

A/B Testing

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INLS 509: Information Retrieval

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- **Credits:** these slides borrow heavily from examples and figures from Ron Kohavi's presentations on A/B testing at Microsoft (available online)

Introduction

- Systems (e.g., search systems) are always trying to improve
- **Basic question:** If a specific change is introduced, will it improve key metrics?
- **Metrics:** measures that are believed to be correlated with the quality of the user experience
- Metrics are often things we want to minimize or maximize
- Examples?

A/B Testing

- Experiments where different populations of users are exposed to different versions of the system for a period of time
- **Control group:** group of users exposed to the “normal” or “baseline” version of the system
- **Experimental group:** group of users exposed to the experimental version of the system
- More often A/B/C/D/E... testing
- Search companies can have about 15 different A/B tests happening at once
- $5^{15} = 30,517,578,125$

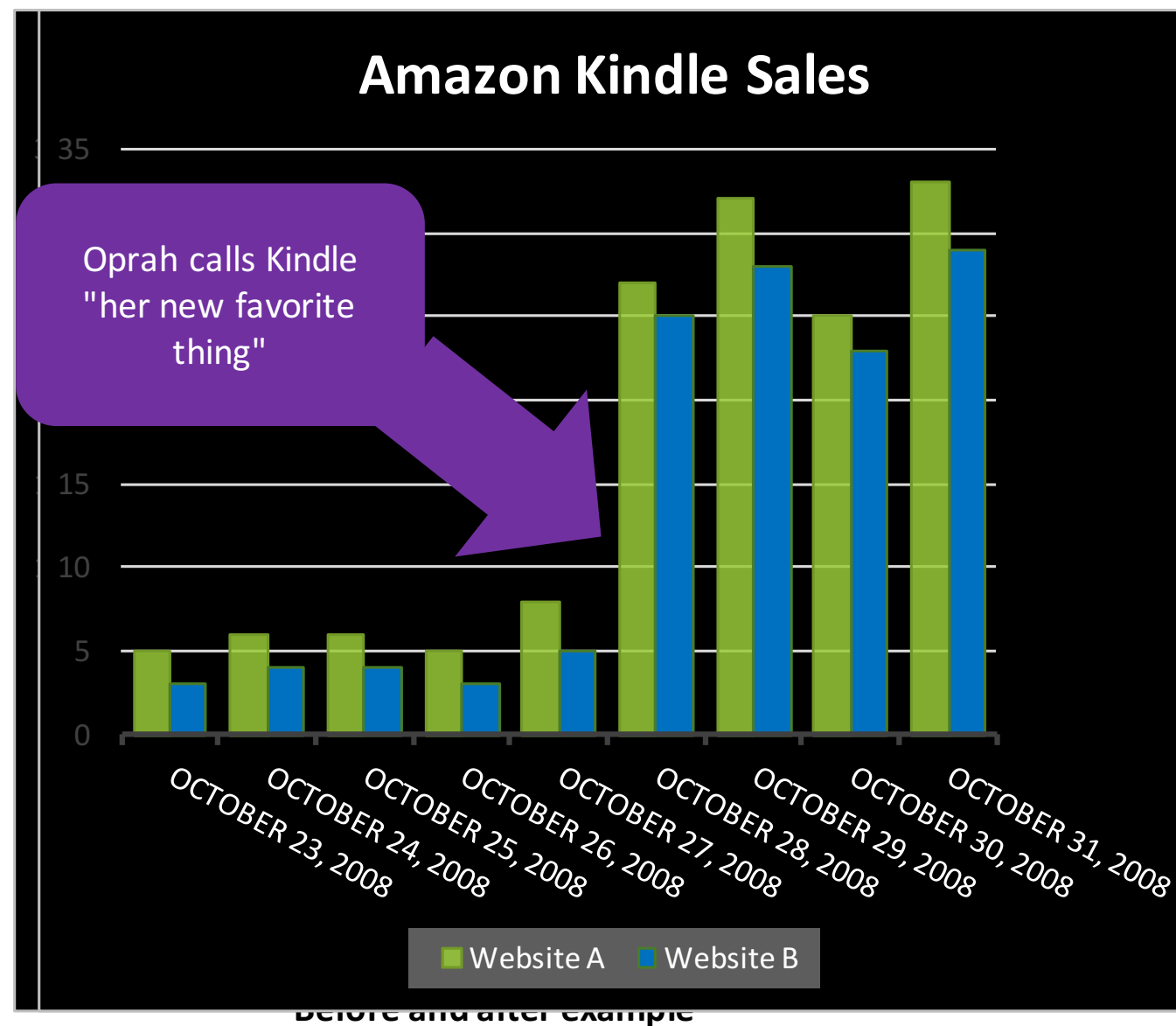
The Alternative

- Make the change and measure the same metrics.
- Why is this a bad idea?

The Alternative

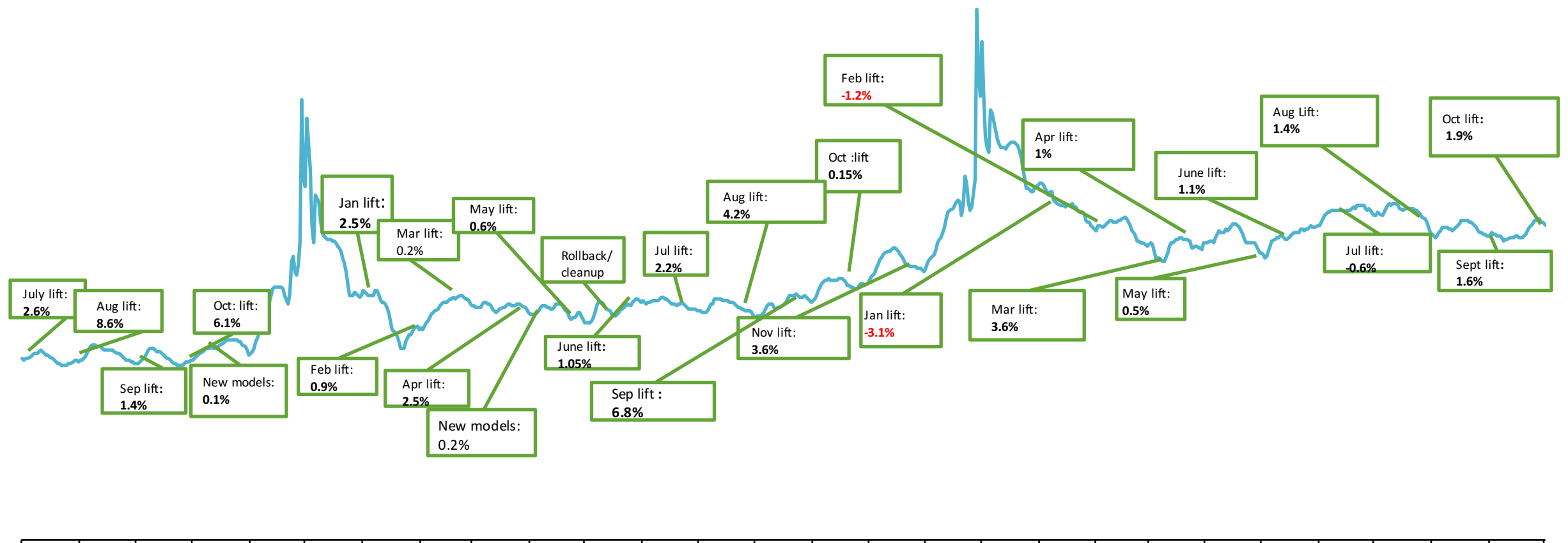
- Make the change and measure the same metrics.
- Why is this a bad idea?
 1. Temporal changes
 2. Good features lead to incremental improvements
 3. It's difficult to assess the value of ideas

Temporal Changes



Source: <http://exp-platform.com/2017abtestingtutorial/>

Temporal Changes + Incremental Improvements



Source: <http://exp-platform.com/2017abtestingtutorial/>

Predicting the value of new features

- 1/3 of ideas improve the intended metric(s)
- 1/3 of ideas have no effect
- 1/3 of ideas degrade the intended metric(s)

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Predicting the value of new features

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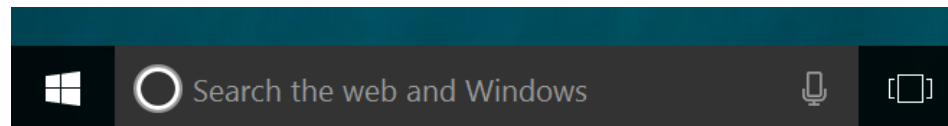
Flowers at 1-800-FLOWERS® | 1800flowers.com 1800Flowers.com
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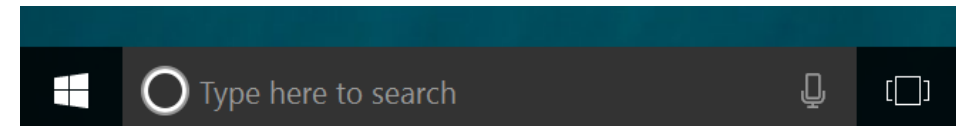
\$19.99 - Cheap Flowers - Delivery Today By A Local Florist! www.FromYouFlowers.com
Shop Now & Save \$5 Instantly.

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(1) Predicting the value of new features



A



B

- Overall Evaluation Criterion: no. of searches
- $A > B$, $A < B$, or $A = B$?

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(2) Predicting the value of new features

The image shows a Bing search results page for the query "kdd 2015". The search bar at the top shows the query and the Bing logo. Below the search bar, there are tabs for "Web", "Images", "Videos", "Maps", "News", and "Explore". The "Web" tab is selected. The search results are displayed in a list format, with each result numbered 1 through 8. The first result is "KDD 2015, 10-13 August 2015, Sydney" with a link to www.kdd.org/kdd2015. The second result is "KDD 2015 - The 21th ACM SIGKDD International Conference ..." with a link to conference.researchbib.com/view/event/33616. The third result is "KDD CUP 2015" with a link to <https://www.kddcup2015.com>. The fourth result is "KDD 2015 : ACM SIGKDD Conference on Knowledge Discovery ..." with a link to myhuiban.com/conference/136. The fifth result is "KDD 2015 -ACM SIGKDD International Conference on ..." with a link to www.ourglocal.com/wikicfp/?conid=37&year=2015. The sixth result is "KDD-2015 Call for Papers, Workshop proposals - KDnuggets" with a link to www.kdnuggets.com/2015/01/kdd-2015-call-papers.html. The seventh result is "KDD 2015 | 21st ACM SIGKDD Conference on Knowledge ..." with a link to eventegg.com/kdd-2015. The eighth result is "KDD 2015 : 21th ACM SIGKDD Conference on Knowledge ..." with a link to www.wikicfp.com/cfp/servlet/event.showcfp?eventid=40581. On the right side of the page, there is a summary box for "KDD 2015" with details about the conference, including dates, location, subjects, website, and submission deadline. Below the summary box, there are sections for "People also search for" and "Related searches".

bing kdd 2015

Web Images Videos Maps News Explore

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1 **KDD 2015, 10-13 August 2015, Sydney**
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KDD 2015 is a premier conference that brings together researchers and practitioners from data mining, knowledge discovery, data analytics, and big data.
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Research Track
ACM SIGKDD Invitation to Participate - 2015 KDD Conference August ...

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KDD 2015 will be held between 10-13 August 2015 in Sydney. ...

Tutorials
KDD 2015 Call for Papers, Workshops, Tutorials and ...

Kdd-2014
KDD 2014, a premier interdisciplinary conference, brings together ...

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2 **KDD 2015 - The 21th ACM SIGKDD International Conference ...**
conference.researchbib.com/view/event/33616
KDD 2015 - The 21th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining

Related searches for **kdd 2015**
KDD 2014 KDD Sydney
KDD Cup 2015 PAKDD 2015
WSDM 2015 KDD 2016

3 **KDD CUP 2015**
<https://www.kddcup2015.com>
If you have any questions or comments, please send an email to support@kddcup2015.com. Updates: 1) Many people have asked the definition of ...

4 **KDD 2015 : ACM SIGKDD Conference on Knowledge Discovery ...**
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The Latest Computer Conference and Journal List ... KDD 2015 : ACM SIGKDD Conference on Knowledge Discovery and Data Mining

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www.ourglocal.com/wikicfp/?conid=37&year=2015
KDD 2015 - ACM SIGKDD International Conference on Knowledge Discovery and Data Mining. Send this CFP to us by mail: cfp@ourglocal.org. Introduction: SIGKDD aims to ...

6 **KDD-2015 Call for Papers, Workshop proposals - KDnuggets**
www.kdnuggets.com/2015/01/kdd-2015-call-papers.html
ACM SIGKDD Conference on Knowledge Discovery and Data Mining(KDD) 2015 will be held in Sydney, Australia during August 10-13, 2015. KDD invites submissions of ...

7 **KDD 2015 | 21st ACM SIGKDD Conference on Knowledge ...**
eventegg.com/kdd-2015
KDD 2015, 21st ACM SIGKDD Conference on Knowledge Discovery and Data Mining, Australia, Sydney, 10 - 13 August 2015

8 **KDD 2015 : 21th ACM SIGKDD Conference on Knowledge ...**
www.wikicfp.com/cfp/servlet/event.showcfp?eventid=40581
KDD 2015 : 21th ACM SIGKDD Conference on Knowledge Discovery and Data Mining. Home. Login; Register; Account; Logout; Categories CFPs. Post a CFP; Conf ...

KDD 2015
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wikicfp.com
Dates: Aug 10 - 13, 2015
Location: Sydney
Subjects: Data mining · Database · Knowledge extraction
Website: KDD 2015
Submissions due: Feb 20, 2015

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ICDM 2015 (Nov 14, 2015)
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KDD Sydney
SIGIR 2015
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1 2 3 4 5 →

Source: <http://exp-platform.com/2017abtestingtutorial/>

(2) Predicting the value of new features

10 search results

A

8 search results

B

- Overall Evaluation Criterion: clickthrough rate 1st SERP per query
- $A > B$, $A < B$, or $A = B$?

Source: <http://exp-platform.com/2017abtestingtutorial/>

(3) Predicting the value of new features

Esurance® Auto Insurance - You Could Save 28% with Esurance. Ads
www.esurance.com/California
Get Your Free Online Quote Today!

A

Esurance® Auto Insurance - You Could Save 28% with Esurance. Ads
www.esurance.com/California
Get Your Free Online Quote Today!
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B

- Overall Evaluation Criterion: revenue
- 4 A ads for every 3 B ads
- $A > B$, $A < B$, or $A = B$?

Source: <http://exp-platform.com/2017abtestingtutorial/>

Challenges in A/B Testing

- Correlation does not imply causation
- Understanding how short-term metrics (measured during A/B tests) lead to long-term improvements in user experience and/or revenue
- Using the wrong metric
- Unexpected effects on important metrics
- Making claims not exactly tested
- Bugs in the experimental infrastructure
- Using sound statistical methods
- Hurting the user experience

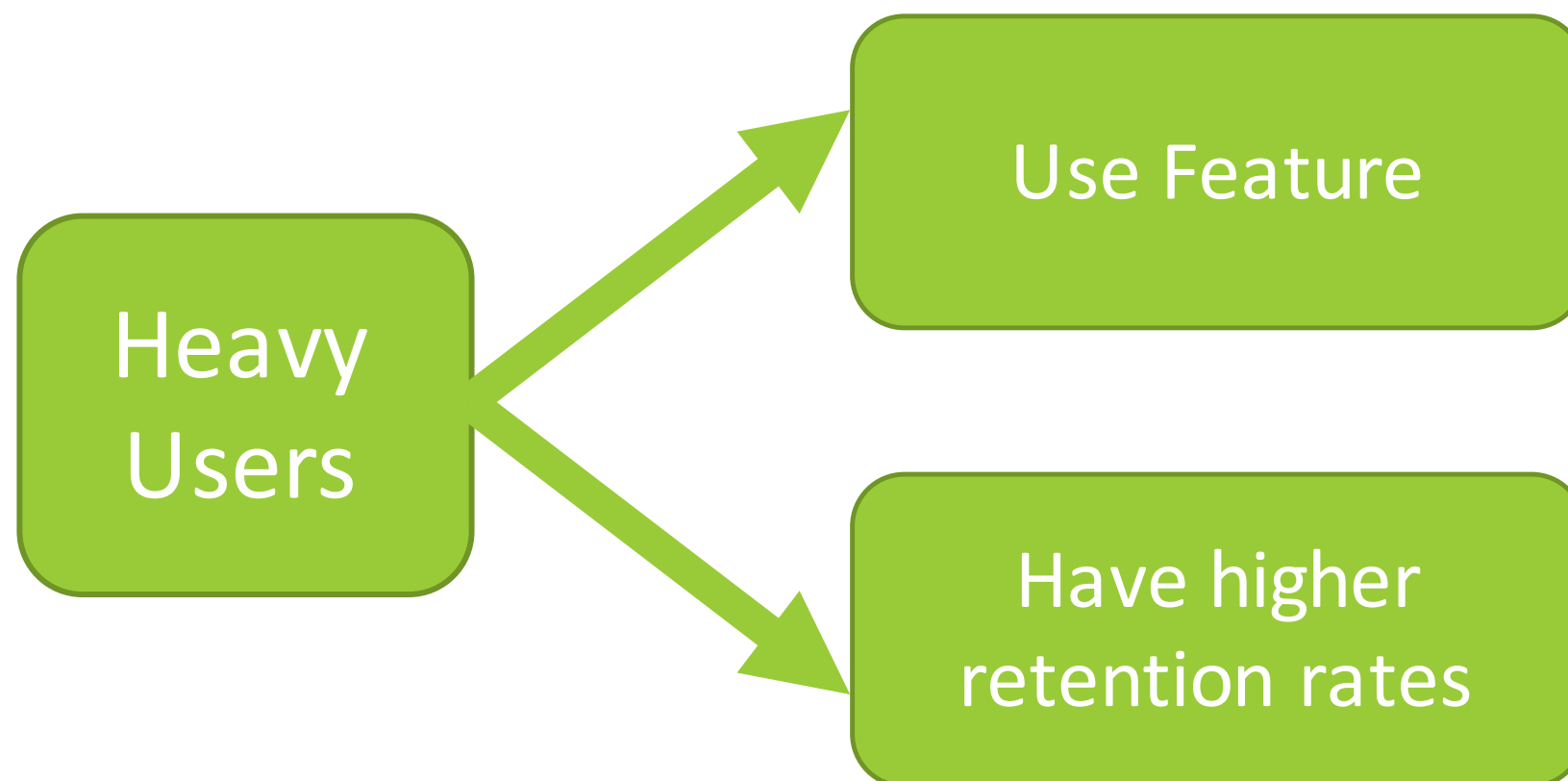
Correlation does not Imply Causation

- Umbrellas cause rain
- People with small hands live longer
- A new feature (e.g., a new advanced search tool) increases retention rate

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Correlation does not Imply Causation

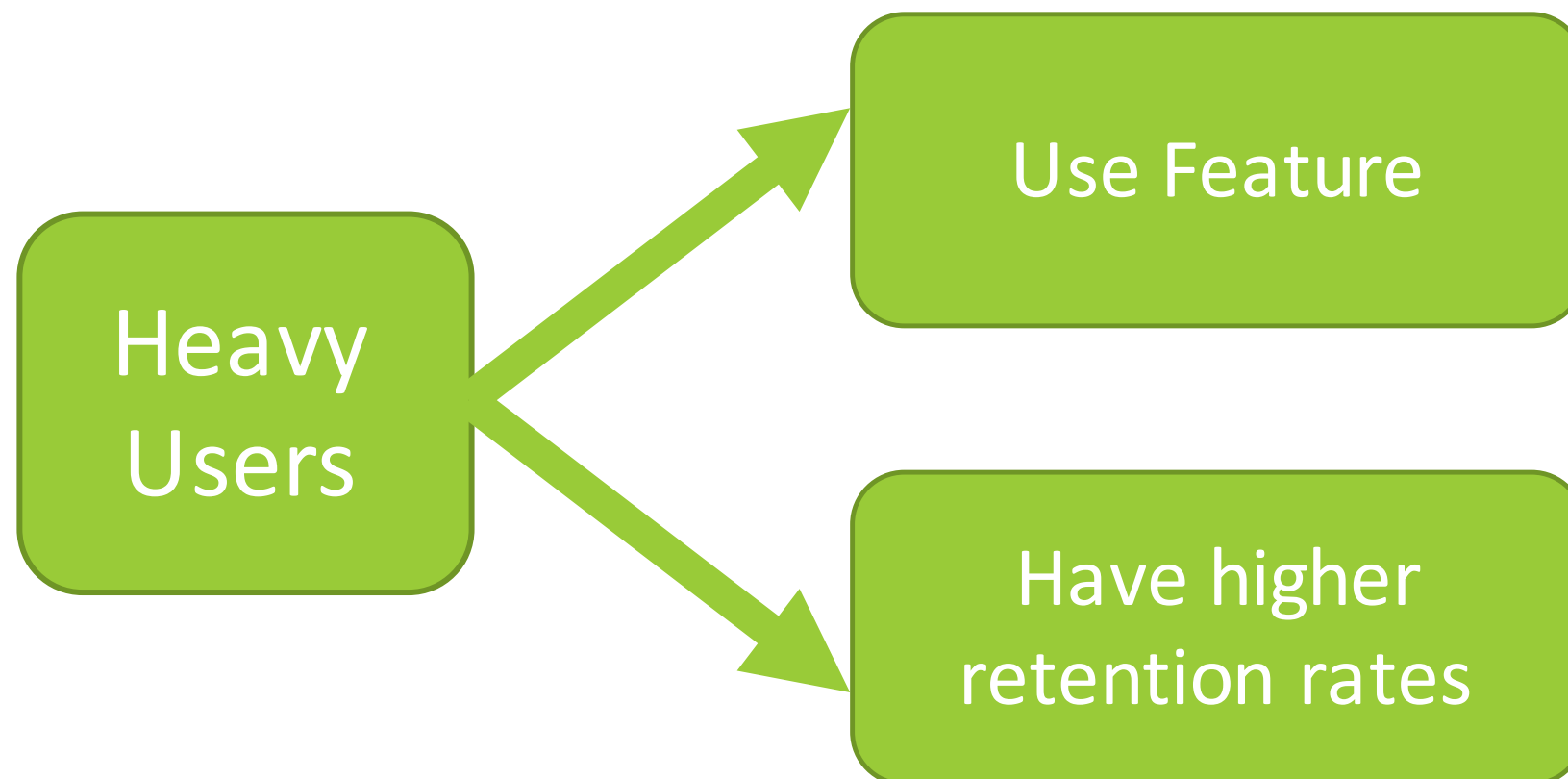
- Particularly important for understanding the impact of system features that are used more by certain types of users than others



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Correlation does not Imply Causation

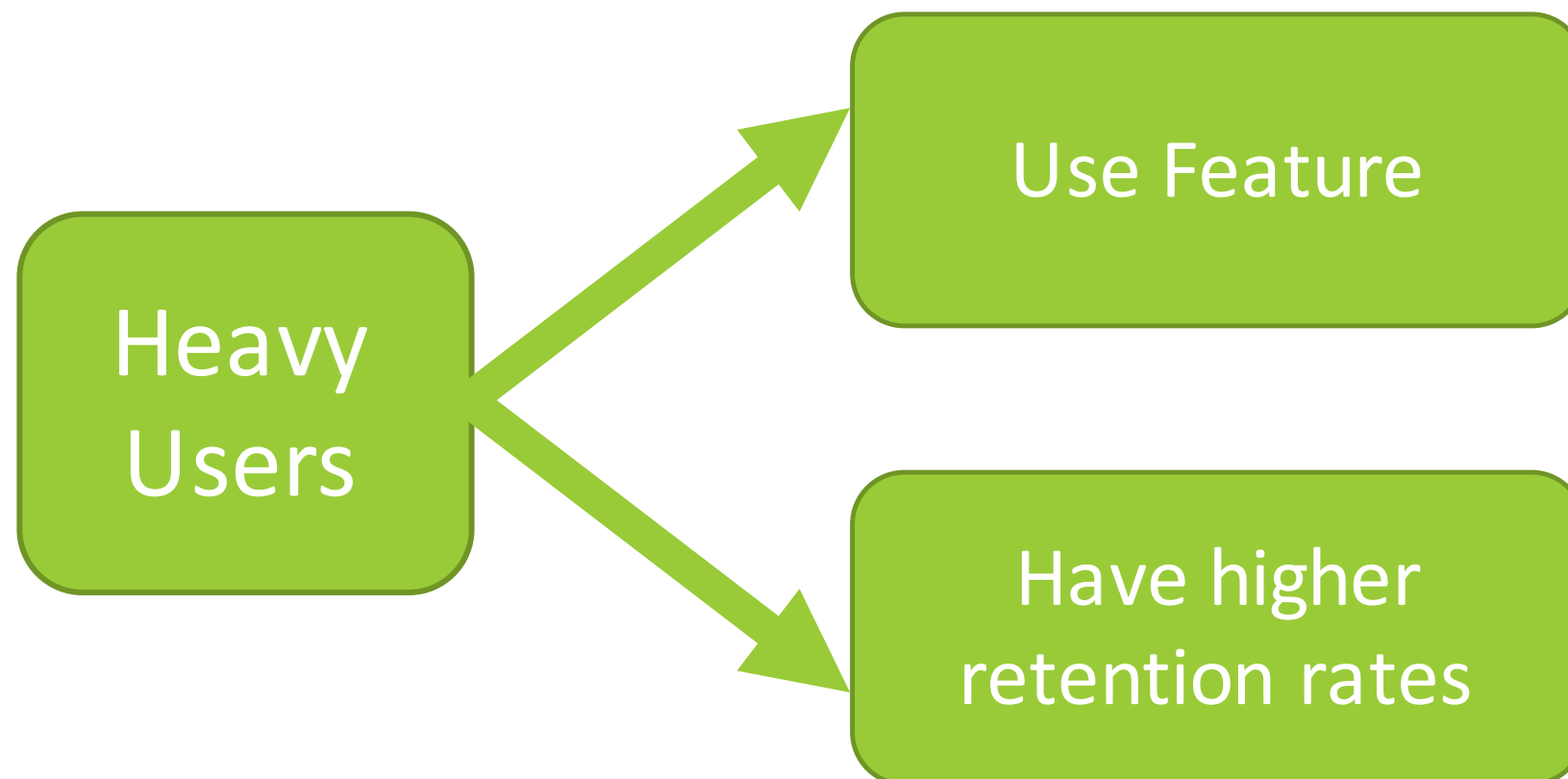
- What are features used more by heavy users?



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Correlation does not Imply Causation

- What are features used more by new users?



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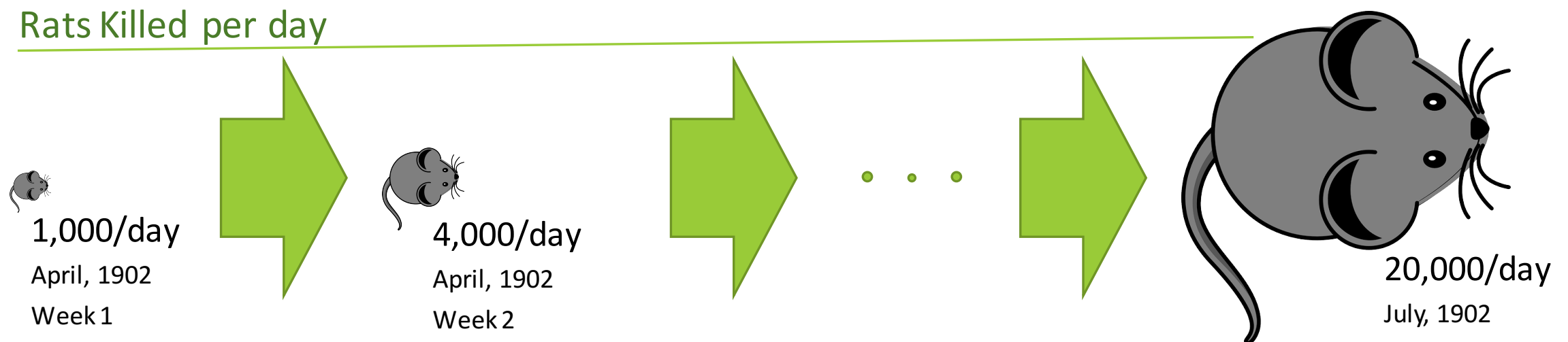
Short-term vs. Long-term Metrics

- An increase in ad clicks suggests an increase in revenue
- Showing lots of ads (often) hurts the user experience and decreases retention (i.e., long-term ad-click revenue)

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Using the wrong metric

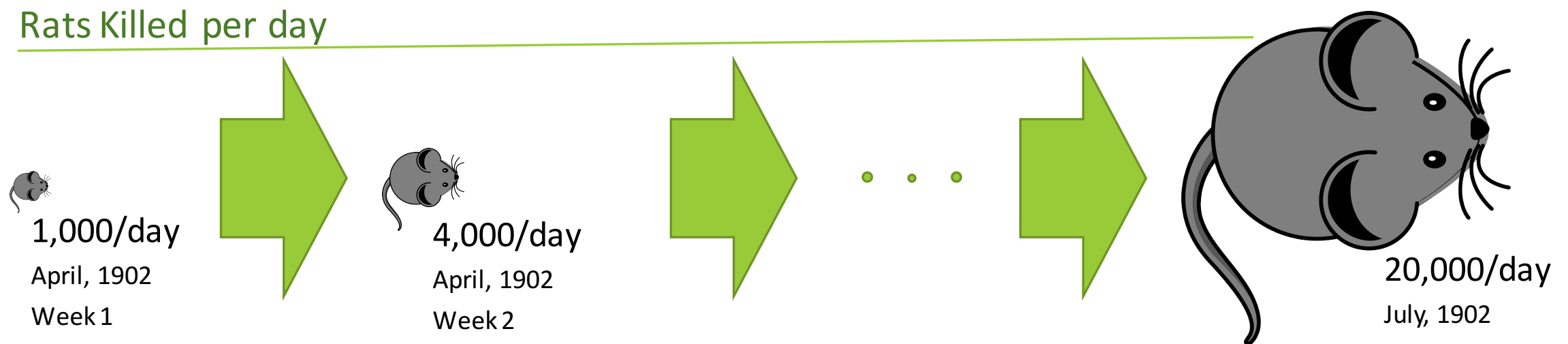
- Hanoi's French Quarter rat problem in 1902



Source: <http://exp-platform.com/2017abtestingtutorial/>

Using the wrong metric

- Hanoi's French Quarter rat problem in 1902



- What you do not measure, does not improve.
- **Goodhart's law:** “when a measure becomes a target, it ceases to be a good measure”

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Unexpected Effects on Important Metrics

- **Example:** a hyperlink on the SERP was changed to open on a new browser tab.
- It increased avg. SERP load time by 8.32%
- Why?

```
<a href="https://www.thesitewizard.com/" target="_blank">thesitewizard.com</a>
```

Source: <http://exp-platform.com/2017abtestingtutorial/>

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Making Untested Claims

- **Question:** What is the effect of SERP load-time on ad-click revenue?
- Artificially increase SERP load-time and measure decrease in ad-click revenue
- Make the claim that decreasing the SERP load-time will have a comparable increase in ad-click revenue
- What's wrong with this?

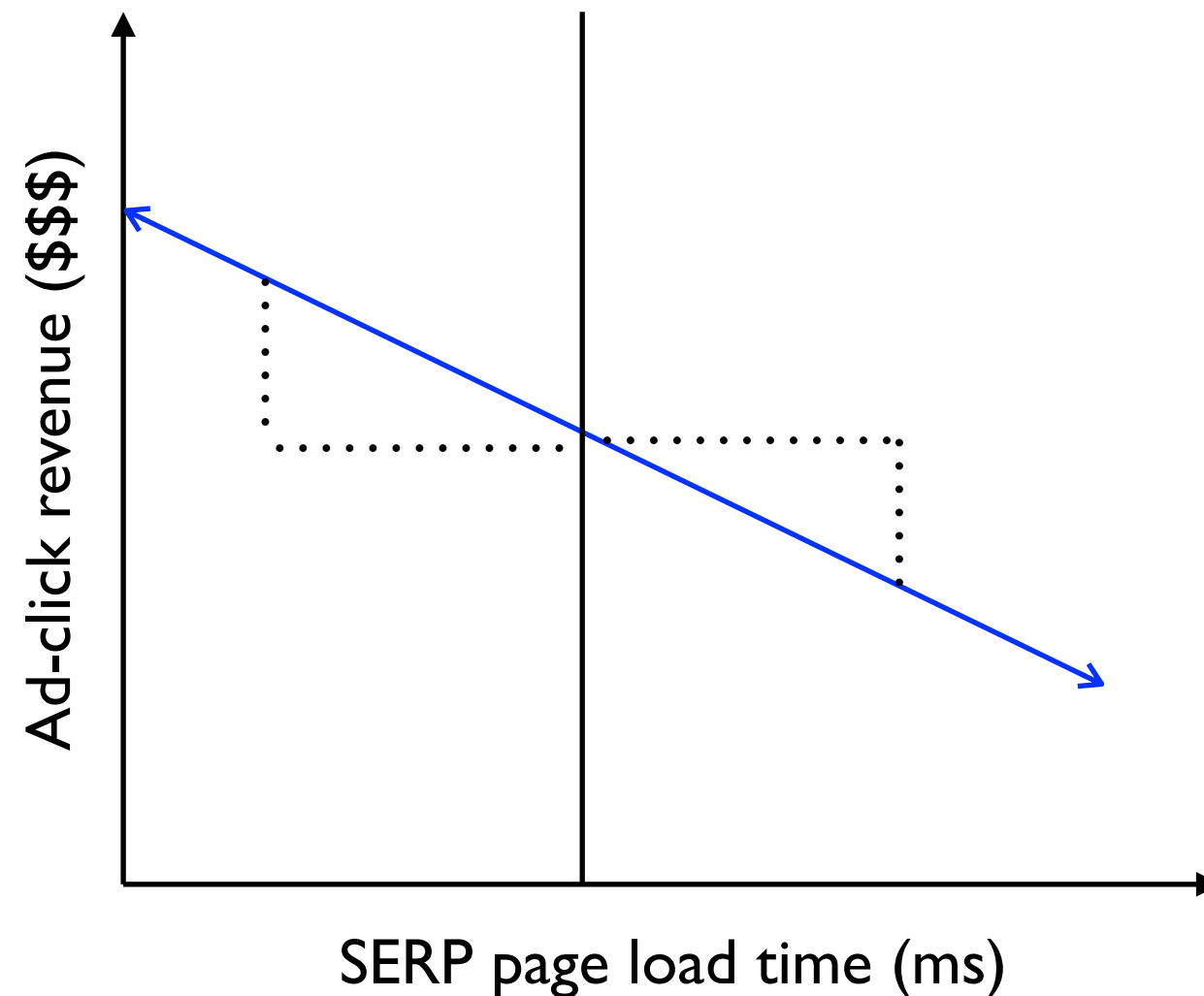
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- Artificially increase SERP load-time and measure decrease in ad-click revenue
- Make the claim that decreasing the SERP load-time will have a comparable increase in ad-click revenue
- What's wrong with this?
- Assumes (bi-directional) linear relationship

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Making Untested Claims

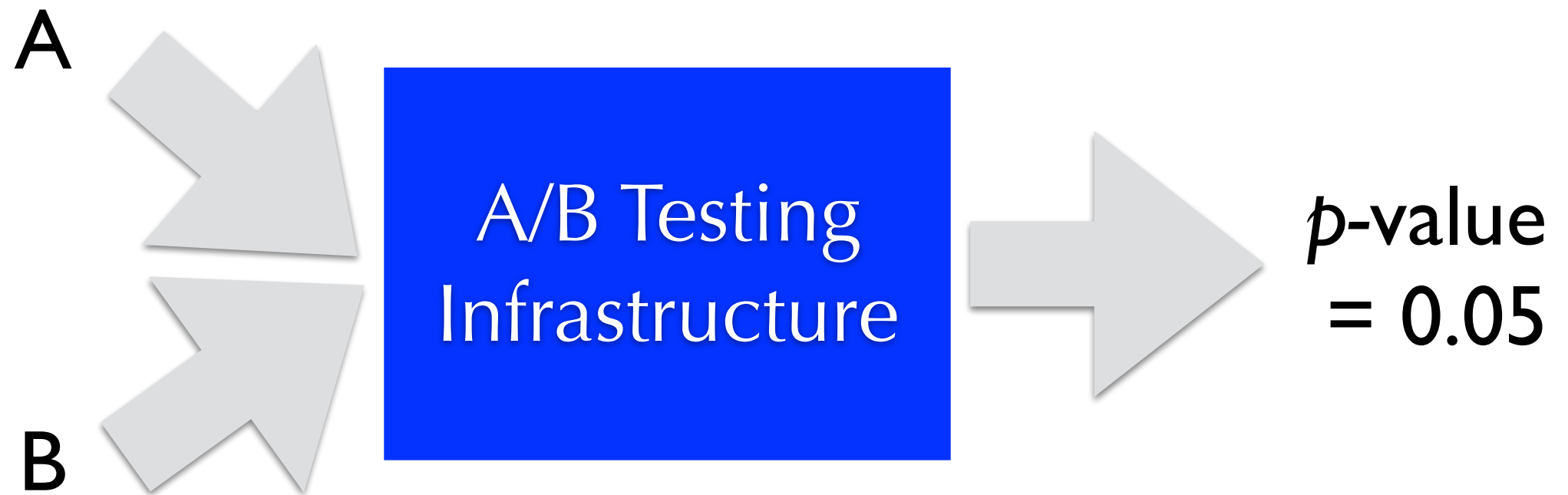


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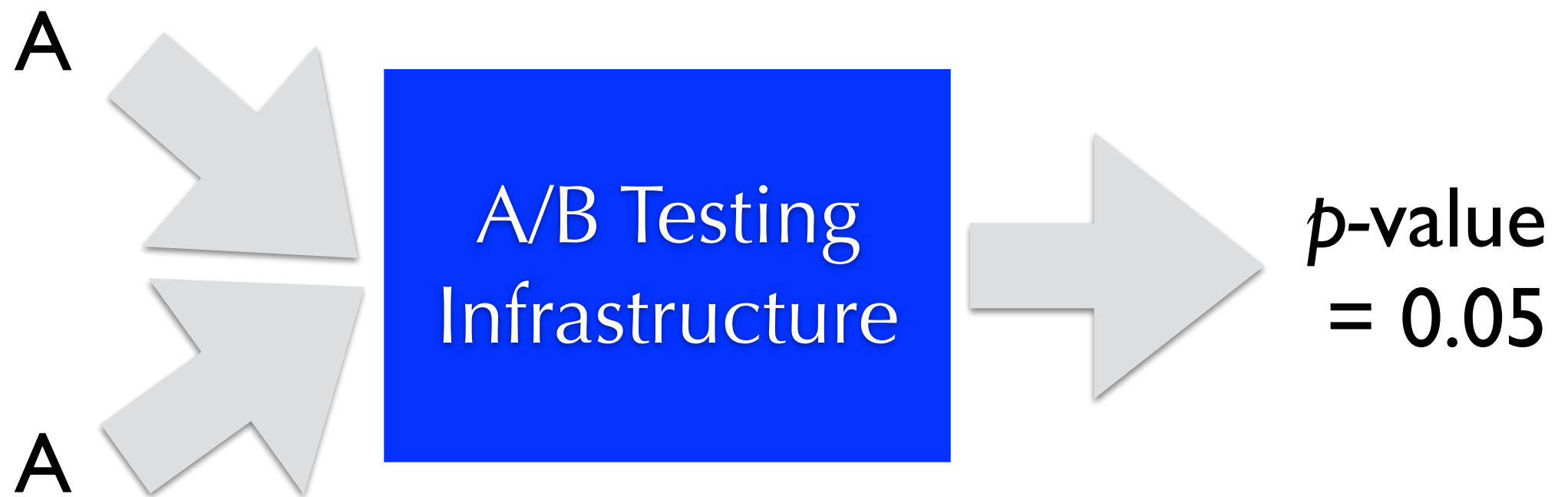
Bugs in the Experimental Infrastructure



- User sampling + measurement + statistics
- How can we debug this infrastructure without opening the “black box”?

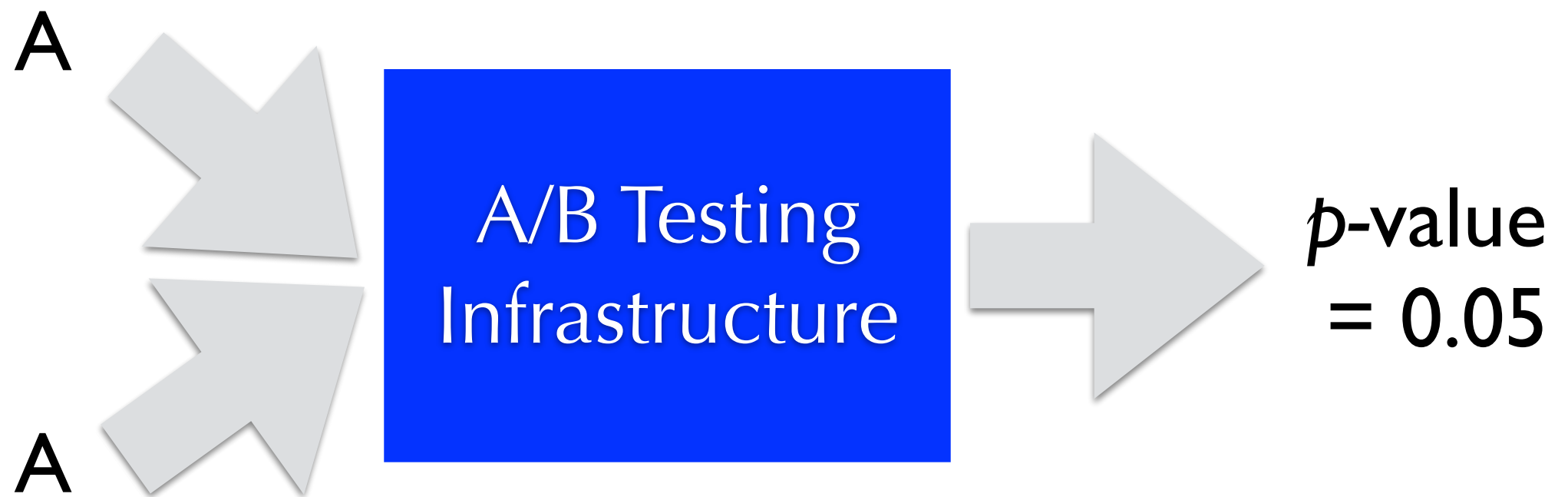
Source: <http://exp-platform.com/2017abtestingtutorial/>

Bugs in the Experimental Infrastructure



- Run lots of A/A tests (no differences between experimental and control conditions)
- How often should we observe a p -value of 0.05 or less?

Sound Statistical Methods



- Even when there is no difference between the two systems, it is still possible to observe a p -value of less than 0.05
- Why?

Sound Statistical Methods

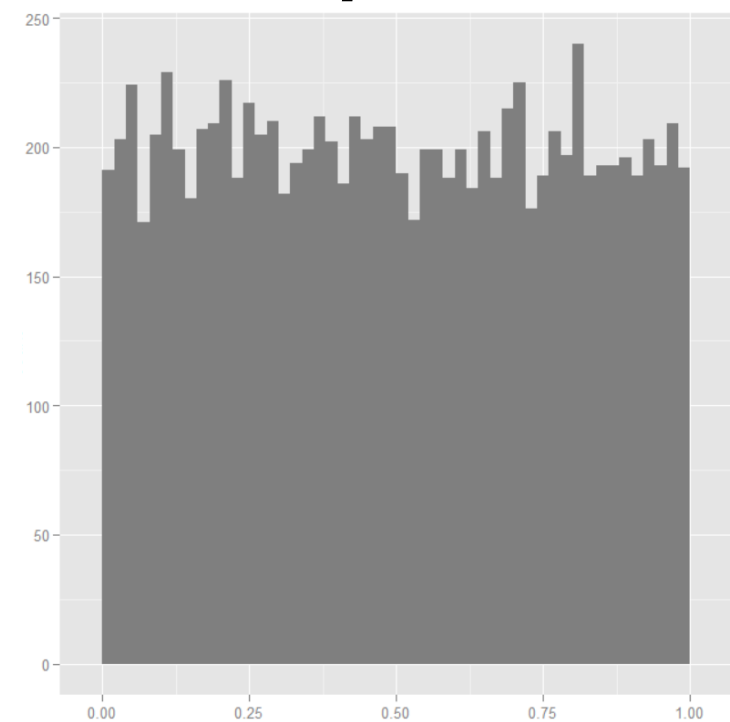
- By definition, the p -value is the probability of the observed difference in means (or a more extreme difference) under the null hypothesis!

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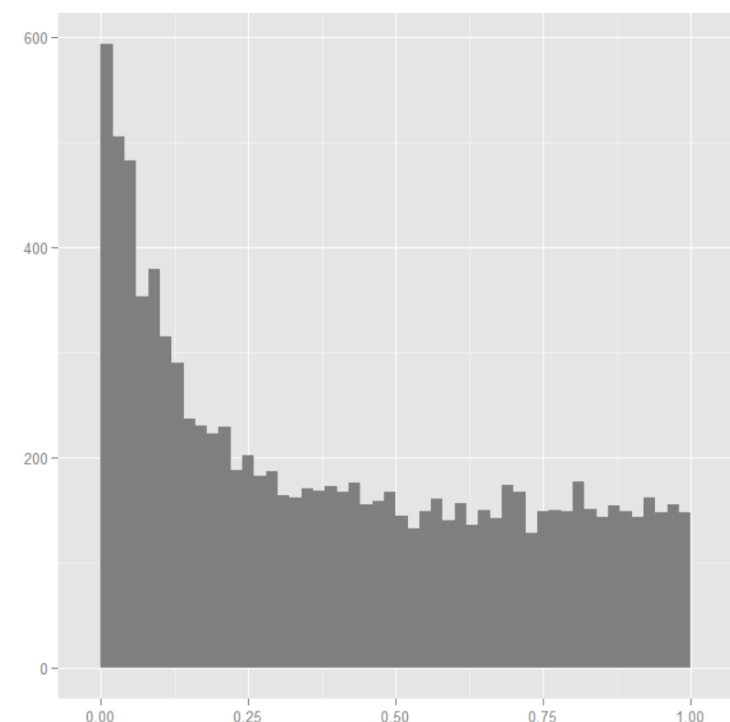
A/A Testing

- Run lots of A/A tests (no differences between experimental and control conditions)
- We should only observe p -values of 0.05 or less about 5% of the time
- The p -value distribution should be uniform rather than skewed to low or high values

Good p -values



Bad p -values



Challenges in A/B Testing

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Causes of Type I Errors (False Positives)

- Running the same A/B test many times until we observe a significant difference
- Using 100+ metrics and focusing on the ones that are significant
- Running an experiment for as long as it takes to reach significance
- Running an experiment and stopping early because we reached significance

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Causes of Type I Errors (False Positives)

- **Bonferroni correction:** multiplying the p -value by the number of comparisons

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Hurting the User Experience

- Less manual monitoring of experiments
- Buggy features or bad ideas
- Interactions between concurrent experiments: the whole is less than the sum of its parts

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Cautionary Steps: Starting Small

- Starting internally (within the company)
- Starting with only a few users
- Starting with only partial exposure (1/10 queries)

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Cautionary Steps: Different types of Metrics

- **Data quality metrics:** ensure that the feature was implemented correctly
- **Overall evaluation criteria:** single metric that measures improvement in user experience (e.g., number of satisfied clicks)
- **Guardrail metrics:** metrics used to shutdown an experiment (e.g., queries with no clicks)
- **Local metrics:** metrics that measure what the user is doing less of (because of the new feature)

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Cautionary Steps: Measuring interactions

Exp. 2

Exp. 1

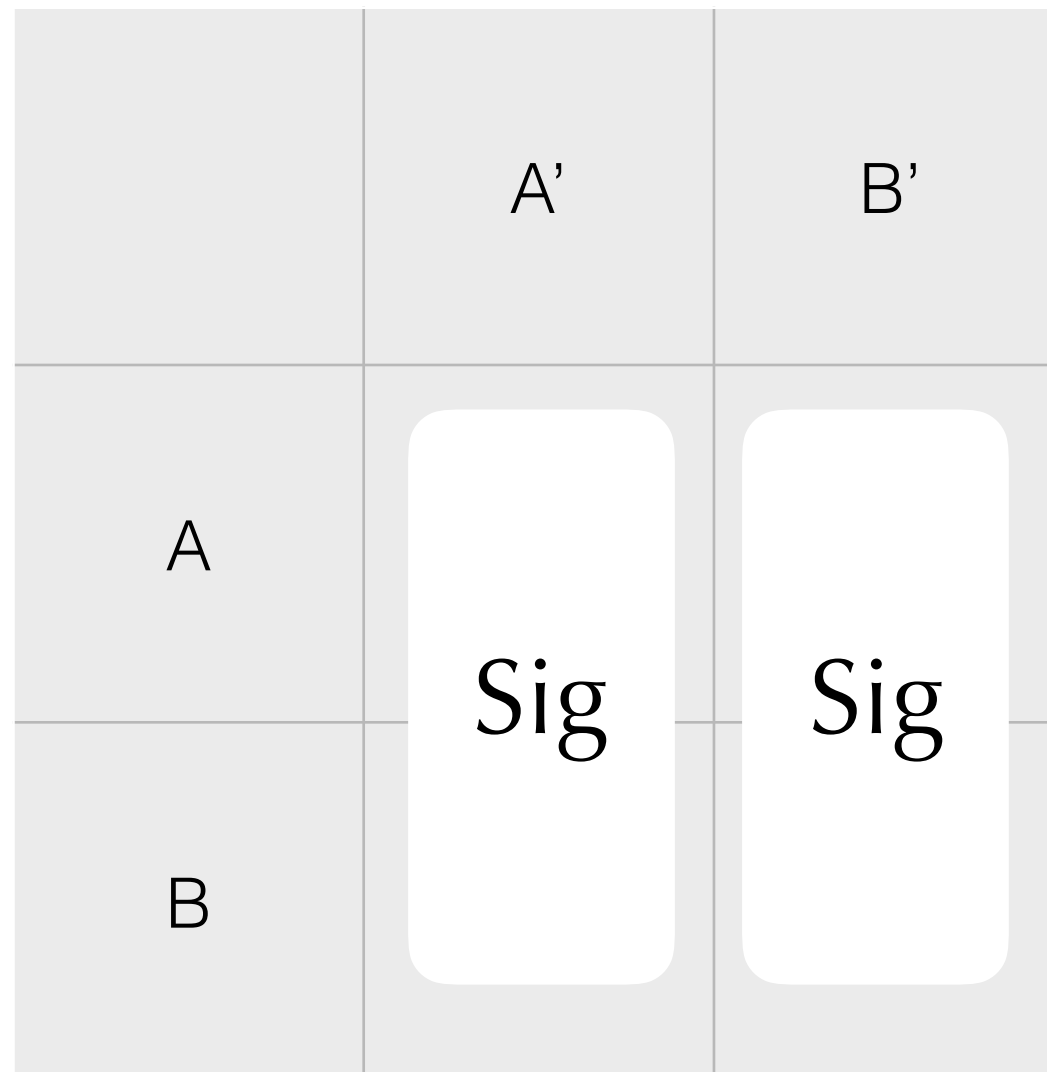
	A'	B'
A	Sig	No Sig
B		

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Cautionary Steps: Measuring interactions

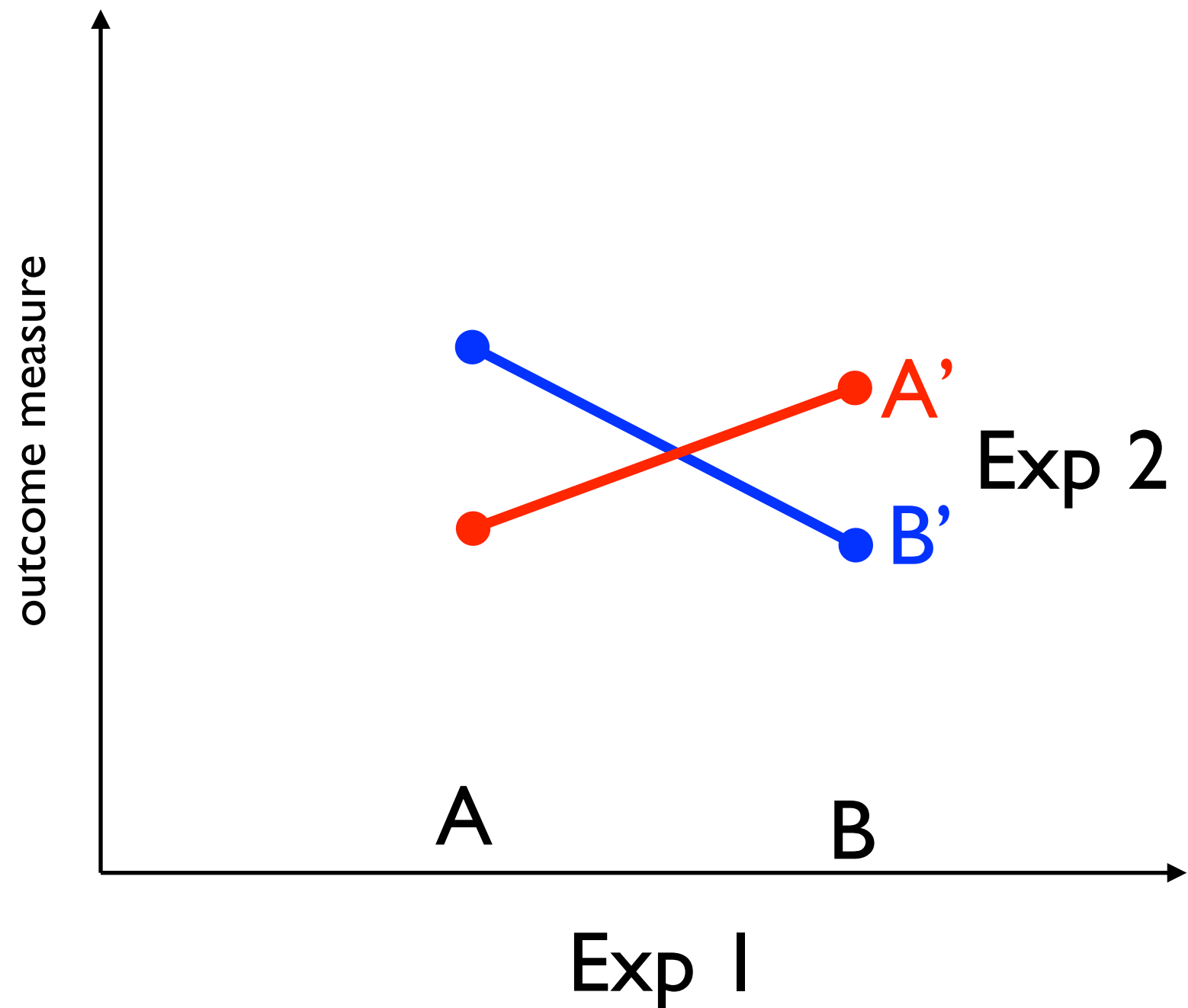
Exp. 2

Exp. 1



Source: <http://exp-platform.com/2017abtestingtutorial/>

Cautionary Steps: Measuring interactions



Source: <http://exp-platform.com/2017abtestingtutorial/>

Ethical Considerations

- System development is influenced by the majority
- Certain communities may be under-represented in the data
- While there is an “average user”, there is also high variance (nobody is close to the average)
- Metrics used in A/B tests are crude measures of “user experience”
- Users may need to experience extreme differences to show (positive or negative) changes in behavior
- A/B tests are done without considering whether the user is in a vulnerable state

Challenges in A/B Testing

- Correlation does not imply causation
- Understanding how short-term metrics (measured during A/B tests) lead to long-term improvements in user experience and revenue
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