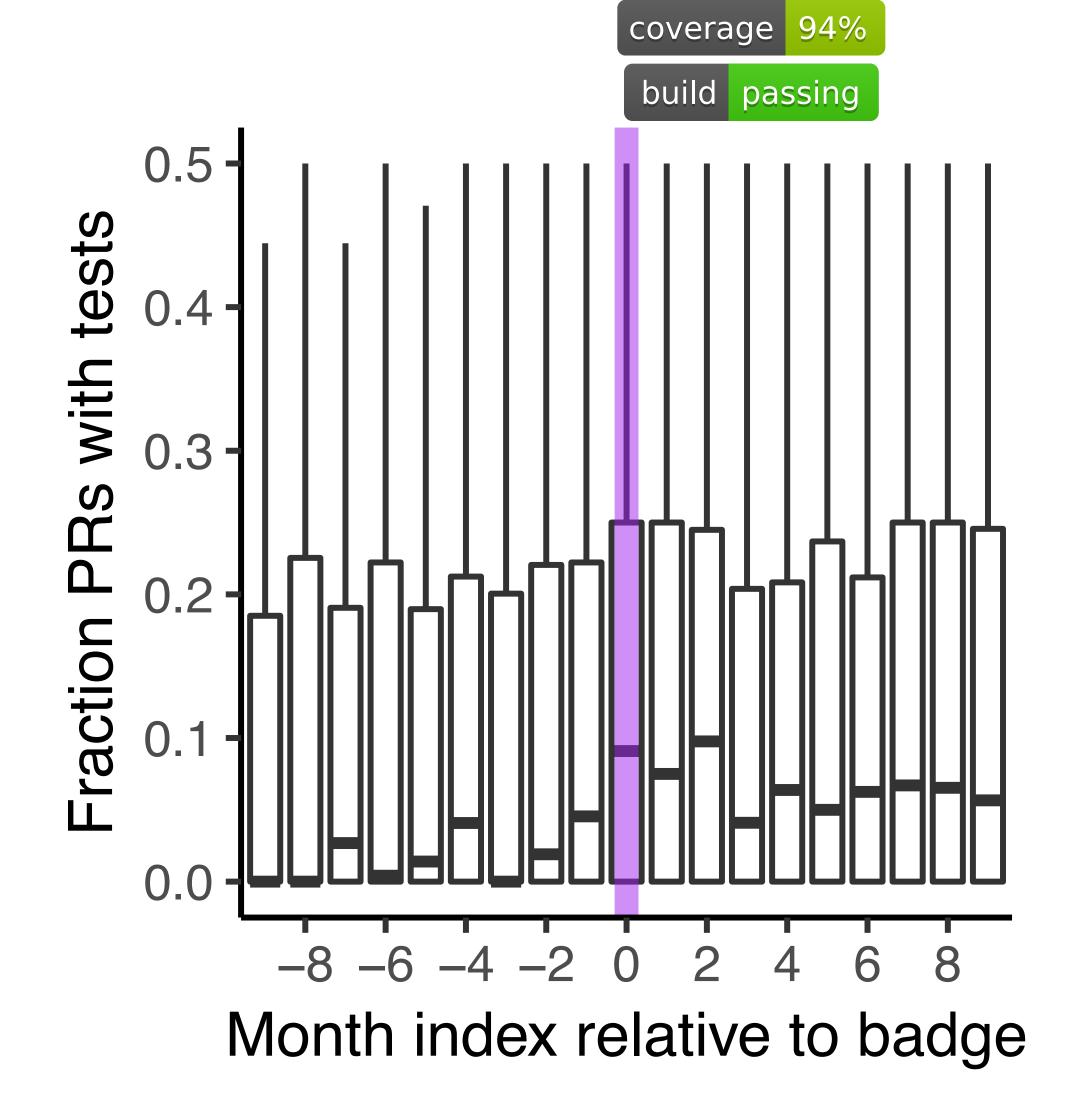


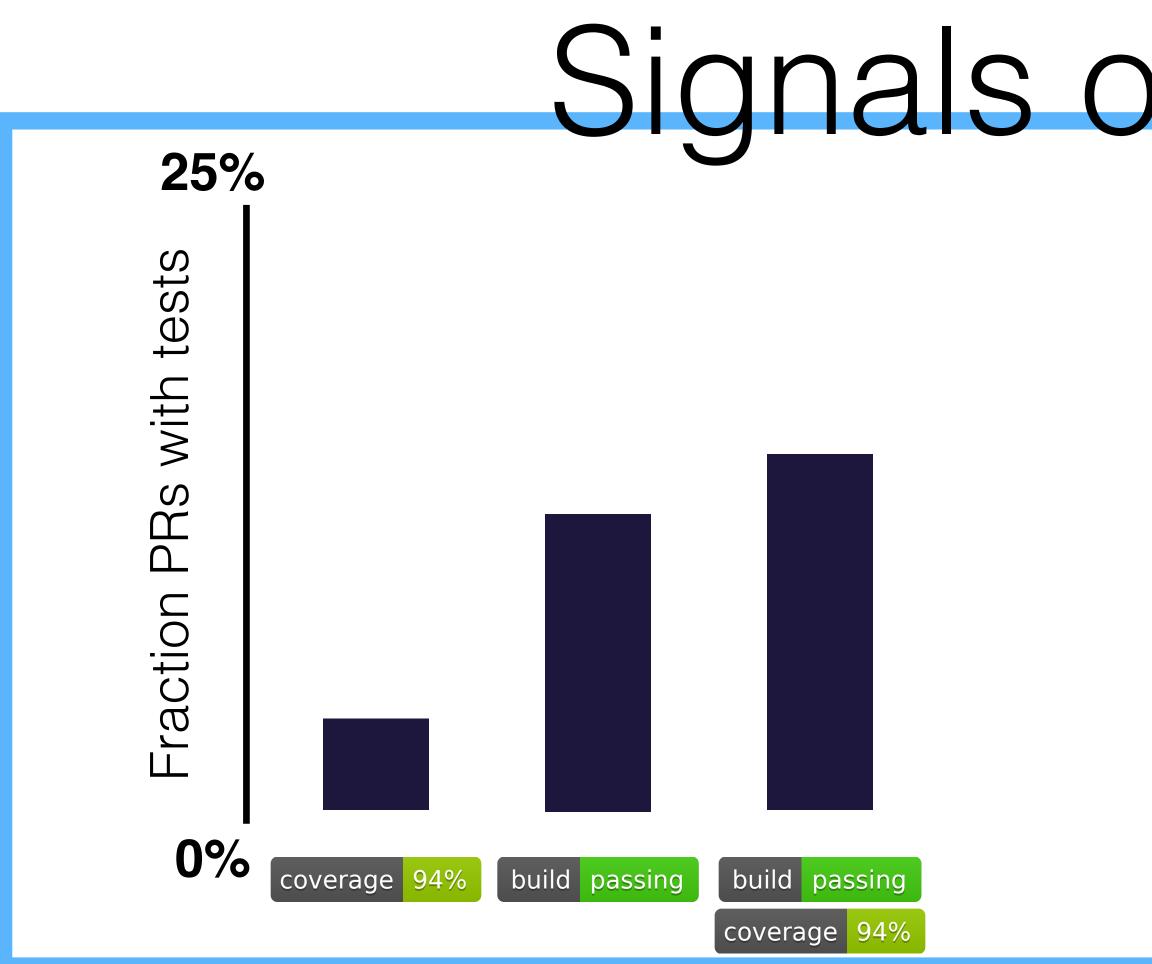


Result: Build status+code coverage badges indicate *more tests in PRs*



Signals of PR quality

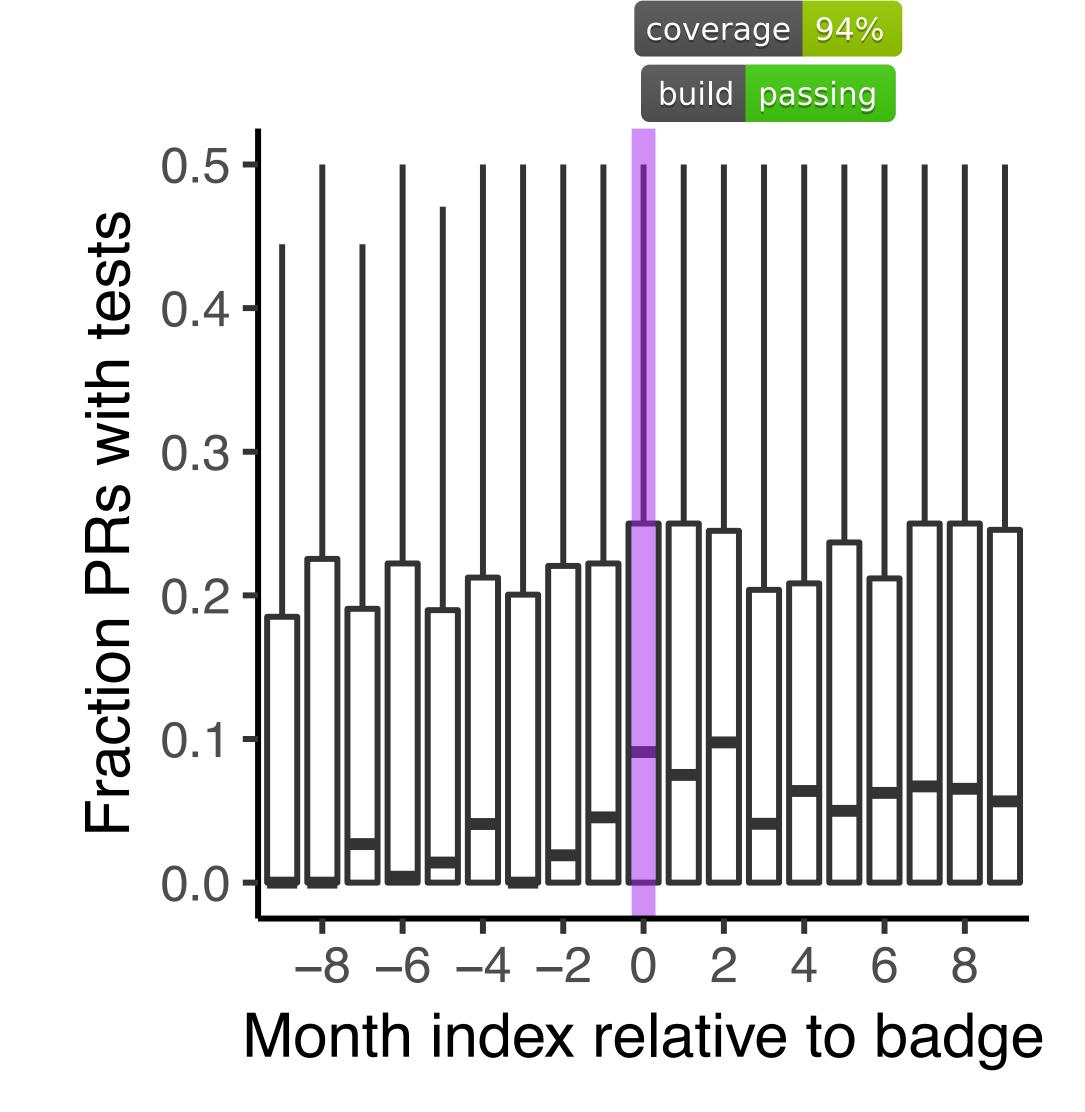


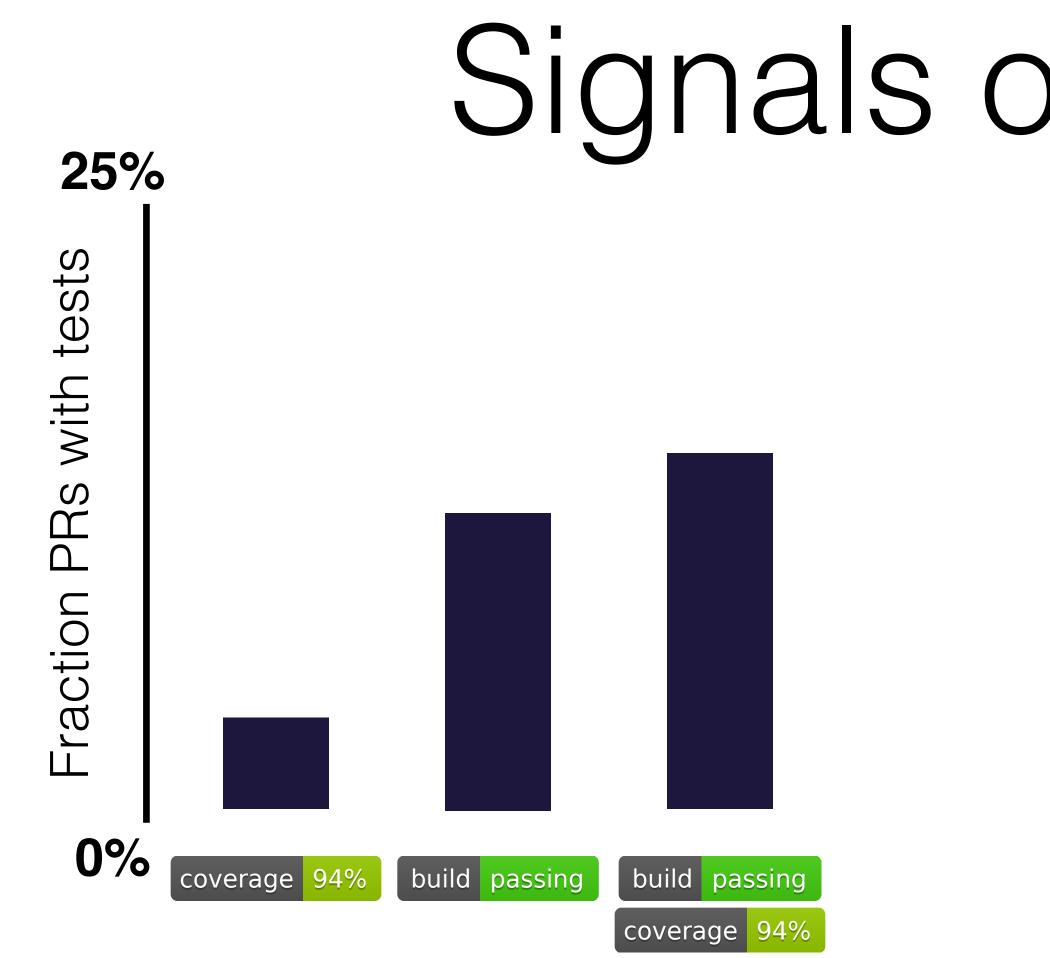


Result: Build status+code coverage badges indicate *more tests in PRs*



Signals of PR quality

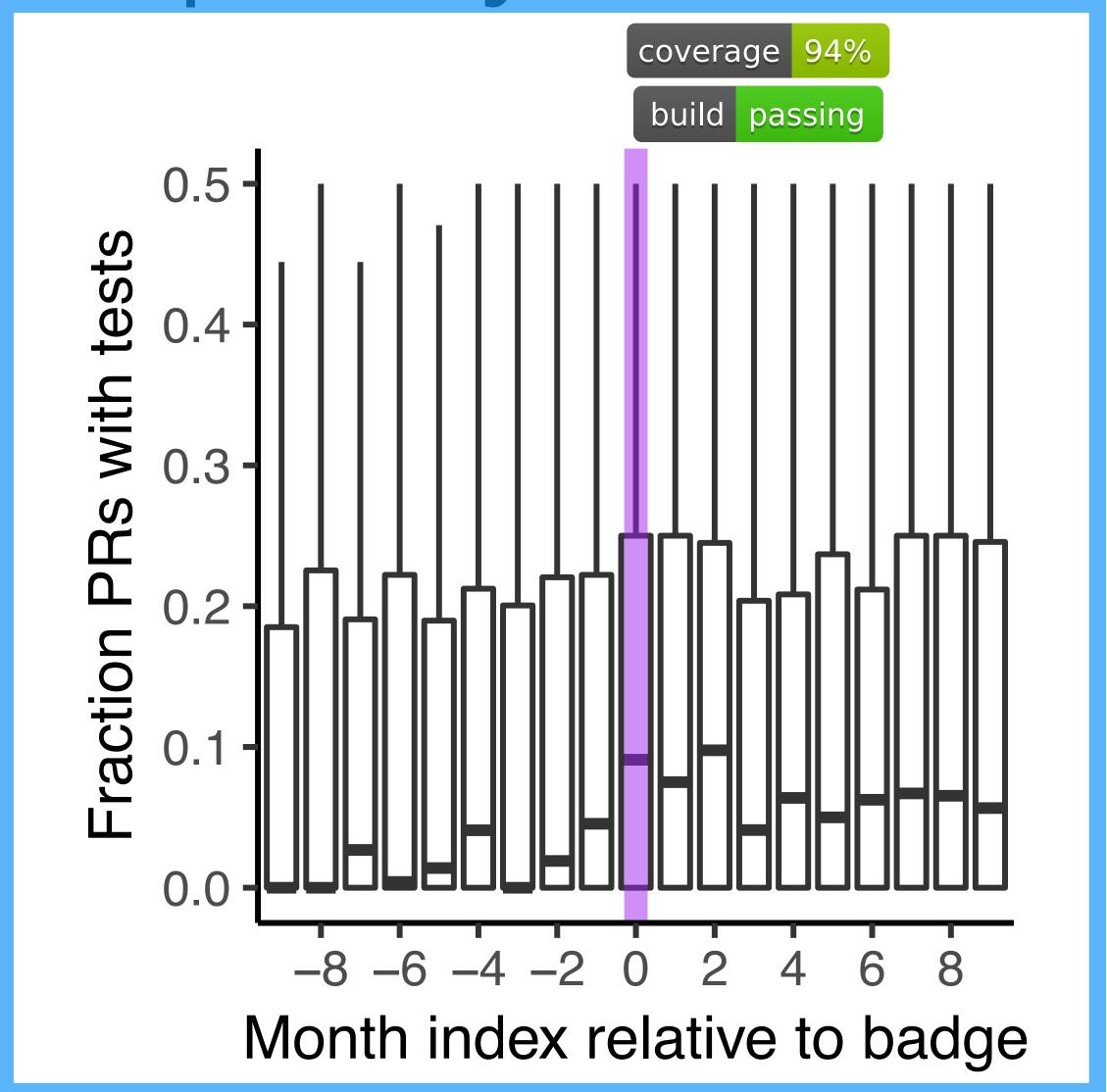


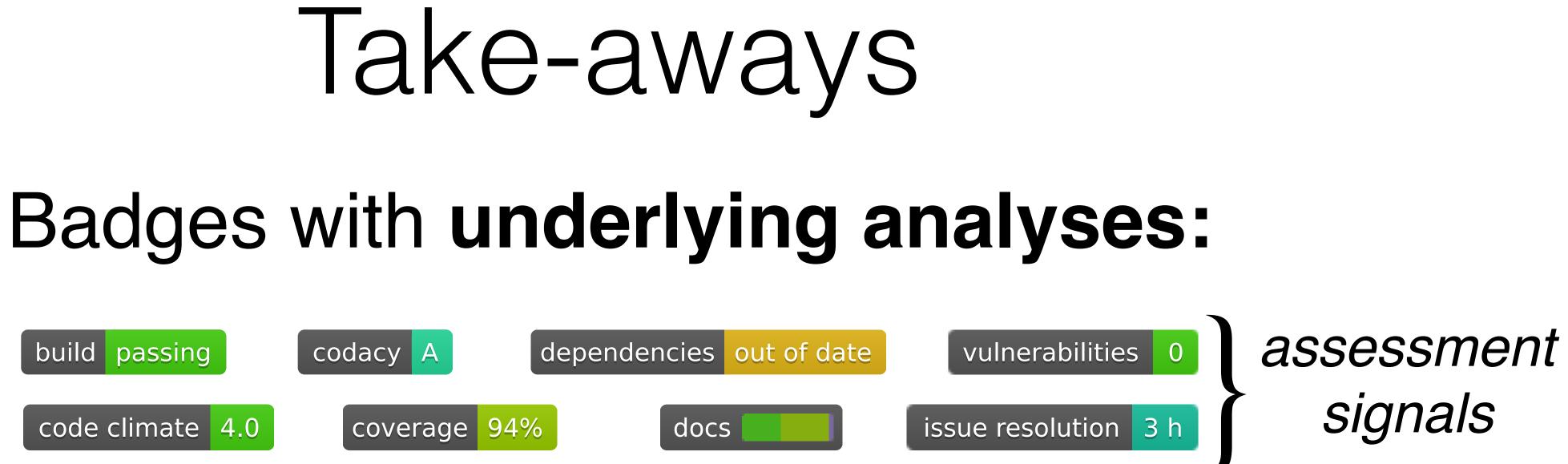


Result: Build status+code coverage badges indicate *more tests in PRs*



Signals of PR quality





are stronger predictors than badges that merely state intentions or provide links:





When possible, design or choose the badge that takes the most work:

slack 6/160

assessment signal

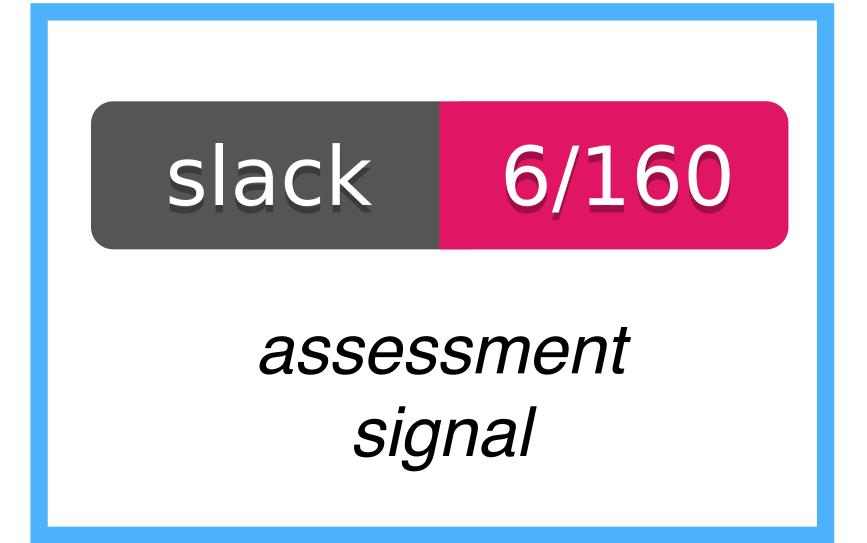






conventional signal

When possible, design or choose the badge that takes the most work:









conventional signal

Adding Sparkle to Social Coding: An Empirical Study of Repository Badges in the npm Ecosystem

	O Watch + 417 ★ Star 18,384 Ÿ For	Users	
② 2,199 commits > 17 branches Branch: master * New pull request ⑦ mikeal committed on Soo 27, 2017 2.83.1 ⓐ _github small change to template	M N		Survey
Adds examples Adds example for Tor pro tib refactor(int): replace edil tests lint fix, PR from pre-stand glignore Updating deps. travis.yml Add Node,is V8 to Travis t CHANGELOG.md Update changelog CONTRIBUTING.md Update contributing guid	1 1 ard was merged with passing tests 10 mc ard was merged with passing tests 5 mc 21 7 mc 21 11 mc	ears ago	 32 maintainers, 57 contr Maintainers: What do you intend to
LICENSE Adding license informatio		Public contributions Felo Mar Agr Mar Jan Mar Agr Or Mar Jan	What effects do you e
	Organizations	Summary of pull requests, issues opened, and commits. Learn how we count contributions. Less More Contributions in the last year Longest streak Current streak	 Contributors: What do badges tell y
STREDEL Carnegie Mellon University	Organizations		 Contributors: What do badges tell y STR DEL Carnegie Mellon University
	<u>م</u> الا الم	Image: Second	• What do badges tell y STR DEL Carnegie Mellon University
Carnegie Mellon University <u>Step 2: Time Serie</u>	s Analysis	Contributions in the last year 1,886 total 37 days 7 days	• What do badges tell y STR DEL Carnegie Mellon University
Step 2: Time Serie Signals o	es <u>Analysis</u> of fresh de	Contributions in the last year 1,886 botal Jan 24,2015 – Jan 24,2018 Longest streak 37 days Codoter 7 – November 12 Convertige 12 January 18 – January 24	 What do badges tell y STR
Step 2: Time Serie Signals O	es <u>Analysis</u> of fresh de dependence	Image requestion to the last year Image statesk: Corretation Corretation Corretation 1,886 bit2al 24,5015 - Jan 24, 2016 Image statesk: Corretation Corretation Corretation 1,886 bit2al Corretation Corretation Corretation Corretation Sector 1,886 bit2al Corretation Corretation Corretation Corretation Sector 24,5015 - Jan 24, 2016 Corretation Corretation Corretation Sector Corretation Corretation Corretation Co	• What do badges tell y STREDEL Carnegie Mellon University T design or choose the
Step 2: Time Serie Signals o	es <u>Analysis</u> of fresh de dependence	In the rest of the last year 1,886 for Last 2008 2 - An 04,2019 An 24, 2019 - An 04,2019 Coder 7 - November 12 Coder 7 - No	• What do badges tell y STREDEL Carnegie Mellon University design or choose the slack 6/160
Step 2: Time Serie Signals O	es <u>Analysis</u> of fresh de dependence	Image request of the last year 1,886 total 2015 - Jan 24, 2013 Longest areak 37 days Coder 7 - November 12 Our et aleak 7 days 2000 - 7 - November 12 Our et aleak 7 days 2000 - 7 - November 12 Spectral of the last year 1,886 total 0 date Decomposition of the last year 1,886 total 0 date Our et aleak 7 days 2 date Our et aleak 7 days 2 date Our et aleak 7 days 2 date Image request of the last year 1 date Image request of the last year 1 date Our et aleak 7 days 2 date Our et aleak 7 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request of the last year 1 date Image request year 1 date Image request year 1 date Image request year 1 date Image request year 1 date Image request year 1 date Image request year 1 date Image request year 1 date Image request year 1 date Image request year	• What do badges tell y STREDEL Carnegie Mellon University design or choose the slack 6/160
Step 2: Time Serie Signals O	es Analysis of fresh de dependent ore Badge	In the rest of the last year 1,886 for Last 2008 2 - An 04,2019 An 24, 2019 - An 04,2019 Coder 7 - November 12 Coder 7 - No	• What do badges tell y STREDEL Carregie Mellon University T design or choose the slack 6/160 assessment

codacy 🗛

Carnegie Mellon University

coverage 94% license BSD c

thods study



Repository Mining

- 294,941 *npm* packages
- Mined badge adoptions/removals
 from README files
- Measured proxies for code quality, test suite quality, popularity, dependency freshness, ...

-aways

possible, ge that takes the **most work:**



signal

Contact: asher.trockman@gmail.com https://cmustrudel.github.io

badges mostly reliable

https://cmustrudel.github.io/badges

