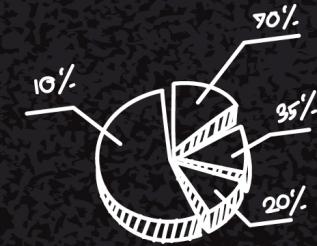


Bigger is Better, but at What Cost?

Towards Understanding the Economic Value of Data



$$a^2 + b^2 = c^2$$

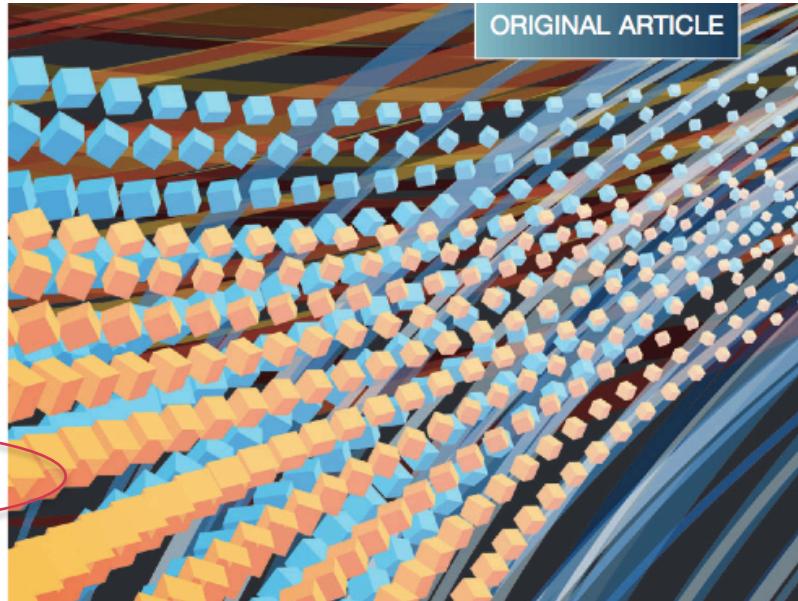
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We are often told that bigger is better.

PREDICTIVE MODELING WITH BIG DATA:

Is Bigger Really Better?

Enric Junqué de Fortuny,[†]
David Martens,[†] and Foster Provost[‡]



ORIGINAL ARTICLE

The answer is usually 'Yes'



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HERE

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but....

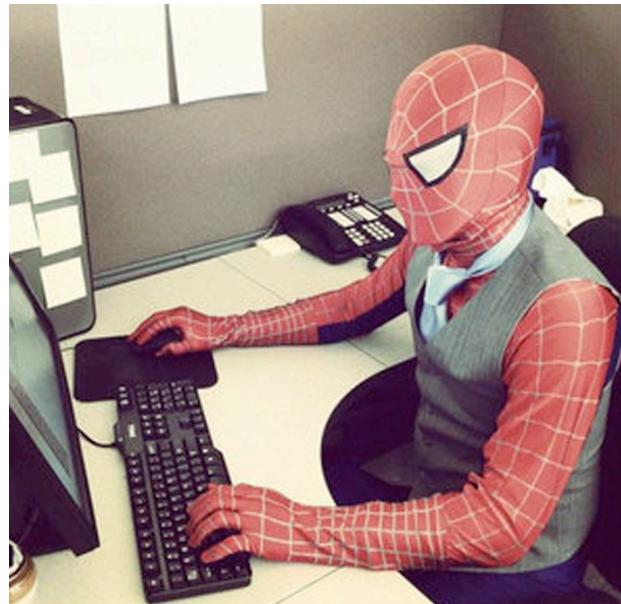
**“With Great Power Comes
Great Responsibility”**

- Peter Parker



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**Big Data =
More Statistical Power**

$$\pi(\tau) \approx 1 - \Phi(1.64 - \tau \sqrt{n}/\hat{\sigma}_D).$$

**And yes
More responsibility**



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#1 responsibility as a manager/executive



Is that extra
statistical power
worth it?



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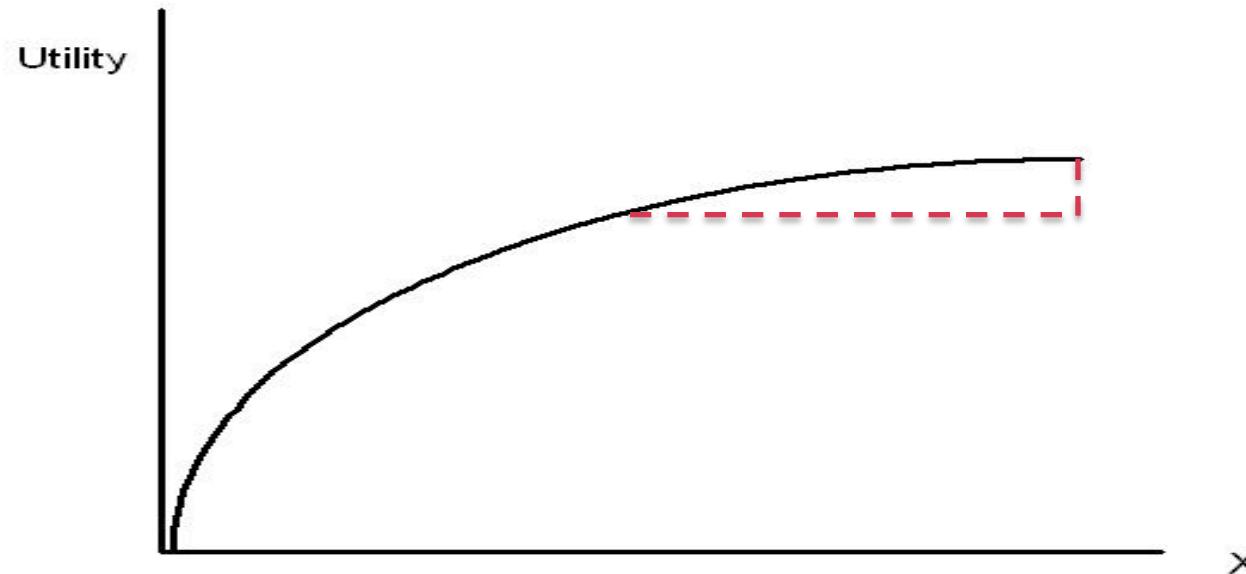
W $73^{\circ} 58' 40''$



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Typical big data trade-off

Doubling the data often doubles the investment, but doesn't double the performance.
Understanding this tradeoff is key to understanding the economic value of data.



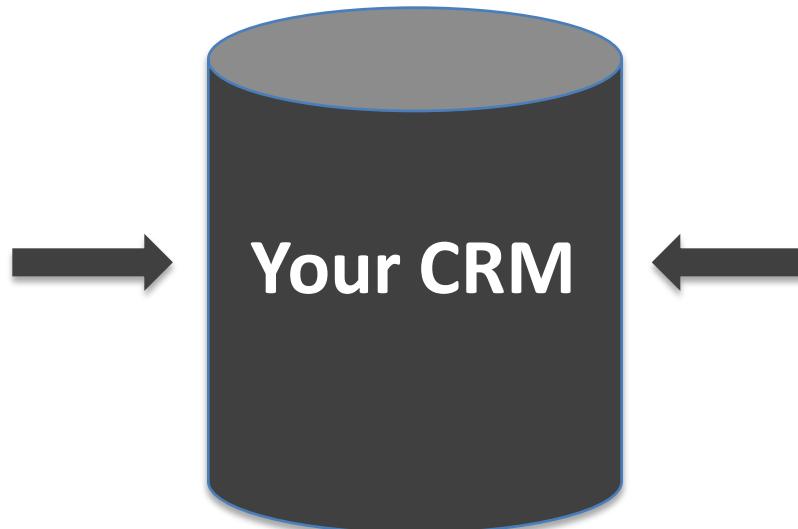
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Common Data Sources

Data Vendors (\$\$\$)

LiveRamp  ACXIOM 
Add This™  Experian™ 
exelate  targeting exchange
bizo 



Customers(CDB*)



*Cost of Doing Business



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2 Follow Up Questions

LiveRamp AXIOM

AddThis Experian

eXelate bluekai

bizo

← 1. How much should you pay for this data?



← 2. How much is a customer's data worth?

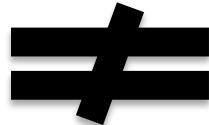


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In Important Inequality

The value
of a customer



The value of
a customer's data

i.e., $\text{value}(\text{customer data}) \neq$

$$\frac{\text{Total Revenue}}{\text{Total Customers}}$$



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An Import Equality

$E[\text{Value of Application} \mid \text{with Data}]$

– $E[\text{Value of Application} \mid \text{w/o Data}]$

Value of Data



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An Import Equality

$E[\text{Value of Application} | \text{with Data}]$

– $E[\text{Value of Application} | \text{w/o Data}]$

Value of Data

This equation offers important lessons about the value of data!



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Lesson 1: Data Has No Intrinsic Value

The VOD is tied to applications/actions derived from data.



Show me an ad,
Recommend a product,
Give me a loan etc.



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Caveat 1: *What is an outcome worth?*

With an application defined, need to know the value of various outcomes.

Lets assume a click is worth:



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Caveat 2: Application Scale Matters.

If data is free to duplicate, VOD depends on scale too.



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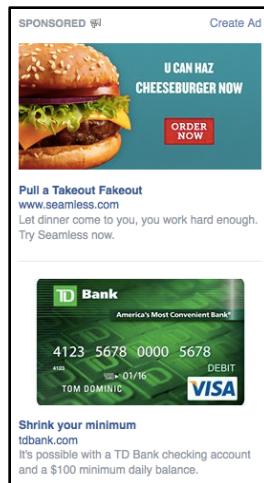
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Lesson 2: The VOD is Counterfactual

Data has \$ value if using it generates more \$ than a baseline strategy.

Without my data,
you show this ad.

P(Click)=1%



VS.



With my data, you
show this ad.

P(Click)=5%



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The VOD Calculus

Let's put our equation to work.

$$V(\text{Click}) * [E(\text{Click} | \text{Data, Targeted Ad}) - E(\text{Click} | \text{noData, Default Ad})]$$

$$EV(\text{my Data in Targeting Ad}) = \$1 * [5\% - 1\%] = \boxed{\$0.04}$$



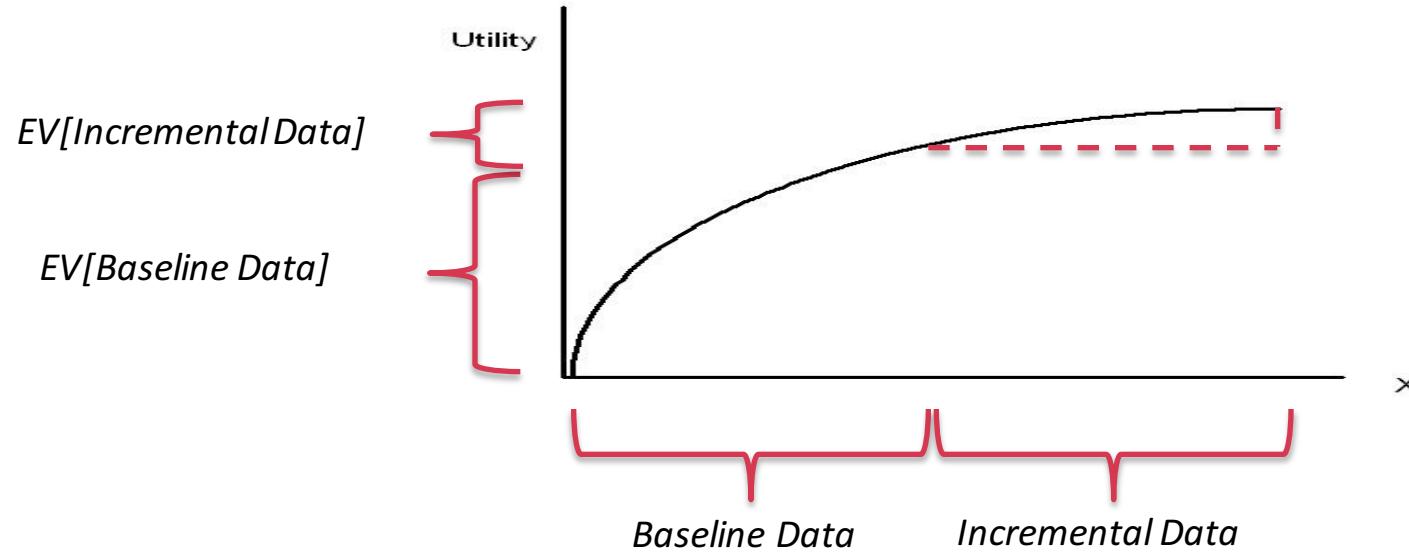
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Lesson 3: The VOD is Relative, not Absolute.

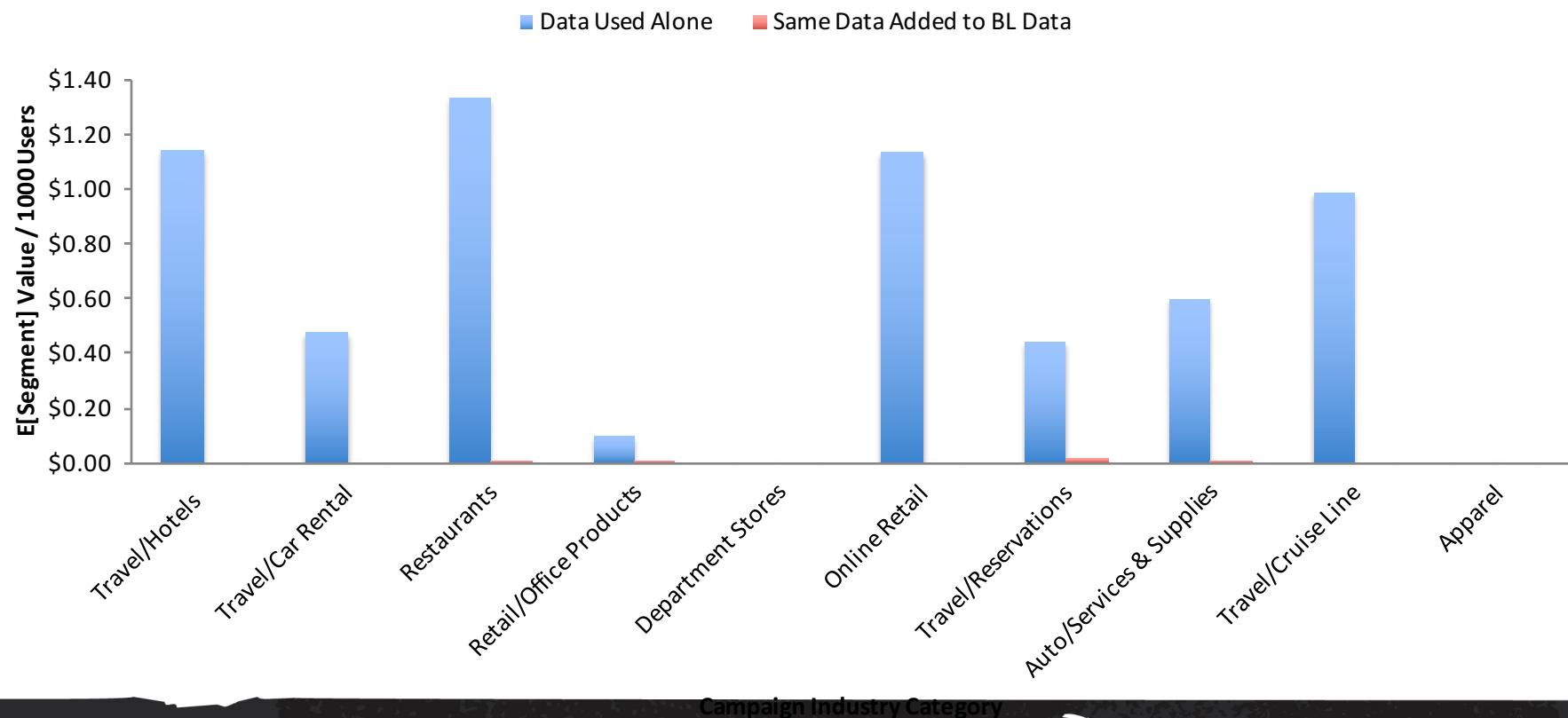
The value of a data point/source depends on what other data is being used along with it.



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Example of that last point...



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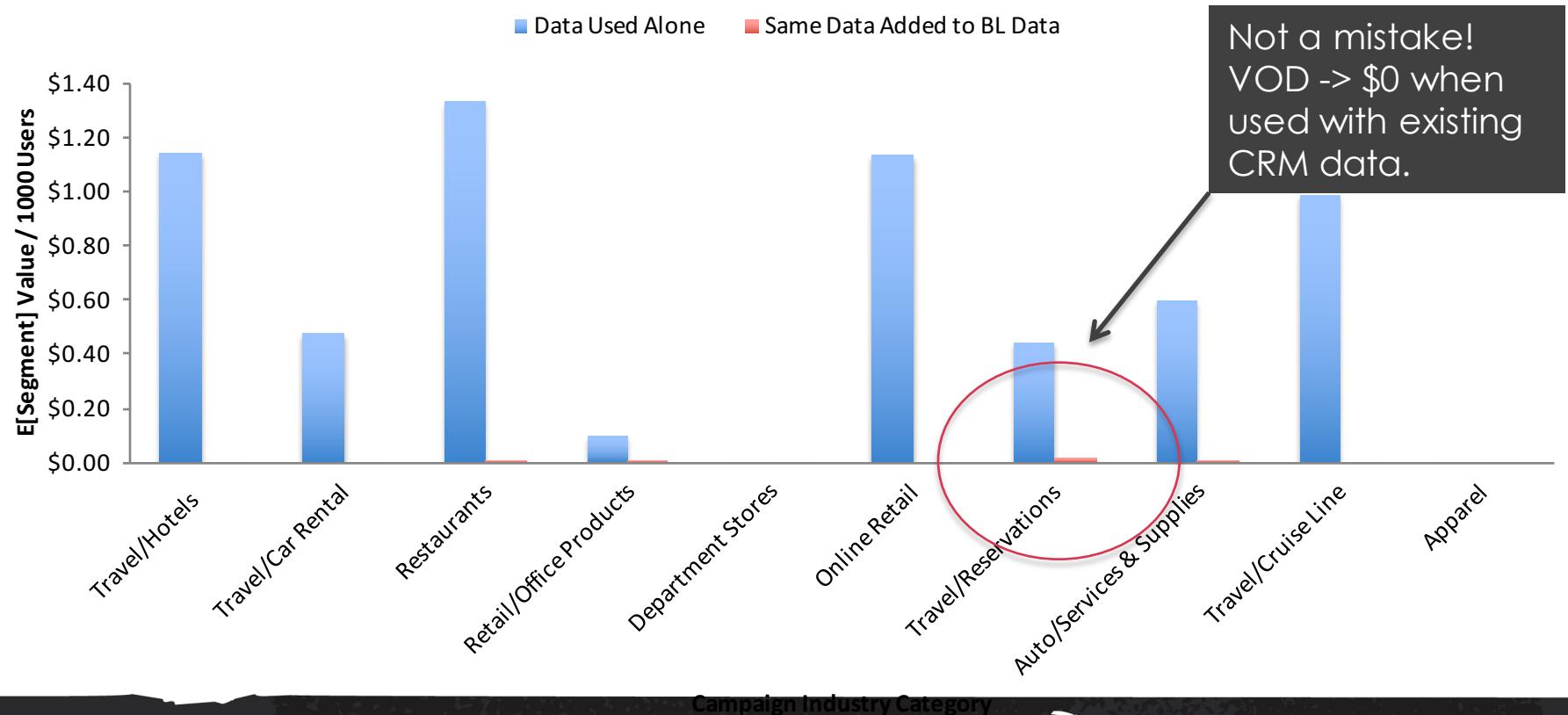
Campaign Industry Category

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W 73° 58' 40"



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Example of that last point...



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Campaign Industry Category

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Takeaways

For data buyers/users:

- Use the expected value framework to determine optimal buying price or evaluate ROI
- Your own CRM data is likely worth the most
- Better models means data is worth more

For data sellers:

- The optimal selling price is a function of the buyers individual needs
- Auction mechanisms enable fair pricing



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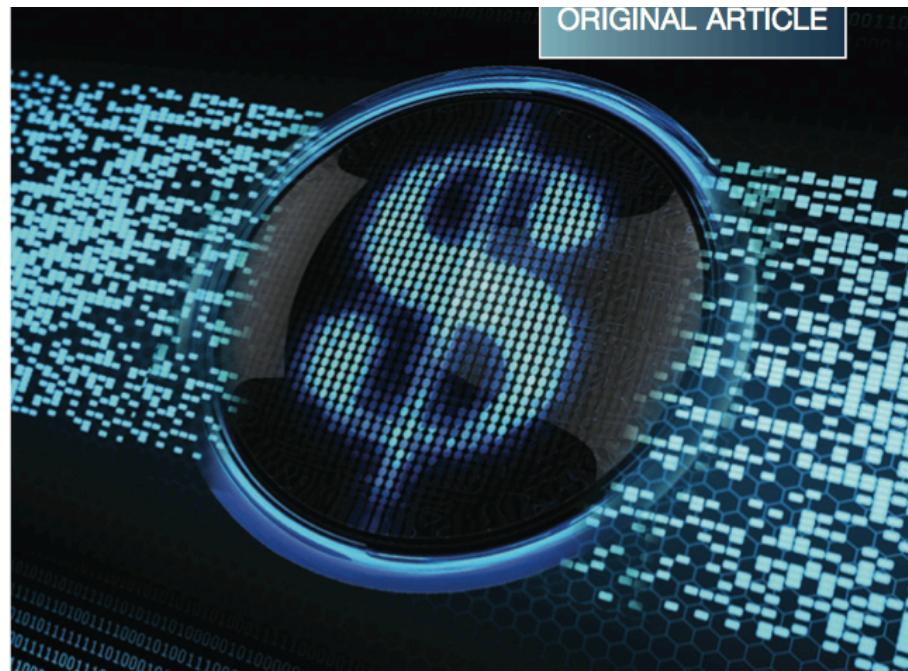
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Want technical details? Big Data Journal, June 2014

BIGGER IS BETTER, BUT AT WHAT COST?

*Estimating the Economic Value of
Incremental Data Assets*

*Brian Dalessandro, Claudia Perlich,
and Troy Raeder*
Dstillery, New York, New York



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