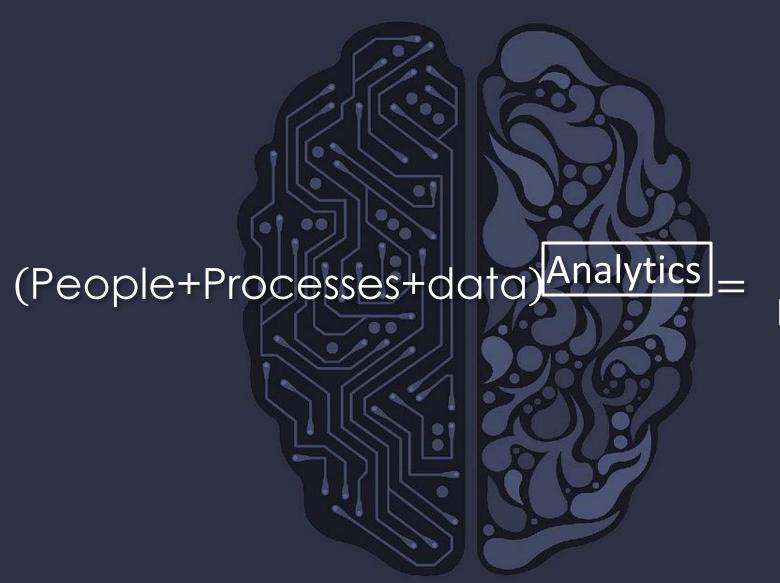
Business Analytics

Camilo Zapata

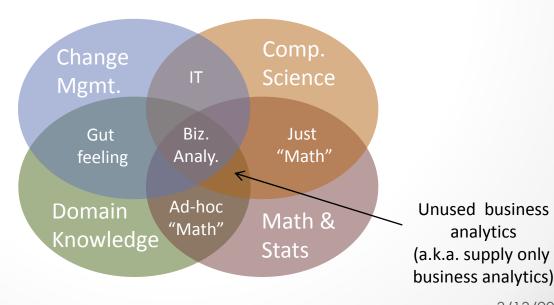
(The opinions expressed in this presentation are the presenter's own and do not reflect the view of Alkermes)



Patient &
Business
Results

What is Business Analytics?

- Analytics
 - It is the discovery, interpretation, communication and operationalization of meaningful patterns in data
- Business analytics
 - It is the use of analytics to support and enhance all business related decision making processes
- The 4 areas of of expertise*

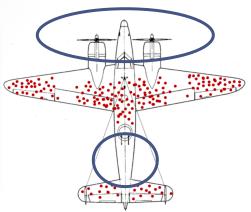


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Why do we need math and stats?

Biases



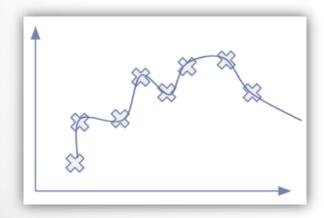


Model building and selection



https://www.dailymail.co.uk/news/article-3211458/Fisherman-51-spent-three-years-building-world-s-biggest-Lego-model-warship-USS-Missouri-beaten-just-inches-American-rival.html

Overfitting



Spurious correlations

The real cause of increasing autism prevalence?



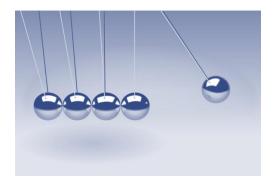
Sources: Organic Trade Association, 2011 Organic Industry Survey, U.S. Department of Education, Office of Special Education Programs, Data Analysis System (DANS), OMB# 1820-0043. "Children with Disabilities Receiving Special Education Under Part B of the Individuals

Why is business knowledge fundamental?





- What question are we trying to answer?
- What assumptions make sense?
- What data is available and what data is usable?



Analytics selection

- What is analytically sound?
- What can the business handle?
- What "simplifications" would the business accept?



Trust Building

- Nobody is going to listen to you if you don't prove that you know the business
- Nobody cares what you know until they know that you care

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What is the role of computer science?

- Data issues
- Environment issues
- Speed issues



 Develop user interface



Back end develop.

- Architecture
- Modularization
- Maintainability and scalability
- Parallelization
- Automation



- Architecture
- Modularization
- Maintainability and scalability
- User experience



AI/ML

- Efficient coding on algorithms
- Algorithm
 development (whether
 we like it or not)

Why is change management critical?

Support and ownership





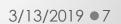








- People
- Processes
 - Proactive measurement
- Incentives



Where can we play*?

- Commercial
 - New product planning (NPP)
 - Portfolio management
 - Forecasting
 - Market research
 - Marketing (Helena will provide an example)
 - Sales operations (e.g. targeting)
 - Pricing and contracting
 - o Supply chain
- Supporting functions
 - o HR
 - Compliance
 - o Finance

- Medical
 - Clinical trial and program design that goes beyond efficacy (Lucy will provide an example)
 - Clinical operations (e.g. site selection, trial enrollment forecast)
 - Clinical trial supply chain

Some specific examples...

- What is the market opportunity for product XXX?
 What countries should be prioritized for launch?

- Descriptive analytics
- Did the launch of device XXX have an impact on sales?



- o Times series clustering
- What is the impact of our touchpoints on sales? Are they ROI positive?
 - Random effects models



- What physicians should we target for the launch of product XXX?
 - Decision tree based methodologies (random forest, gradient boosting, C-trees)



- Do co-pay cards have an impact on how long patients stay on product XXX?
 - Survival analysis



What "outcomes" we need to deliver on?



- Quality
 - Good enough
 - Meaningful
 - o Actionable



Cost

- Sensitivity wildly varies across organizations
- Nothing is free even if it is done internally



Speed

 As important as quality as business cycles can not be delayed



Interpretability

 It does not matter how good your analytics are, if you can not get buy-in from the business, your effective impact is ZERO

The engagement model...



Targeted

- o Impactful
- Strong business support
- Early in the process focus on projects with high probability of success



Agile

- o Iterative
- Based on customer feedback



Multifaceted

- Consultant
- Parent
- Teacher

Three things to remember...

- To be successful a business analytics team requires:
 - Technical knowledge
 - Domain knowledge
 - o IT knowledge
 - Change management knowledge
- From an outcomes perspective, it is necessary to balance not only quality, cost and time but also interpretability
- Projects should be...
 - Prioritized not only on impact/effort but also on support from the business
 - Run in an agile fashion with constant feedback from the business