Big Data is Not About the Data!

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Abt Associates 9/28/2017

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The Last 50 Years:

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- In each: without new analytics, the data are useless

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Fast Company Names Crimson Hexagon Number Seven on "The 10 Most Innovative Companies in Web" List Leading Social Intelligence Firm Recognized For Revolutionary Measurement of Consumer Opinions in Social Media

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自由

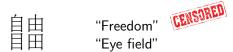
Example Substitution 1:

自由 "Freedom"

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自由 "Freedom" **CENSORED**





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自由 "Freedom" CENSORED "Eye field" (nonsensical)
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Example Substitution 2:

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自由 "Freedom" (Industrial) "Eye field" (nonsensical)

Example Substitution 2:

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7/15

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Computer-Assisted Reading (Consilience)

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 - (Lots of technology, but it's behind the scenes)

What Members of Congress Do

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- Want to try it here? see Perusall.com

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 - Disagreements between central and local leaders

The Government Surreptitiously Fabricating Social Media Posts

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 Prevailing view of scholars, activists, journalists, social media participants:

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 Prevailing view of scholars, activists, journalists, social media participants: 50c party argues against those who criticize the government, its leaders, and their policies

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 - (Technically correct, & politically much easier)

• Its cheap and powerful; don't skimp!

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 - opens many more possibilities
- Build a new discipline of data science

For more information

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