"Datafication" — the rise of big data and the application of AI to everything

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presentations.dubberly.com/Daikin_IoT.pdf

For the 21st century, data will be what oil was for the 20th century.



— The world's most valuable resource is no longer oil, but data

The Economist, May 6, 2017

https://www.economist.com/news/leaders/21721656-data-economy-demands-new-approach-antitrust-rules-worlds-most-valuable-resource

"If you went to bed last night thinking you're an industrial company, you're going to wake up this morning as a software and analytics company."

— Jeff Immelt, former Chairman and CEO, General Electric

Minds + Machines 2014 www.ge.com/stories/industrial-internet

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GE sold its appliance group for \$3.3 billion. Google bought Nest for \$3.2 billion.



- 12,000 employees
- \$5 billion in revenue
- 7 to 10 million appliances per year
- Appliance Park factory complex



- 250 employees
- \$250 million in revenue

- 480,000 thermostats per year - Manufacturing outsourced to China

"Creative Destruction is the essential fact about capitalism."

"Capitalism, then, is by nature a form or method of economic change and not only never is but never can be stationary....

The fundamental impulse that sets and keeps the capitalist engine in motion comes from the new consumers' goods, the new methods of production or transportation, the new markets, the new forms of industrial organization...

that incessantly revolutionizes the economic structure from within, incessantly destroying the old one, incessantly creating a new one.

—Joseph A. Schumpeter, (1942) *Capitalsim, Socialism and Democracy*, pages 82-83.



We have seen five industrial revolutions; what will be the sixth?



The shrinking cycle time may be due to organized research and possibly to one or more "network effects."

Google CEO Sundar Pichai has predicted "AI First".





Google CEO, Sundar Pichai spoke at the #MadeByGoogle event on October 4, 2016

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"Al First"

Siri co-founder Dag Kittlaus is focused on "assistants".



Web

Mobile

Siri co-founder Dag Kittlaus unveiled Viv at TechCrunch Distrupt NY 2016





Assistants

In each era, the dominant technology is a "platform" a system on which others can build.



Monitoring + Prediction Services



AI + Data + IoT Today

In the early 1980s, personal computers changed the way business is done. Think of this as *going digital*; everything is becoming a computer.

"...software is eating the world. ...we are in the middle of a dramatic and broad technological and economic shift in which software companies are poised to take over large swathes of the economy...

- Marc Andreessen, founder, Netscape and Andreessen-Horowitz



In the mid-1990s, the internet changed the way consumers + business communicate. Think of this as *getting connected*; everything becomes a web service.

"I envision a 21st century form of business where the everyday consumer is helping shape the social contract ...

It's a business world that is moving from value-based transactions to values-based partnerships."

— Paul Polman, CEO, Unilver



In 2007, smartphones made computing ubiquitous—and turned it into communicating. Think of this as *always connected*; anywhere, anytime.

"Design has also evolved from the design of objects both physical and immaterial, to the design of systems, to the design of complex adaptive systems.

— Joi Ito, Director, MIT Media Lab

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Today is like 1981, 1995 and 2007 all over again. You can see the next wave coming. It goes by many names:

Internet of Things (IoT) Internet of Everything, Cisco Industrial Internet, GE Smarter Planet, IBM Living Services, Accenture Platform World, Sapient. Publicis **Social CRM or Social Business Digital Engagement Digital Transformation** "Datafication"

The eras Pichai + Kittlaus describe can be seen as "waves", with several trends interacting.





Conversational UI/UX

Virtual reality Augmented reality Chatbots

Predictive analytics AI 2.0 Machine learning **Deep learning Computer vision** Natural language processing

AI + Data + IoT = "Datafication"

Combinatorial innovation explains how trends work together.

"We're in the middle of a period of... 'combinatorial innovation'... In the 1800's, it was interchangeable parts. In 1920, it was electronics. In the 1970s, it was integrated circuits. Now what we see is a period where you have Internet components... and capabilities to combine these components parts in ways that create totally new innovations."

—Hal Varian, Google's Chief Economist and UC Berkeley Professor



"Datafication" is a series of trends; none capture the whole.

- Sensor Revolution printing sensors on chips; installing measurement capability all around us.
- Smart Things adding "intelligence" to everything, by building in microprocessors.
- Internet of Things (IoT) connecting sensors and smart things to the cloud.
- **Big Data** recording everything that happens in the physical world and online.
- **Cloud Computing** putting massive resources online, so that the marginal cost of computation falls to zero.
- AI, ML, DL, NLP, CV algorithms (often run in the cloud), making sense of the measurements we record.

-"Datafication"

An example

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Harvard Business School professor Michael Porter writes about systems of systems.



— Michael Porter and James Heppelmann, How Smart, Connected Products Are Transforming Competition Harvard Business Review, November 2014 https://hbr.org/2014/11/how-smart-connected-products-are-transforming-competition

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Products are becoming "smart."

- Product
- + Sensor
- + Computer
- = Smart Product



Sets of smart products are connecting. Smart Product

- + Network
- + Cloud Service
- = Smart, Connected Product



Sets of connected products form product systems. Smart, Connected Product + other Smart, Connected Products = Product System



Systems connect to other systems, forming ecologies. **Product Systems**

- + other Product Systems
- = Product-Services Ecology





Farms are becoming automated factories. Plants are attached to sensors, connected to networks, generating data.



Macro view: processed satellite images of crop growth over time, e.g., central lowa, March 29 to October 23, in 8 day increments.

Algorithms automatically align images, remove clouds, and detect vegetation.



Daily weather data can augment machine learning.

Precipitation, temperature, wind direction and speed, snow cover, and cloud cover can aid forecasting.



In 2015, Descartes Labs used satellite and weather data and machine learning to make the first entirely automated forecasts of crop production.

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Descartes Labs predicted US corn product within about 1.9% of actual production later reported by USDA.



Descartes Labs is a signal of a massive change.

- Self-driving cars, trucks, and drones
- IBM Watson Health
- GE Predix and Siemens MindSphere
- Apple Siri, Viv (now Samsung), Amazon Alexa, Google Assistant, Facebook M, Microsoft Cortana
- FBI's Facial Analysis, Comparison, and Evaluation (FACE) Services has access to > 400 million photos.

Large, unique databases are inherently valuable.

data + algorithms = prediction

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Another example

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In 2015, Robert Wood Johnson Foundation funded a pilot study to look at new ways of measuring family caregiving.



Robert Wood Johnson Foundation

We looked at 14 households, with 20 participants, with 21 chronic conditions.



birth. She devotes several hours a day to care for her own condition. She also cares for her teenage son Albert, who has depression

for her mother Debby (80s) who requires 24x7 care for dementia. Additional support comes from a paid home aide and other family members.

mother Josephine (70s) who has Alzheimer's. With no one to help her, she has put PhD studies on hold to provide 24x7 care.

of her mother Karen (101), who has Alzheimer's. Gabrielle also has health issues of her own and the sleepless nights and caregiving needs of her mother have taken a toll.



Fernando and his wife Laura (50s) are the primary caregivers for Fernando's mother Maria (80s) who has Alzheimer's disease as well as other health conditions. Together, Fernando and Laura have built a care network to support Maria.



Jerry and two teenage sons, Larry and Karl. Karl has Type 1 Diabetes. Nadine is his primary caregiver.



for each other. Patty has **multiple** sclerosis (MS) and Nate has glioblastoma, a terminal condition.

who has behavioral and emotional difficulties stemming from **XYY** Chromosome Disorder.

(50s) care for their pre-teen children, Wanda and Sam. Wanda has severe epilepsy and cerebral palsy. She requires 24x7 care. Sam has severe autism and also requires a lot of care. Teddy (40s) and his wife are the primary caregivers for their two young sons, Van and Walter. Van has Aspergers (ADHD type) as well as encopresis, and Walter has cyclical vomiting syndrome.

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Fernando's household



Ida's household

Ida (70s) cares for her husband lan (70s) who has Lewy Body Dementia and **Dysautonomia**. They moved to San Francisco to be nearer to their children two years ago.



Teddy's household





Cindy

Omar's household

Omar (40s) and his separated wife Cindy (40s) share a home with their young son Bob, who has Aspergers.

Using 12 sensors





Measuring 16 factors



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Humidity Temperature

Outdoor unit



Netatmo Outdoor Weather Station

Over an average of 24 hours



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Total length

Study Sleep

Resulting in 5 GB of data—just from the watch.

The BVP sensor is running at 64 Hz. That means it makes a reading every 1/64th of a second. 60 seconds comprise a minute; 60 minutes comprise an hour; and 36 hours is the maximum duration of one of our study sessions.

In other words, one study session comprises 2,160 minutes, and just one of the sensors is collecting 3,840 samples per minute.

That's 8,294,400 samples collected over the course of one 36-hour session.

8,294,000 4,147,200 4,147,200 4,147,200 518,000 518,000 21,772,800 ×19

samples for BVP (at 64 Hz) samples for X axis acceleration (at 32 Hz) samples for Y axis acceleration (at 32 Hz) samples for Z axis acceleration (at 32 Hz) samples for EDA (at 4 Hz) samples for skin temperature (at 4 Hz)

participants

413,683,200

or nearly half a billion data points

- samples of raw data for one participant
Photo log for Fay ×20 additional participants





Black squares replace recognizable faces to ensure privacy.

Gray squares indicate when participants turned the camera off.

White squares indicate the start and stop of the study.

Summary diagram for Fay ×18 additional participants



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Analyzing Fay's summary diagram for insights—morning



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Medical devices are connecting to the cloud, too, including pacemaker-defibrillators, auto-injectors, and glucometers.





In the future, medical products will no longer stand alone. Increasingly, they will exist in complex networked service webs.



Glucometer + processor = computer that can run apps; e.g., bolus calculator, calorie estimator and tracker. When a glucometer connects to a smart-phone, cost can come down, because the meter can build on the phone's processor and display. Plus data can be shared with family and HCPs. A near continuous glucose monitor can be coupled with an insulin pump, forming a glucose management system. The glucose management system can connect with many other systems, such as EMRs, remote alerting, patient population management, drug interaction monitoring, pharmacy order management, and billing.

Unified patient and device data will afford useful views to many constituents.



Patients can know much more about what's happening and can share information with family, friends, and HCPs.



HCPs can receive a more holistic view of each patient and can manage groups of patients more efficiently.



Bio-med engineers can better manage equipment, improve service, and reduce support costs.



Researchers can learn from aggregate data, to improve procedures and care-facility operations.





Product managers can get detailed usage data, to improve next generation products.



A final example

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How do you measure "quality" in playing a piano?

An experiment was created to track the hand movement during multiple piano performances of Beethoven's *Für Elise*.





Twenty-five performances by seven performers were tracked and recorded.

- Grace	3 takes	
– Jamie	2 takes	
 Jiarong 	4 takes	
– Katie	4 takes	
– Kelsie	4 takes	
— Sachiko	3 takes	
– ShanShan	5 takes	



Hypothesis: advanced players move their wrists to a greater degree.

Listening and watching videos of sample performances by Jamie and Sachiko gave a clue.



Sachiko's performance was clearly better. Her wrists moved up and down as she played the piece, while Jamie's wrists were relatively flat.



The orthographic projections are more revealing.



Comparisons show differences in movement in each dimension.



Sachiko

Jamie

The X vs Z plots are the most revealing.



Sachiko



X vs Z plots for all performances the differences are obvious.

- Grace
- Jamie
- Jiarong
- Katie
- Kelsie
- Sachiko
- ShanShan



Calculating standard deviation shows a clear pattern.



What does this mean?

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By 2020, ~50 billion devices will be connected to the Internet; today, ~7 billion computers and tablets are connected.



Sources: The Economist and Cisco

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Automotive

Industrial devices (military and aerospace)

Consumer electronics and medical devices

Computers

Mobile communications

Fixed communications

Sensors will be everywhere — for example, Google + Levi's connected denim smart jacket



Jacquard Woven Gesture Sensor Jacquard Tag

Jacquard App



Jacquard Services

Today's average car has:

-1 engine ~7 small motors (windows, wipers, fans) ~30 micro processors (up to 100 for luxury cars) [1] ~60-100 sensors (growing to 200 by 2020) [2] ~100 million lines of code (up from 2 million lines in a generation) [3]

And it produces "terabytes of data per car per day"

Sources:

[1] http://www.nytimes.com/2010/02/05/technology/05electronics.html

[2] http://www.automotivesensors2015.com/

[3] https://leithporsche.com/news/What+Makes+the+2017+Porsche+Panamera+Different3F+Computer+Code/7659/

[4] Parrish Hanna, Global Director of HMI at Ford (personal communications)



IoT devices in homes will produce and collect massive amounts of data.



IoT devices in homes will produce and collect massive amounts of data: HVAC



IoT devices in homes will produce and collect massive amounts of data: Appliances



IoT devices in homes will produce and collect massive amounts of data: Computers + Entertainment



IoT devices in homes will produce and collect massive amounts of data: Electrical



IoT devices in homes will produce and collect massive amounts of data: Health



IoT devices in homes will produce and collect massive amounts of data: Gas



IoT devices in homes will produce and collect massive amounts of data: Plumbing



IoT devices in homes will produce and collect massive amounts of data: Privacy + Security



IoT devices in homes will produce and collect massive amounts of data:



"Datafication" offers four successive levels of value, (based on a model by Michael Porter)

Automation — enabling systems to run autonomously, (e.g., programmed trading, self-driving cars, etc.).

Optimization — predicting changes (e.g., usage, failure, etc.), and deploying resources accordingly (i.e., arbitrage).

Control — correcting variables that exceed thresholds, ensuring that systems operate within bounds.

Monitoring — measuring operations; sending alerts as variables approach thresholds.



Daikin could build or partner with a big-data refinery — on a cloud-based super-computer.

Data Refinery

Google Cloud Platform

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The platform could support a series of pipelines for chaining events (automated transforms) at massive scale.



The platform could build an archive of data on consumers and equipment use.



Large data sets enable development of models and predictions; the more data, the more accurate the results.



Models can be put into production, creating control systems that drive operations.



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Infrastructure

As production systems accumulate data and results, they improve their models — effectively "learning."



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Infrastructure

In the near term, Daikin has opportunities to use "datafication" for ...

- Streamlining the commissioning process
- Reprint the process was done right
- Enabling more efficient operation
- Identifying potential failures before they happen
- Building a relationship with customers
- Collecting data to drive next generation of products

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