#### luxexecutivesummit 2018

Boston • April 9-11

# Supercharging Innovation with Data+Insight

Kevin See, Ph.D. VP, Digital Products



# Agenda

- 1 The Stagnation of the Innovation Process
- 2 Data + Insight to get at What, Who, and When
- 3 Evolving for better results







### How big data won the 2017 World Series

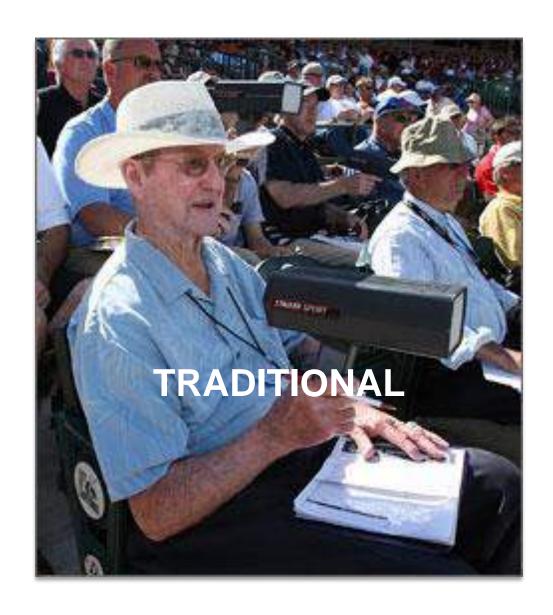
Learn what the Houston Astros did to win the analytics arms race in Major League Baseball.

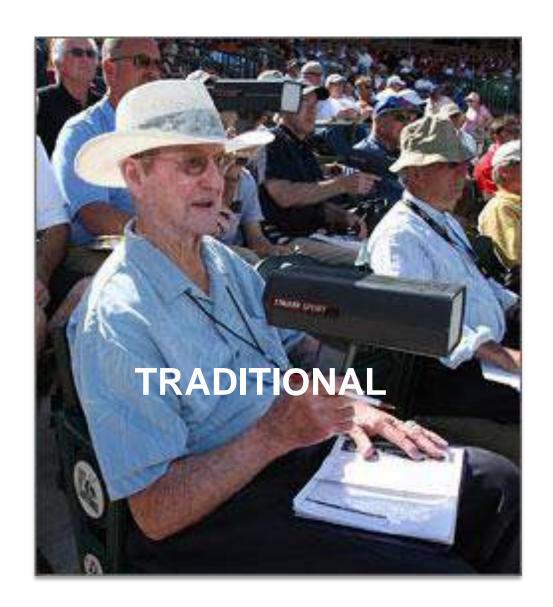
### The Boston Globe

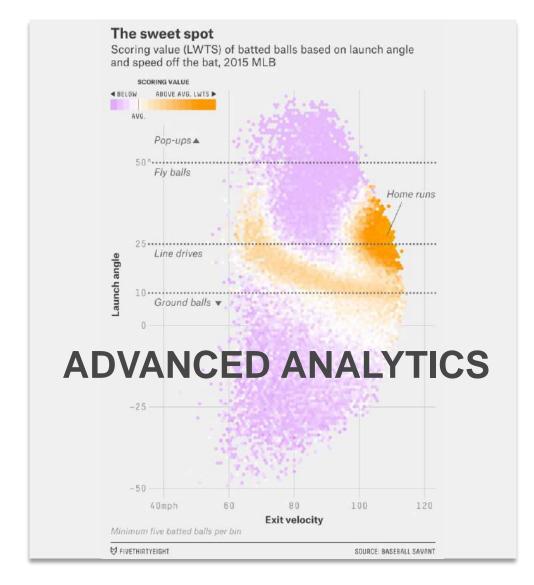
Astros at leading edge of analytics and their success is proof positive



Astros are winning at new, old numbers games









Analytics is about helping player development, managers and coaches to make better decisions; better decisions than what your competitors are making.

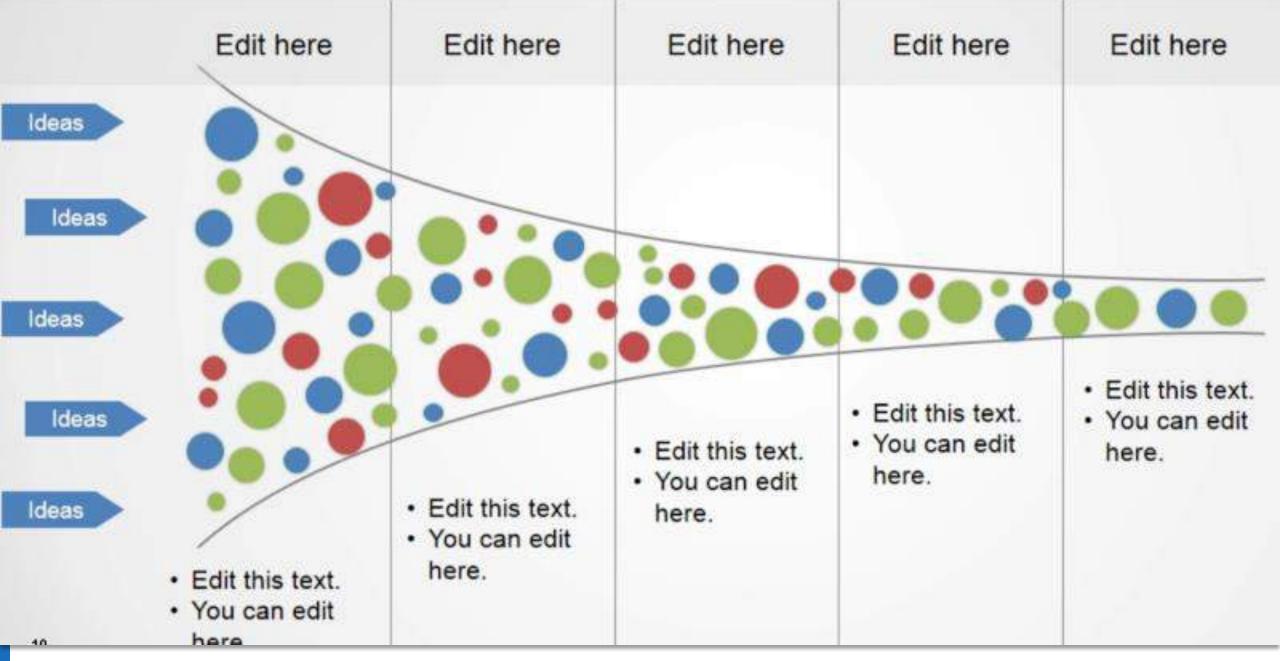


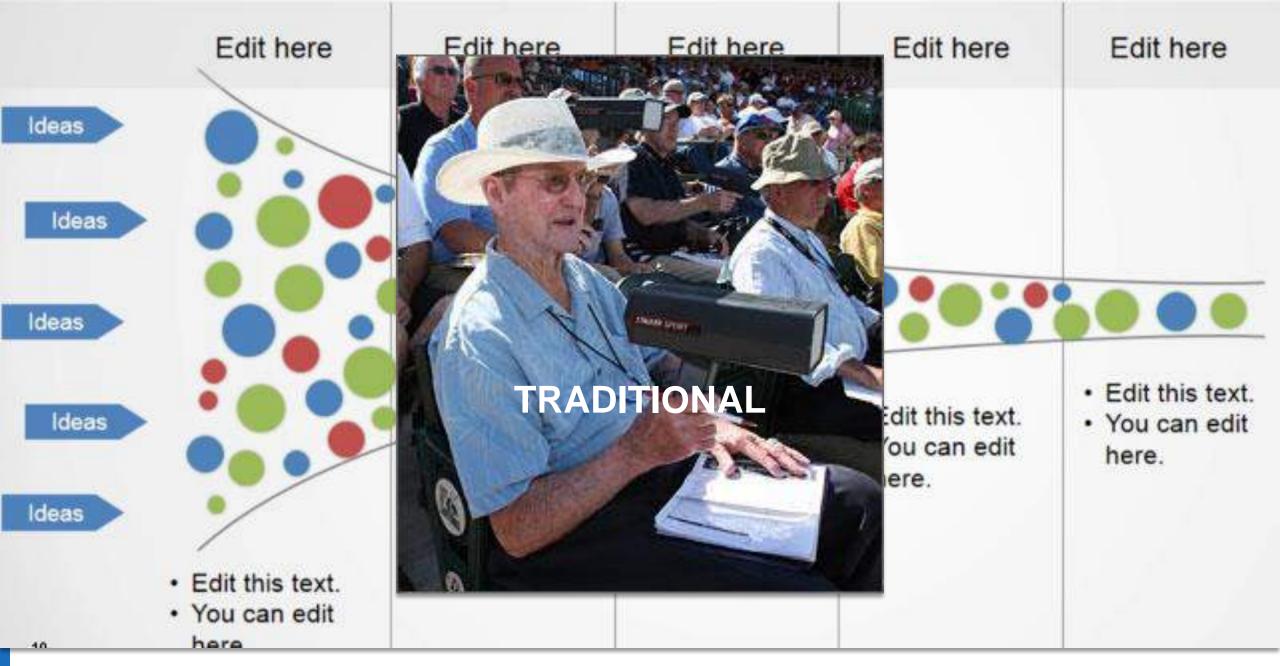


Luhnow recognized the incentives for losing baked into what was then a new collective bargaining agreement. The worst teams would have much more money to spend on amateur talent. A few years of struggle could lead to many years of success.

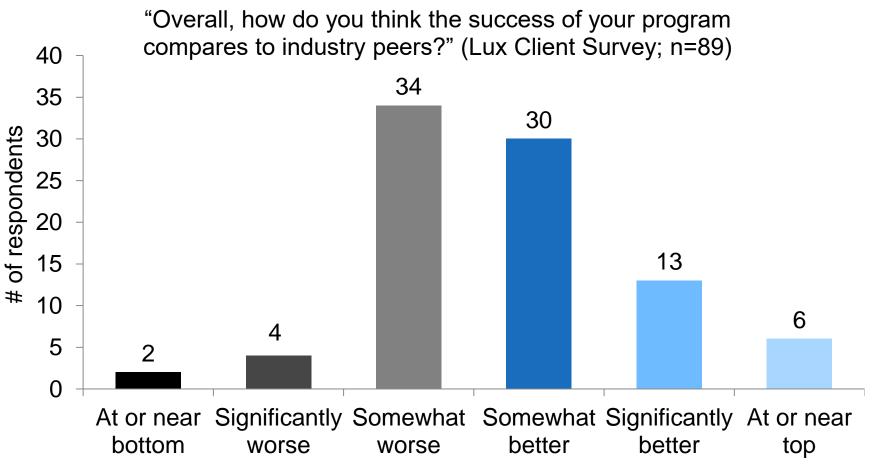


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Year	Team	League	Wins	Losses	s %
2017	<b>Houston Astros</b>	American League	101	61	.623
2016	<b>Houston Astros</b>	American League	84	78	.519
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2013	<b>Houston Astros</b>	American League	51	111	.315
2012	<b>Houston Astros</b>	National League	55	107	.340





# 2013: Most see innovation results as modest



"I don't have any home runs to talk about. Have quite a few singles and doubles – some that are still growing, could become a triple or a home run."

"We find a lot of singles, haven't found a home run. It's not hard, over the course of year, to find a single or two."

# 2018: The challenges remain the same



# **TOP 10**

INNOVATION ISSUES LEADERS ARE FOCUSED ON IN 2018

We asked our members: What issues are at the top of your agenda for 2018?

"Top issue is always getting buy-in. Execs want innovation to check a box that they're thinking about the future, but never act on pitches, results, insights produced by the team."

- Anonymous Respondent





# Approaches to spotting transformational technologies tend to fall into one of two camps

#### TRADITIONAL FORESIGHT

# Characteristics Examine broad themes (megatrends) Study markets and tech trends Get smart people to make judgments

#### Challenges

Unreliable – vulnerable to bias

Still easy to miss some key trends

Often still a lagging indicator

# Approaches to spotting transformational technologies tend to fall into one of two camps

#### TRADITIONAL FORESIGHT

#### **AUTOMATED DATA**

#### **Characteristics**

Examine broad themes (megatrends)

Study markets and tech trends

Get smart people to make judgments

Access to various data sources

Look for trends and correlations

Search interface and visualizations

#### Challenges

Unreliable – vulnerable to bias

Still easy to miss some key trends

Often still a lagging indicator

Lacks context and insight

Contributes to information overload

Often still a lagging indicator

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### We need

a way

to synthesize

the best of

both

#### ED DATA

s data sources

nd correlations

and visualizations

and insight

s information overload

a lagging indicator

# The perils of fallible insight

1999

The Economist "In the early 1980s AT&T asked McKinsey to estimate how many cellular phones would be in use in the world at the turn of the century. The consultancy noted all the problems with the new devices—the handsets were absurdly heavy, the batteries kept running out, the coverage was patchy and the cost per minute was exorbitant—and concluded that the total market would be about 900,000. At the time this persuaded AT&T to pull out of the market, although it changed its mind later.

These days 900,000 new subscribers join the world's mobile-phone services every three days"

# The perils of fallible insight

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2006



# Gartner: Apple should quit hardware business

The future success of Apple, Dell and Intel lies with a licensing deal between Steve Jobs' company and the PC maker according to analyst Gartner



By Andrew Donoghue | October 18, 2006 -- 15:55 GMT (08:55 PDT) | Topic: Innovation

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# The perils of automation



### **EXAMPLE NEWS ALERT**FOR TOYOTA



I'm Turning A Salvage Toyota 86 From Hurricane Harvey For Charity

Jalopnik · 3h ago



Should Value Investors Pick Toyota Motor (TM) Stock?

Zacks.com · 7h ago



Driving the Toyota C-HR R-Tuned, a 600-HP Compact Crossover That Wants to Kill You

The Drive · Mar 29, 2018

RELATED COVERAGE



Mew Toyota RAV4 revealed with hybrid powertrain

AutoExpres



What to Expect at Richmond Raceway's 2018 Toyota Series NASCAR Event

The Drive · Mar 31, 2018



Toyota Launches Production Model "Sora" Fuel Cell Bus

Composites Manufacturing Magazine · Apr 2, 2018









Expert curation of data and advanced analytics

Domain knowledge sorts the significant from the spurious

Insight on what it means – and what to do about it

Solution







Improve our win rate

Goals: Make our wins bigger

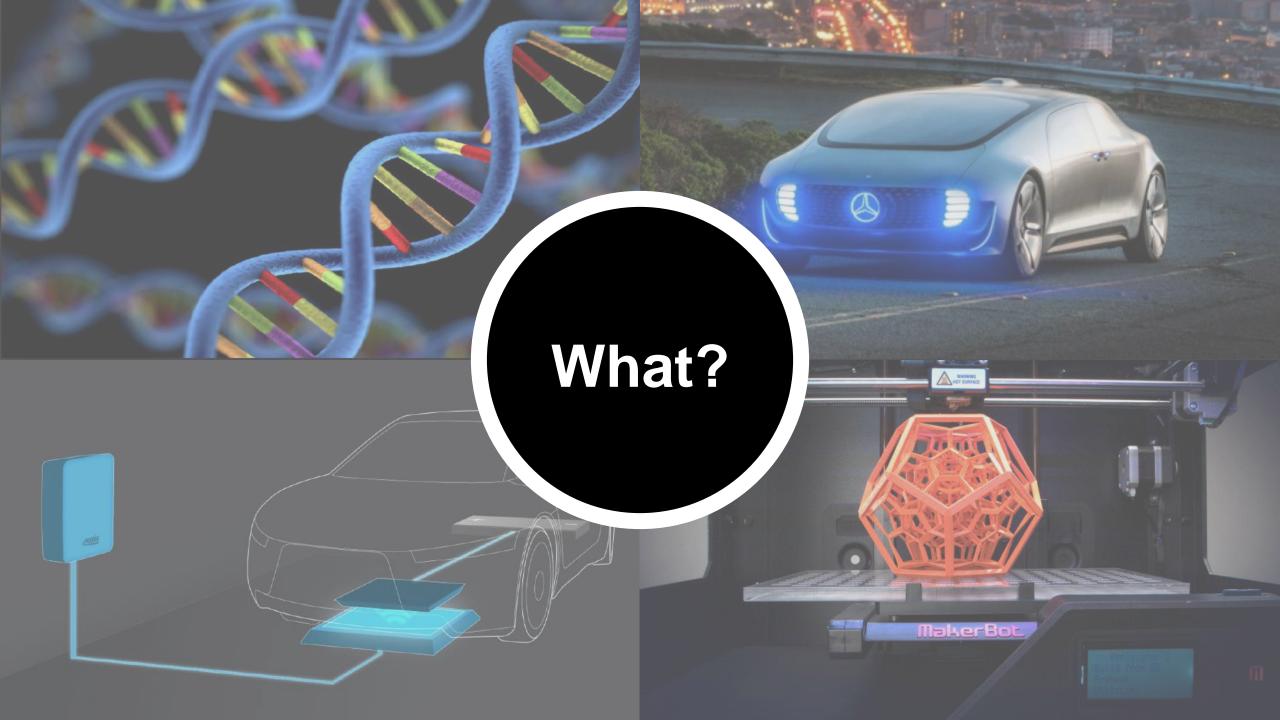
Make our innovation efforts indispensable for growth

# Agenda

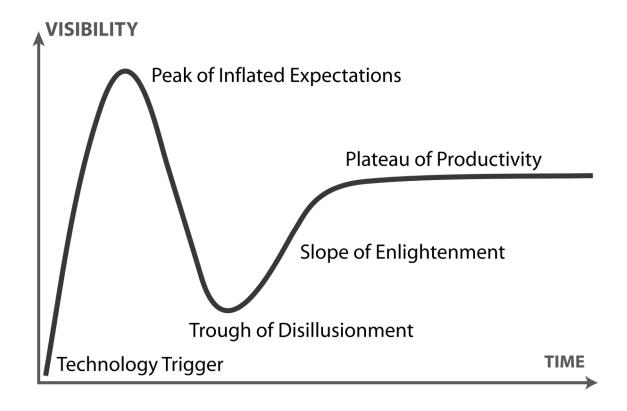
- The Stagnation of the Innovation Process
- Data + Insight to get at What, Who, and When
- **Evolving for better results**





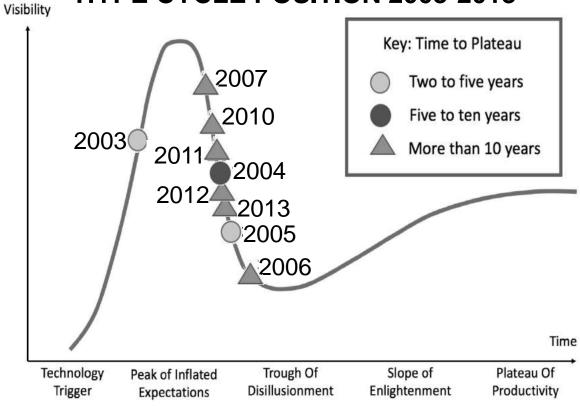






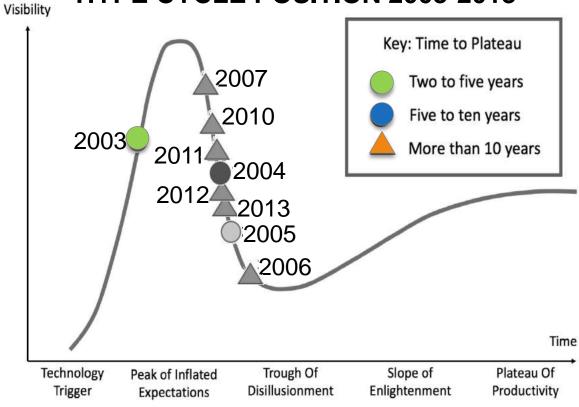


### VISIBILITY Peak of Inflated Expectations Plateau of Productivity Slope of Enlightenment Trough of Disillusionment TIN Technology Trigger



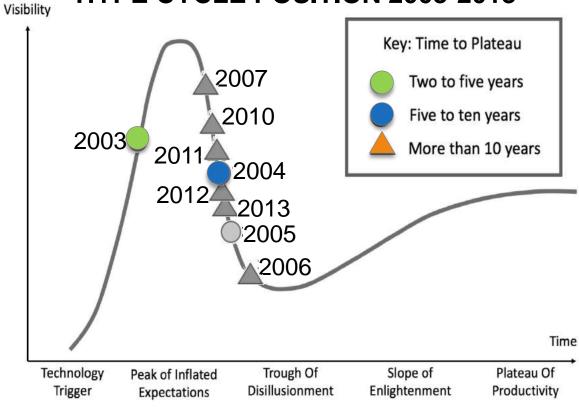


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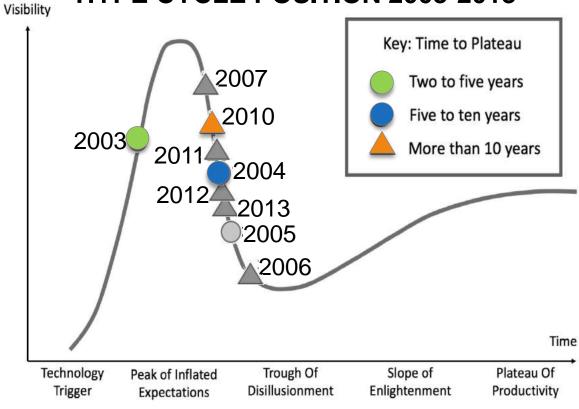


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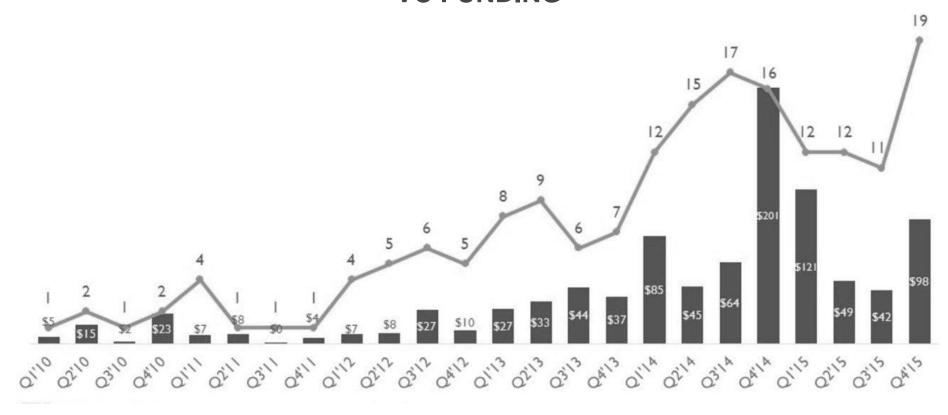


# What? TRADITIONAL FORESIGHT What technologies should you prioritize?

#### MESH NETWORKS QUALITATIVE FRAMEWORKS PE CYCLE POSITION 2003-2013 VISIBILITY Peak of Inflated Expectat It's remarkable the number of Key: Time to Plateau Two to five years major technologies from the last 20 years Five to ten years More than 10 years that were either identified late or simply never appeared on a Hype Cycle - Michael Mullany, Icon Ventures Trough of Disillusionmer Time Technology Trigger Slope of Plateau Of Productivity Enlightenment



#### **VC FUNDING**





#### **VC FUNDING**



If you saw the level of due diligence in vetting some companies – you'd be appalled.

- Anonymous Private VC





#### VCs struggle outside of software

#### **Venture Capital and Cleantech:**

The Wrong Model for Clean Energy Innovation



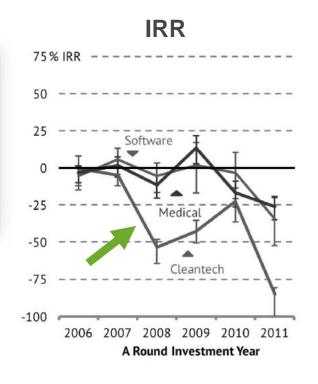


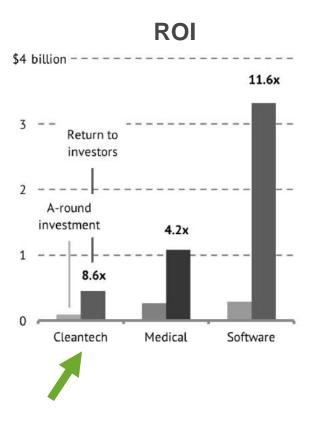
#### VCs struggle outside of software

#### **Venture Capital and Cleantech:**

The Wrong Model for Clean Energy Innovation







Solution







Introducing...

The Lux Tech Signal

# Lux Tech Signal (LTS) methodology

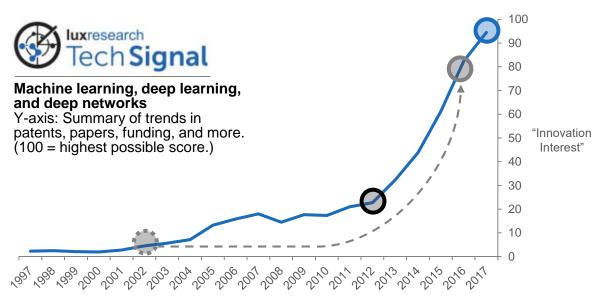
The Lux Tech Signal is based on our analysis of innovation data including:

- Patents
- Academic papers
- VC funding
- Government funding
- Lux proprietary data

The **Innovation Interest** score is calculated by analyzing multiple, diverse datasets weighted based on our evaluation of the role innovation sources play in each stage of commercial technology development; empirically tested and validated against real world historical data.

The maximum possible score is 100, indicating the highest observed rate of research, patenting, funding, etc.

#### **EXAMPLE:**



- Changes over time signal growing (or shrinking) innovation interest.
- Inflection points may point to commercial opportunities or challenges ahead.
- Current value indicates innovation maturity, distinguishing established technologies from those that are still emerging.



#### DATA + INSIGHT



#### What technologies should you prioritize?

## 18 for 2018 Executive Summary: Top technologies Lux is following in 2018, using data from the Lux Intelligence Engine and analysts' insight

A ranking of the most important technologies to watch, given their potential to transform the world in the next decade

- Machine Learning and Deep Neural Networks
  30% annual increase in machine learning patents
- 3D Printing and Additive Manufacturing Lux expects 3D printing to be a \$20 billion market by 2025
- Genome Editing \$1.2 billion in VC funding to impact industries from food to health care
- 5G Networks Over 70,000 patents set the stage for 5G network launches in 2018
- Microbiome Harnessing the power of microbes for nutrition, agriculture, and more
- Solid-state Batteries
  Safer and better batteries, pursued by start-ups and giants like Toyota
- Synthetic Biology
  A recent \$275 million round for Ginkgo Bioworks highlights the potential
- Augmented Reality (AR)
  Enterprise applications are coming now, on heels of \$4.4 billion in funding
- 9 Smartwatches Patents soar from near zero to over 23,000 in less than five years

- Wireless Charging
  Here now for consumer electronics, with R&D pushing for EV uses
- Materials Informatics
  Using IT and Al to break out of slow material development cycles
- 12 IoT Security
  Patents are up 13x as connected devices proliferate
- 13 Edge Computing
  When milliseconds matter, analytics can be local, not in the cloud
- Energy Distribution System Monitoring
  Growing demand and renewables require tech to balance the grid
- Polyethylene Furanoate (PEF)
  Innovation has grown at an 87% annual rate to improve on PET
- 16 Sugar Reduction
  Over 162,000 patents to combat health ills from too much sugar
- Neural Interfaces
  Tech to read and stimulate the brain will see growing validation in 2018
- Syngas and Power-to-Gas
  Producing fuels from CO<sub>2</sub> to drive the energy transition



#### DATA + INSIGHT FOR PRIORITIZING TECHNOLOGIES

#### Segment mature areas from emerging opportunities

#### Y-Axis: Innovation track record •

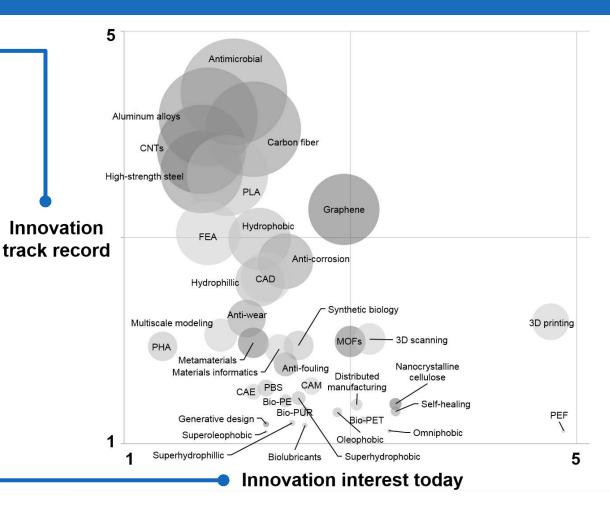
Cumulative number of papers and patents in the past 20 years.

Determines dot size.

#### X-Axis: Innovation interest today

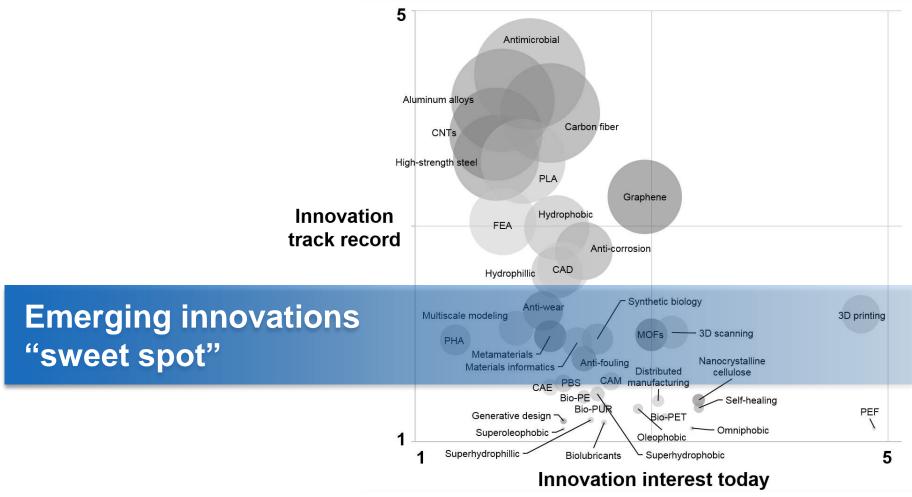
What is receiving the most interest.

Calculated based on rate of new patents, papers, and funding.



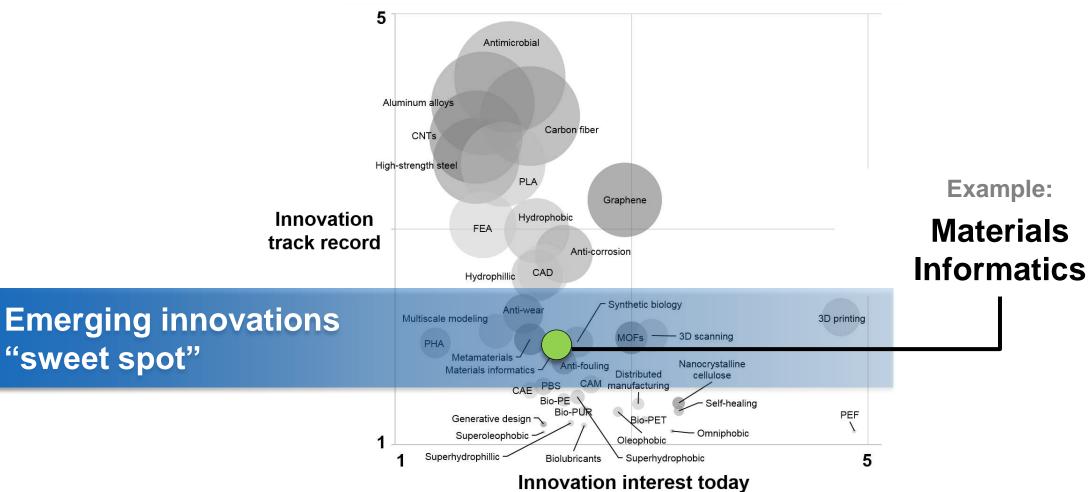


## DATA + INSIGHT FOR PRIORITIZING TECHNOLOGIES Segment mature areas from emerging opportunities





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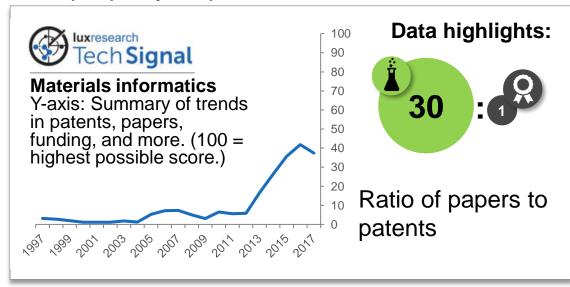
### DATA + INSIGHT FOR PRIORITIZING TECHNOLOGIES Materials Informatics



#### **DESCRIPTION**

Use of data science and artificial intelligence methods to:

- extract insights from existing materials
- discover new materials matching desired property requirements



#### **KEY BENEFITS**

Accelerates materials and chemicals research and product development timelines

Extracts additional value from existing experimental and computational data, leveraging past R&D spending

Optimizes experimental designs to attain the most valuable data per experiment



## DATA + INSIGHT FOR PRIORITIZING TECHNOLOGIES Materials Informatics



#### LUX TAKE BY APPLICATION READINESS FOR MATERIALS INFORMATICS

Application	Data Availability	Experimental Data Cleanliness	Maturity for Machine Learning	Average	Lux Take	
Small Molecules	4.7	4.7	4.7	4.7	Strong Positive	
Alloys	3.3	3.9	4.5	3.9	Positive	
Semiconductors	3.3	3.6	3.6	3.5	Positive	
Polymers	2.4	2.9	4.0	3.1	Positive	
Pharmaceuticals	3.0	3.0	3.0	3.0	Caution	
Glass	2.6	3.0	3.1	2.9	Wait and See	
Additive Manufacturing	2.0	2.2	3.8	2.7	Wait and See	
Batteries	2.4	2.1	3.1	2.5	Caution	
Heterogeneous Catalysis	2.3	1.9	2.1	2.1	Caution	





MIT Technology Review



# magic 10 Breakthrough Technologies



MIT Technology Review



# 10 Breakthrough Technologies

2017





#### Magic Leap's Mixed Reality

Magic Leap is a mixed reality company currently valued at \$6 billion that has raised \$1.5 billion in funding with no product to show. Rumors of wondrous technical feats followed by massive

Since then, the shiny veneer of this unicorn has started to crack, and its technology claims appear to be highly exaggerated.

and its technology claims appear to be highly exaggerated. In this report, we examine the company's history and patent portfolio to understand Magic Leap's mix of hype and reality.





theranos

How Elizabeth Holmes Became America's New Entrepreneurial Icon





theranos

How Elizabeth Holmes Became America's New Entrepreneurial Icon

2018

The Washington Post

theranos

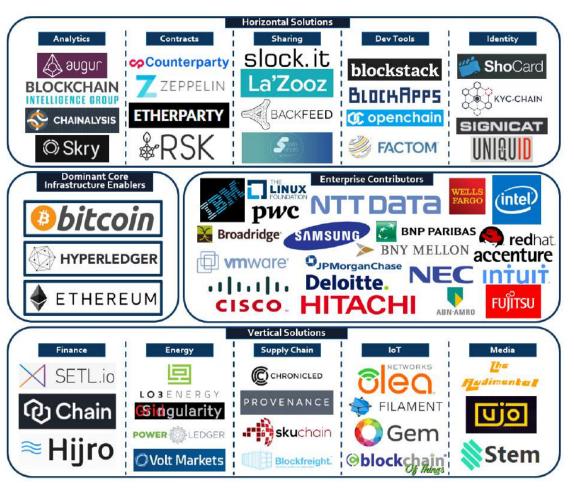
Theranos chief executive Elizabeth Holmes charged with massive fraud



#### Cherry-picking logos gets you only part of the way

#### **Example:**

**LUX BLOCKCHAIN LANDSCAPE** 2016





## **Key player analysis (for Deep Learning)**



#### **Use data**

Patents, investment, academic publications – to surface leading players

## Using data science, segment into:

- large players
- 2) start-ups •
- 3) research centers

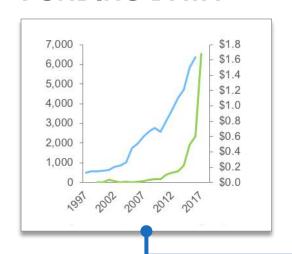




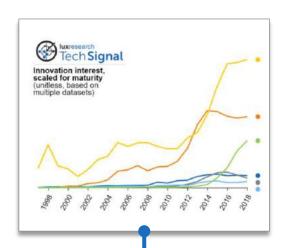
## **Bolster the data with Insight**



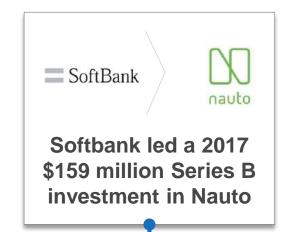
### PATENTS, PAPERS, FUNDING DATA



LUX TECH SIGNAL LEADING INDICATOR



NEWS & CURRENT EVENTS



LUX ANALYST EXPERTISE



COMPANY PROFILE

#### Nauto

Connected hardware for vehicle fleet management



## DATA + INSIGHT FOR WHO TO WORK WITH Bolster the data with Insight



#### **Nauto Company Profile Summary**

Connected hardware for vehicle fleet management

#### **TECHNOLOGY AND DIFFERENTIATORS:**

- Develops deep learning enabled retrofit dashboard camera system for occupant and environmental monitoring purposes
- Provides fleet managers with reports on individual driver performance as well as scenarios that could affect the entire fleet

#### STRATEGY AND MARKETS:

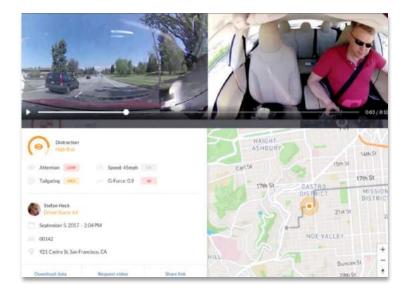
 Sells its cameras at an initial price of \$399 and then offers a SaaS model to access Nauto's cloud processing and reporting services

#### **LUX TAKE:**

 Positive – Pursuing a cloud platform that would focus on autonomous vehicles, instead of connected car services; Unique solution leverages deep learning for insight in and out of the car **Lux Take** 

**Positive** 



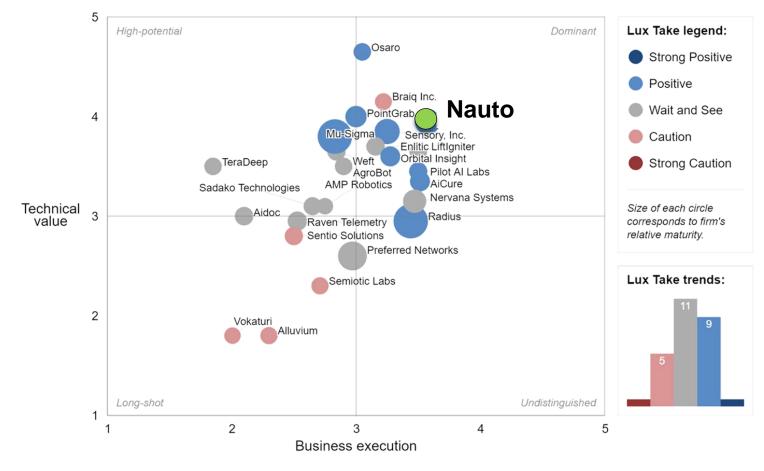




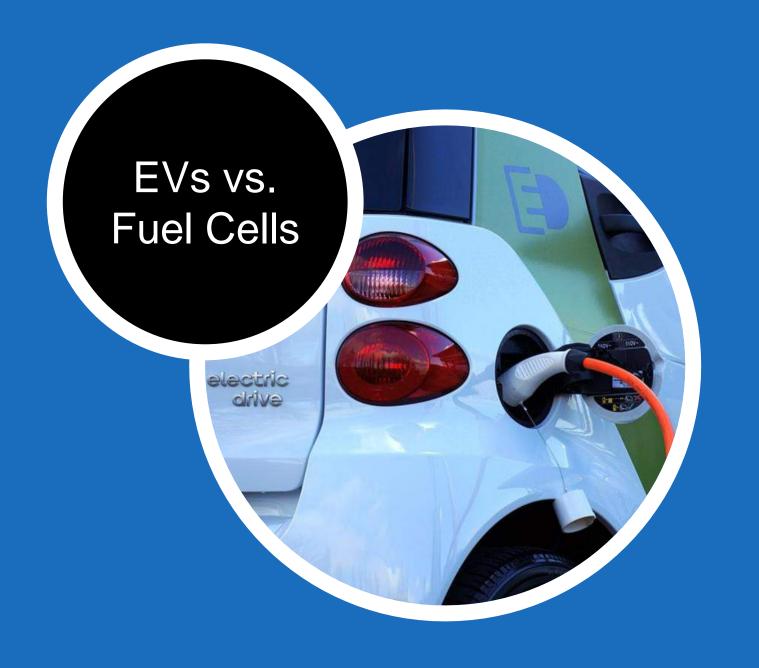
## DATA + INSIGHT FOR WHO TO WORK WITH Bolster the data with Insight



#### Lux Innovation Grid (LIG) for Deep Learning





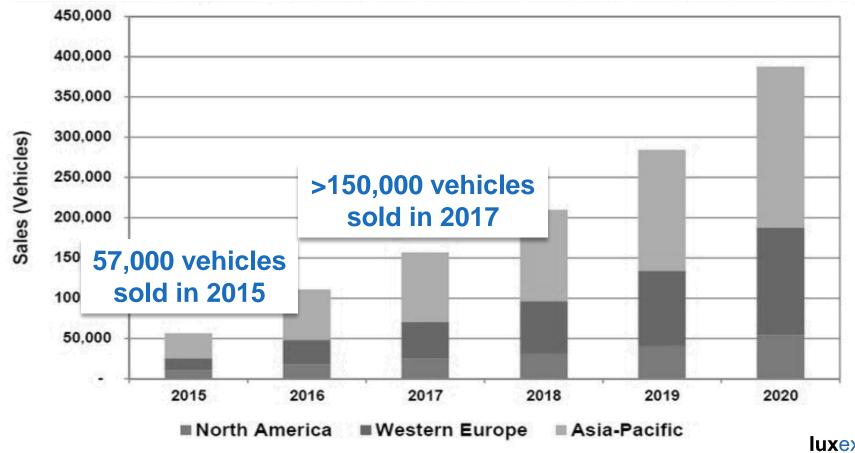




#### TRADITIONAL FORESIGHT

#### Fuel cell vehicle adoption – what they said in 2011

#### **2011 Forecast**

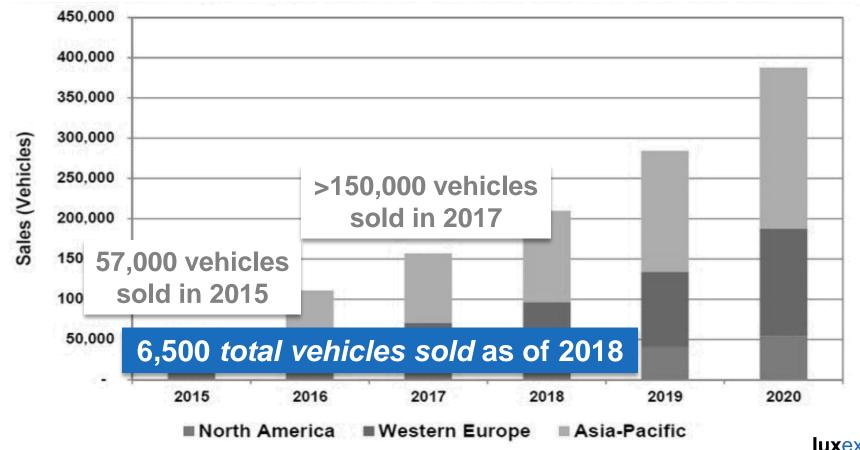




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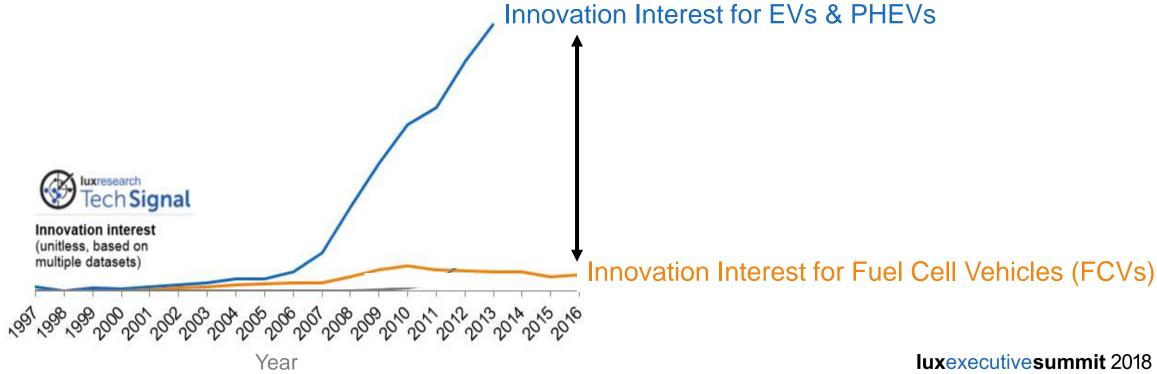
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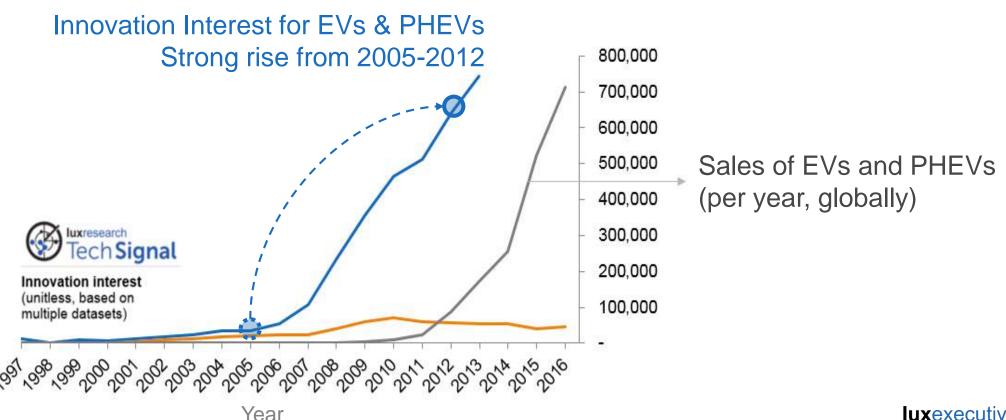
How Lux Tech Signal anticipated the rise of plug-in vehicles and failure of fuel cell vehicles







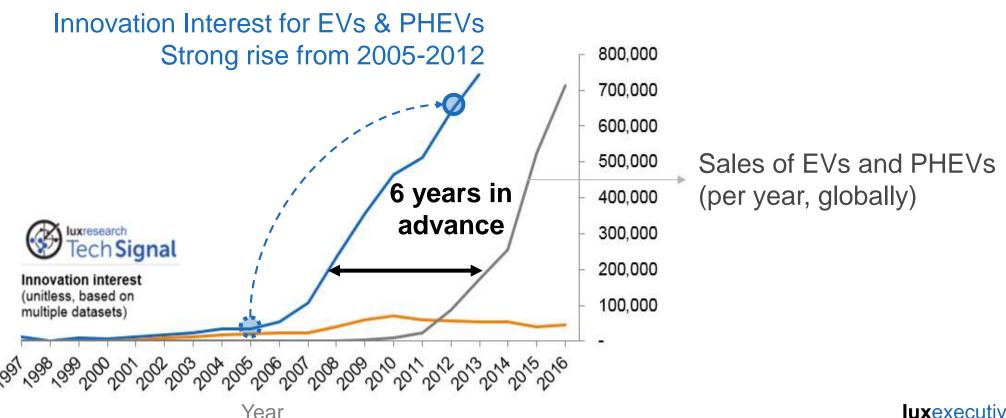
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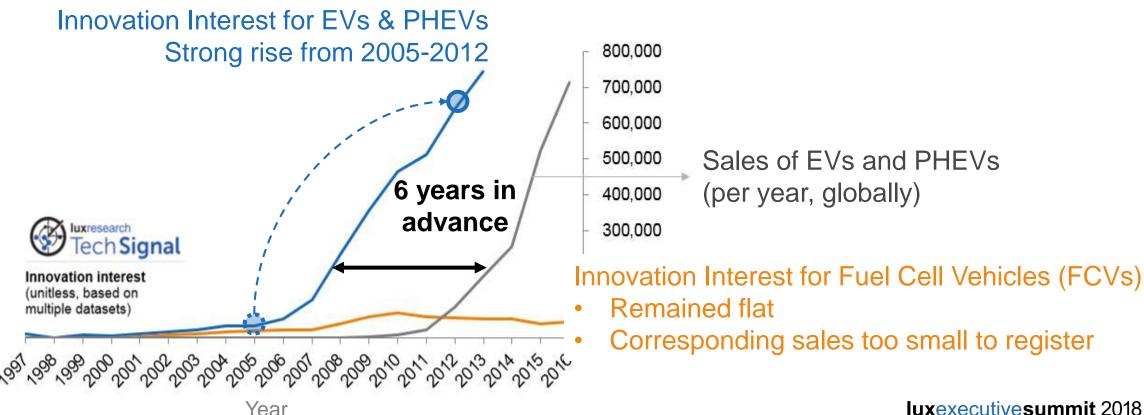


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### How Lux Tech Signal anticipated the rise of plug-in vehicles and failure of fuel cell vehicles

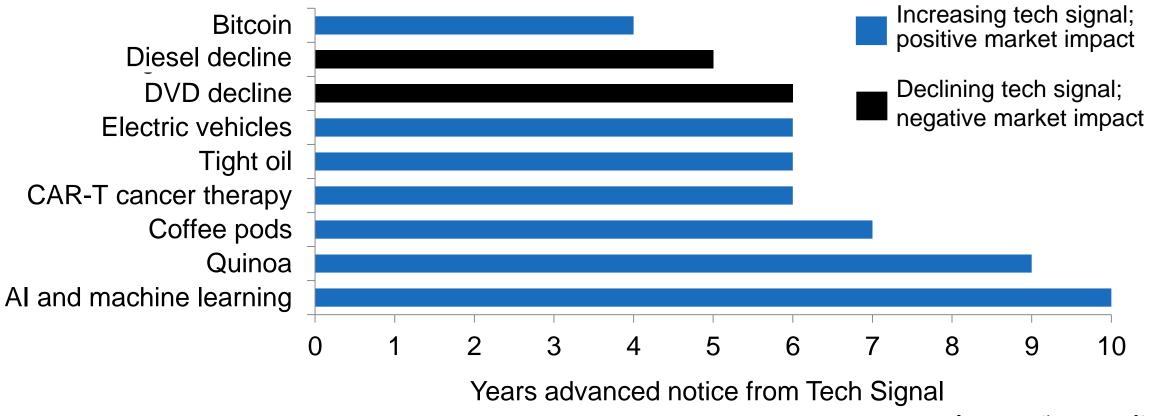


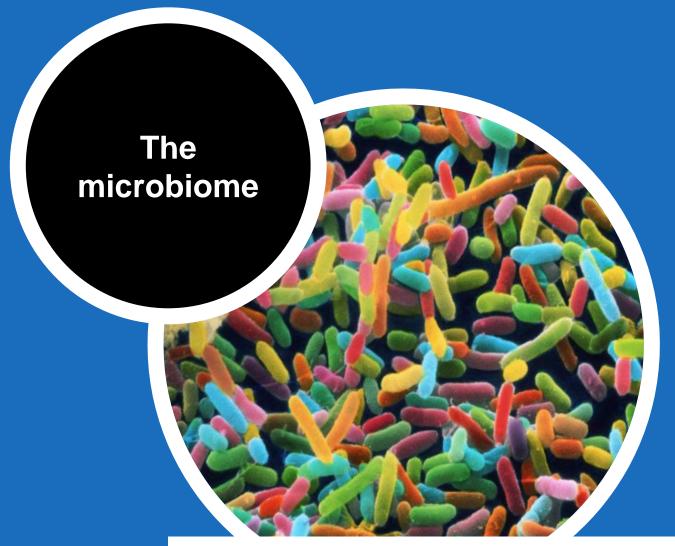


## DATA + INSIGHT FOR WHEN TO ACT The Lux Tech Signal as a leading indicator



#### Years advanced notice of technology market impact from Tech Signal





Impacts of microbes in different environments to aid development of ingredients, therapeutics, and diagnostics



#### DATA + INSIGHT



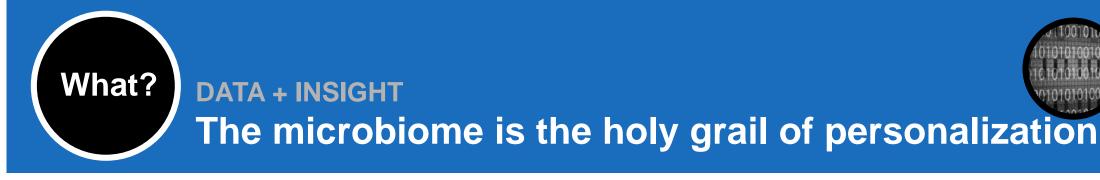
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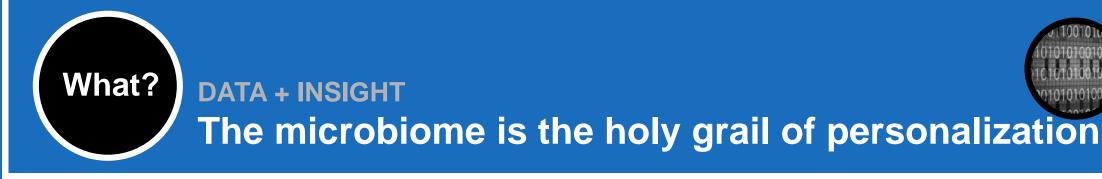
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  When milliseconds matter, analytics can be local, not in the cloud
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- Neural Interfaces
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- Syngas and Power-to-Gas
  Producing fuels from CO<sub>2</sub> to drive the energy transition



Glucovation Continuous Product development opportunity AIRO<sup>88</sup> Not Product applicable development **Bit**Bite opportunity consumer ConsumerPhysics Rise onex Frequency of needs Repeat vessyl telsper recommendations InsideTracker WearSens ozmo habit zipongo NUTRIGENOMIS habit habit Fixed Not applicable to consumer needs BIOGENIQ DNALYSIS Physical traits & Personal Dietary Biomarkers Microbiome Genetics preference lifestyle needs

Personalization specificity



Frequency of

Glucovation Continuous Product development opportunity AIRO<sup>88</sup> Not Product applicable development **Bit**Bite opportunity consumer ConsumerPhysics Rise onex needs Repeat farewell vessyl telsper recommendations InsideTracker WearSens ■ozmo habit zipongo NUTRIGENOMIX habit habit Fixed Not applicable to consumer needs BIOGENIQ DNALYSIS Physical traits & Personal Dietary Biomarkers Microbiome Genetics preference lifestyle needs

Personalization specificity



#### DATA + INSIGHT

## Development of ingestible sensors capable of measuring gases in the gut



RMIT is developing an ingestible sensor to measure gases (oxygen, hydrogen, carbon dioxide) in the gut and recently conducted a human pilot trial

Version 2: add hydrogen sulfide sensing

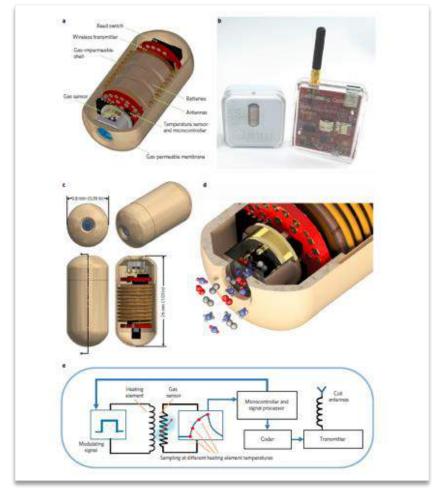
Version 3: add short-chain fatty acids

Looks to include analytics to convert raw data to actionable insight.

Unique in providing localized, high frequency measurements of the microbiome.





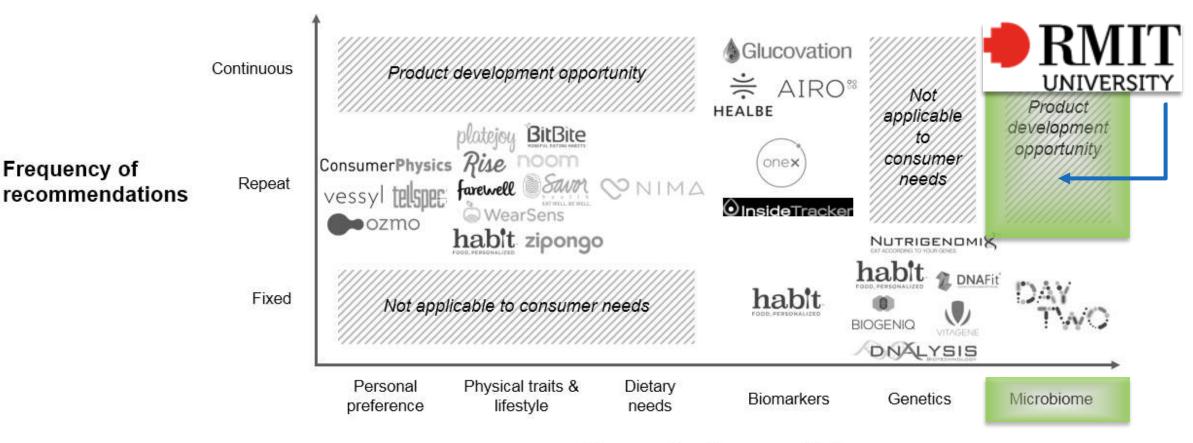




Frequency of

#### DATA + INSIGHT

#### Ingestible gas sensor plays into a previously-open product development opportunity

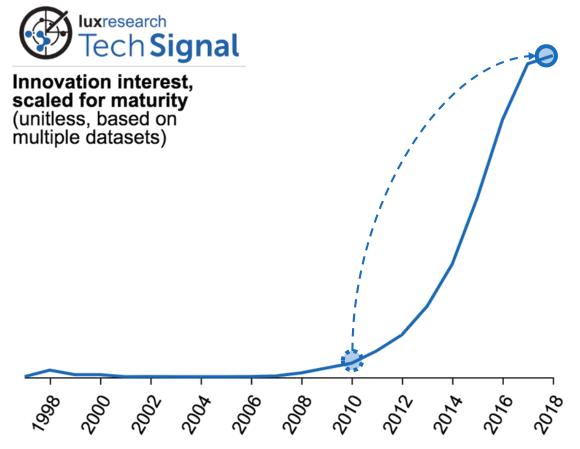


Personalization specificity



## DATA + INSIGHT FOR WHEN TO ACT Microbiome innovation is rising fast



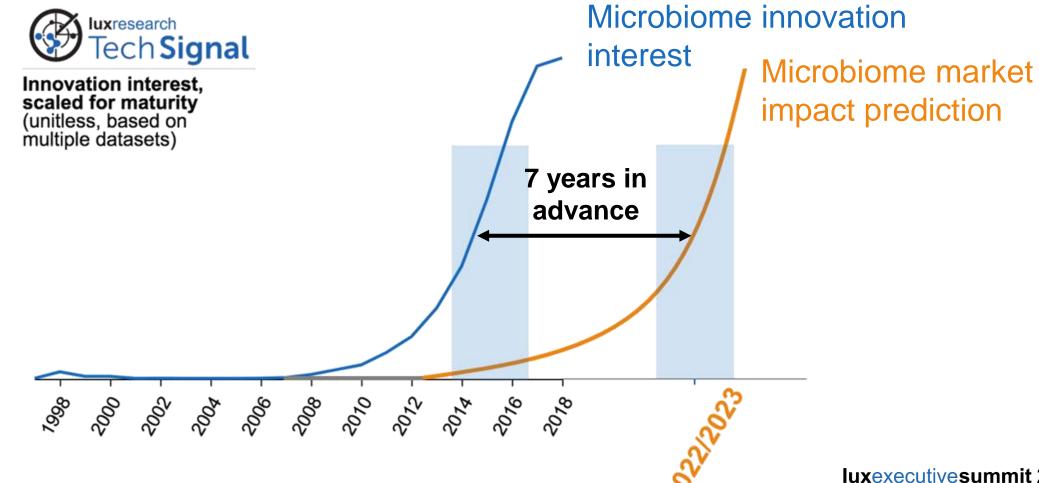


Microbiome innovation interest



## DATA + INSIGHT FOR WHEN TO ACT Making a call – predicting market impact





### Agenda

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- Data + Insight to get at What, Who, and When
- **Evolving for better results**

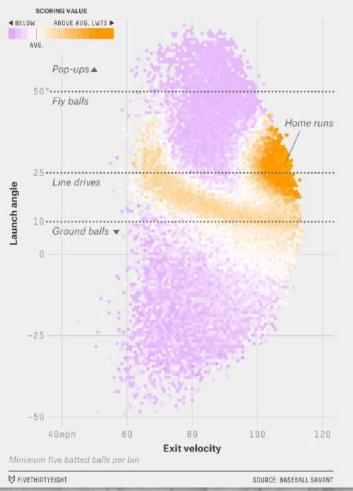






#### The sweet spot

Scoring value (LWTS) of batted balls based on launch angle and speed off the bat, 2015 MLB





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2015	<b>Houston Astros</b>	American League	86	76	.531
2014	<b>Houston Astros</b>	American League	70	92	.432
2013	<b>Houston Astros</b>	American League	51	111	.315
2012	<b>Houston Astros</b>	National League	55	107	.340

"

... A few years of struggle could lead to many years of success.



Solution



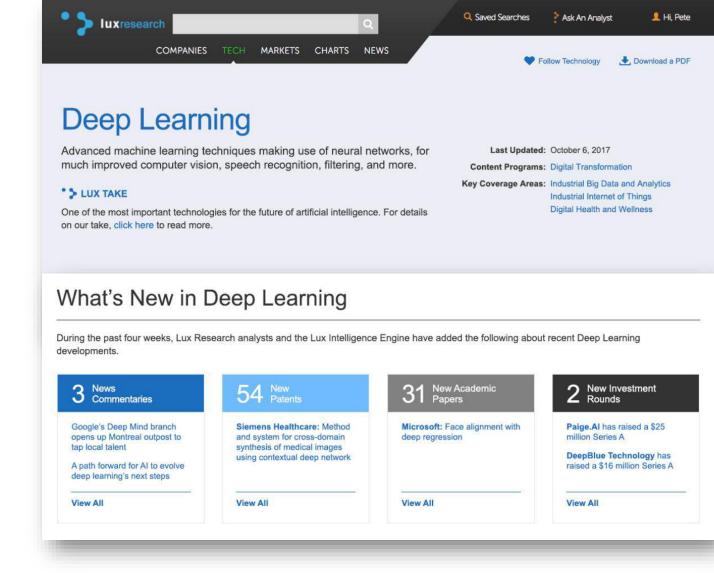




Coming soon...

**Tech Pages** 

Analyst-curated Lux Take on key technology innovations, paired with ongoing updates from multiple data sources



Analyst-curated Lux Take on key technology innovations, paired with ongoing updates from multiple data sources



### Deep Learning

Advanced machine learning techniques making use of neural networks, for much improved computer vision, speech recognition, filtering, and more.

" > LUX TAKE

One of the most important technologies for the future of artificial intelligence. For details on our take, click here to read more.

Last Updated: October 6, 2017

Content Programs: Digital Transformation

Key Coverage Areas: Industrial Big Data and Analytics

Industrial Internet of Things Digital Health and Wellness

#### What You Need to Know

#### \* > LUX TAKE

Deep learning will have a transformative effect on the future of AI, and on digital transformation as a whole. Clients should believe the hype, although keep expectations in check—the high talent requirements and ongoing need for R&D means deep learning will take a while to impact most applications.

#### WHY DEEP LEARNING MATTERS

It is rapid progress on applications that have traditionally stumped artificial intelligence (AI), including accurate image recognition, language processing, and other growing opportunities.

#### **HOW IT WORKS**

Analogously to the human brain, deep learning uses multiple layers of neuron-like computing units that together make up complex neural networks

#### **KEY PLAYERS TO BE AWARE OF**

Software powerhouses Google and Microsoft are doing leading work and already productizing deep learning; electronics stakeholders, especially Samsung Electronics, IBM, and Qualcomm, are also active; within healthcare, Siemens is off to early start.

#### CHALLENGES TO OVERCOME

Deep learning remains difficult to use by many, due to its complexity, lack of available talent, and opacity. Moreover, its use cases are still being refined and expanded.

Understand the landscape of key players, start-ups, and academia...

### Key Player Analysis



In this section, we analyze key players of different types, using our curated data science approach that analyzes patents, papers, investments, and more to identify the leaders in deep learning.

#### \* > LUX TAKE

As the likes of Google and Microsoft continue to build up strength in deep learning, start-ups offer an enticing way to catch up.

Developing successful products that make use of deep learning requires some very specific and rare skill sets, and not enough of these specialists exist in the world. With many of these working at the likes of Google and Microsoft, the war for talent is intensifying.

That problem makes start-ups especially attractive in this space, as they can offer a rapid—albeit expensive—way to catch up in the war for talent and IP. However, hype runs rampant even within deep learning, so extra due diligence is crucial.



Understand the landscape of key players, start-ups, and academia...

...along with case studies on successful deployments

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# Case Studies: How Firms use Deep Learning

Curated by Shriram Ramanathan, Senior Analyst
Questions? Submit an inquiry.
Last updated on January 16, 2018



GE HEALTHCARE

GOOGLE

BASF

TOYOTA

\* > LUX TAKE

Clinical decision support using AI is already off to a strong start (see the report "The Future if Artificial Intelligence in Health"), and this bolsters GE's position there further. Solid partnerships between two leaders in the space make for a strong strategy for applied deep learning.



LUX CASE STUDIES: DEEP LEARNING IN HEALTHCARE APPLICATIONS

GE Healthcare brings Nvidia's deep learning platform to imaging devices, aiming for faster scans and lower radiation doses

#### INTRODUCTION

GE and Nvidia have worked together on healthcare for years, and this latest radiology-focused announcement focuses on Nvidia's offerings around deep learning and edge computing.

#### WHAT THE TECHNOLOGY IS USED FOR

Deep learning is particularly well-suited for image analysis, and GE aims to improve image quality, speed up scan times, and lower radiation dosage. Some 500,000 existing GE Healthcare imaging devices will benefit from Nvidia's AL platform, and GE plans to develop future products using the technology.

Track trends and updates in key innovation areas like patents, academic papers,

### Patent Analysis



#### \* > LUX TAKE

IP opportunities remain for application-specific work. Convolutional neural networks are of high interest within deep learning, and nearly all leaders are actively pursuing it.

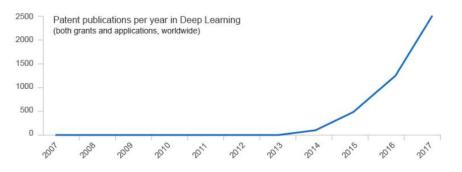
The patent landscape shows how extremely nascent deep learning is—activity was practically zero even just 10 years ago. Since then, software and hardware developers have jumped in, but plenty of room remains for more specialized developers, especially in the application side. For example, Ford Motor is beginning to shore up IP here, but few other OEMs are.

While some like Google and Samsung electronics have investigated both convolutional neural networks and recurrent neural networks for deep learning, most are focusing their attention on the former. Qualcomm in particular is betting heavily on it. The other

#### **OVERALL TRENDS**

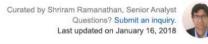


Patent publications in Deep Learning have been growing at a rapid pace since 2013—with a CAGR of 139% during the past five years—reaching more than 2,000 per year.



Track trends and updates in key innovation areas like patents, academic papers, and venture capital investment

### Patent Analysis



#### \* > LUX TAKE

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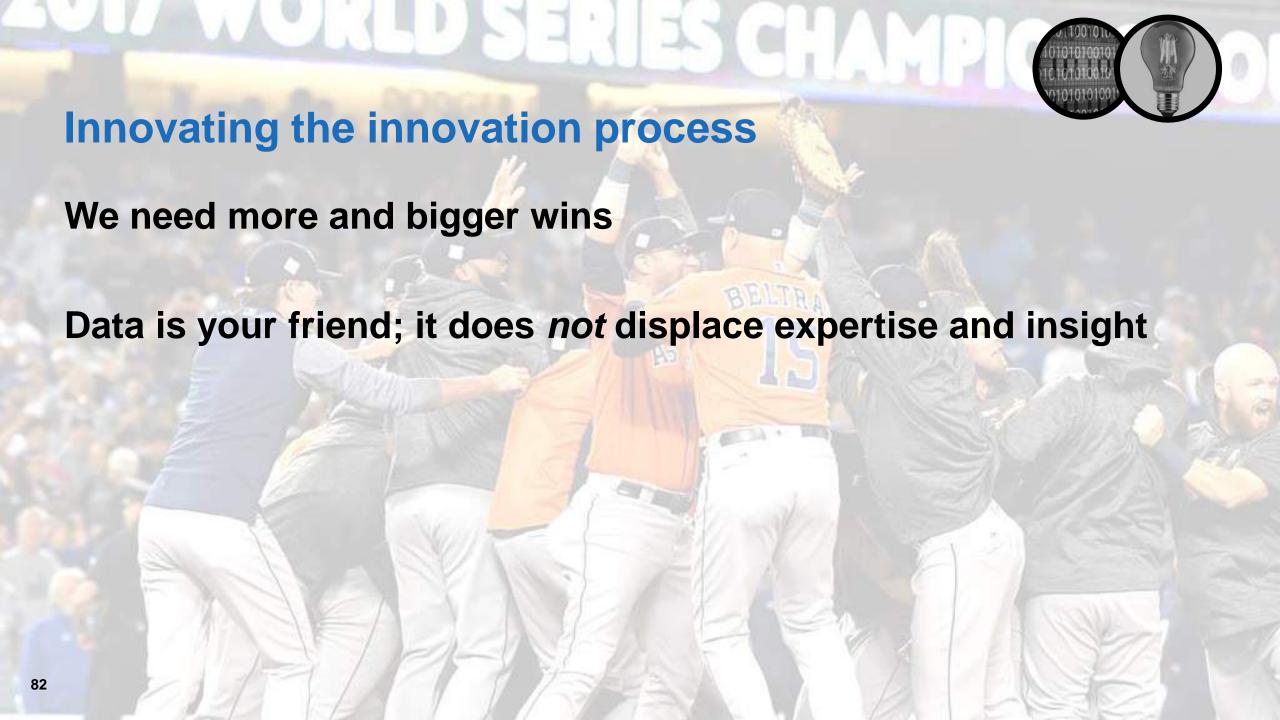
2500 Detant publications per year in Dean L.

#### HIGHLIGHTED RECENT INVESTMENTS











# Innovating the innovation process

We need more and bigger wins

Data is your friend; it does not displace expertise and insight

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Thank you for joining us.





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