



Lecture I: Data Analytics

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AGENDA

01 What is Data Analytics?

02 What Can We Do with Data Analytics?

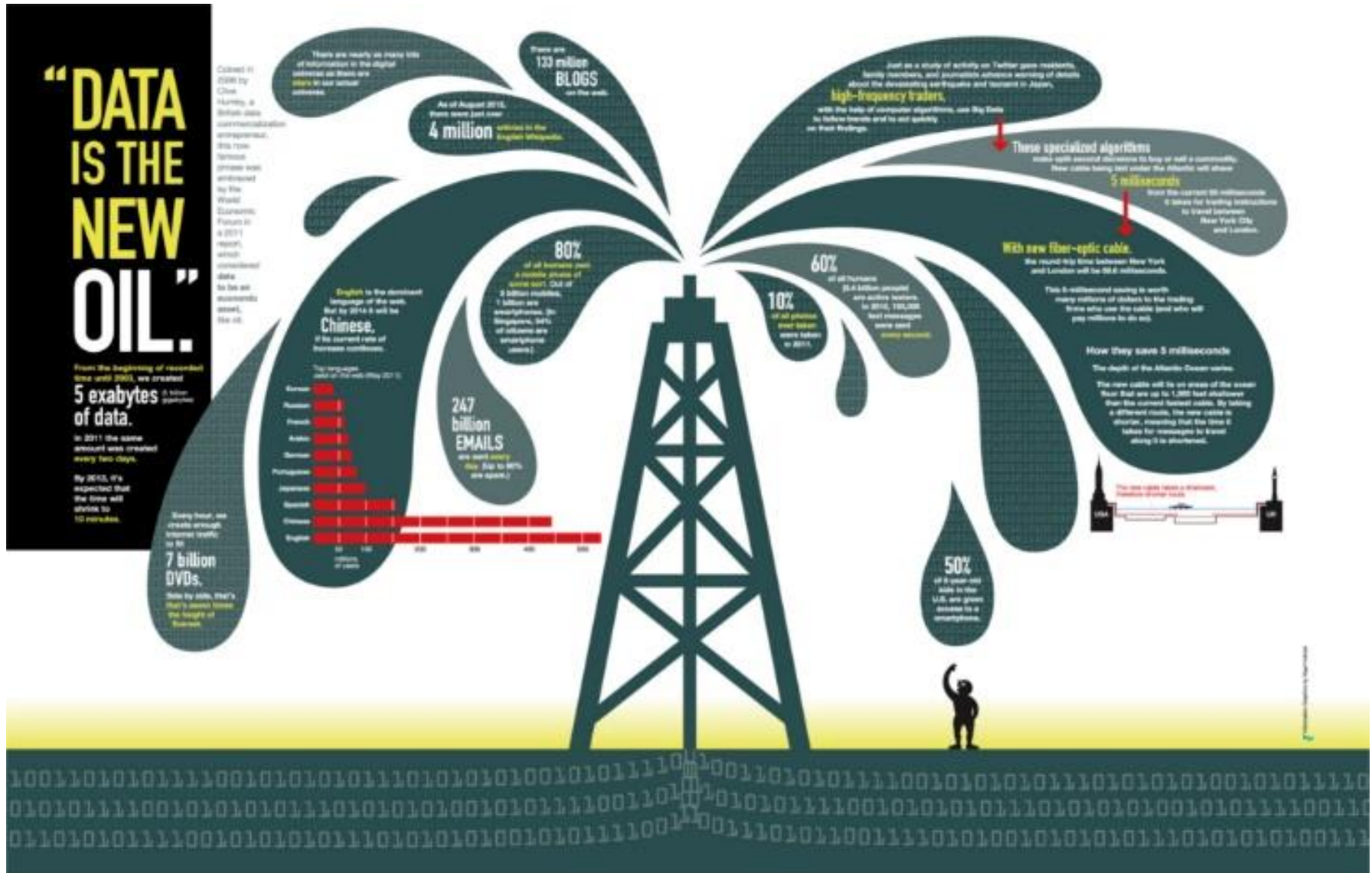
03 Data Analytics Languages: R & Python

Data Analytics

- Data Analytics by Amazon



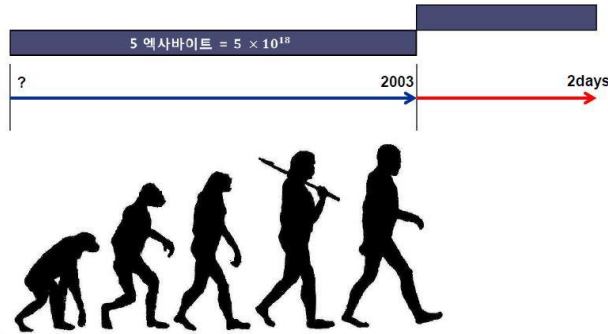
Data Analytics: The Era of “Big Data”



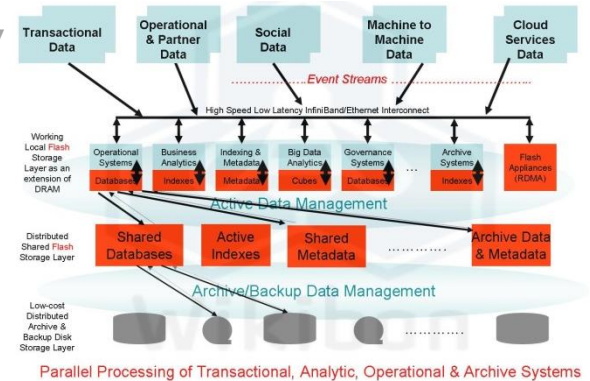
Data Analytics: The Era of “Big Data”

• 4Vs in Big Data

Volume



Velocity



Variety

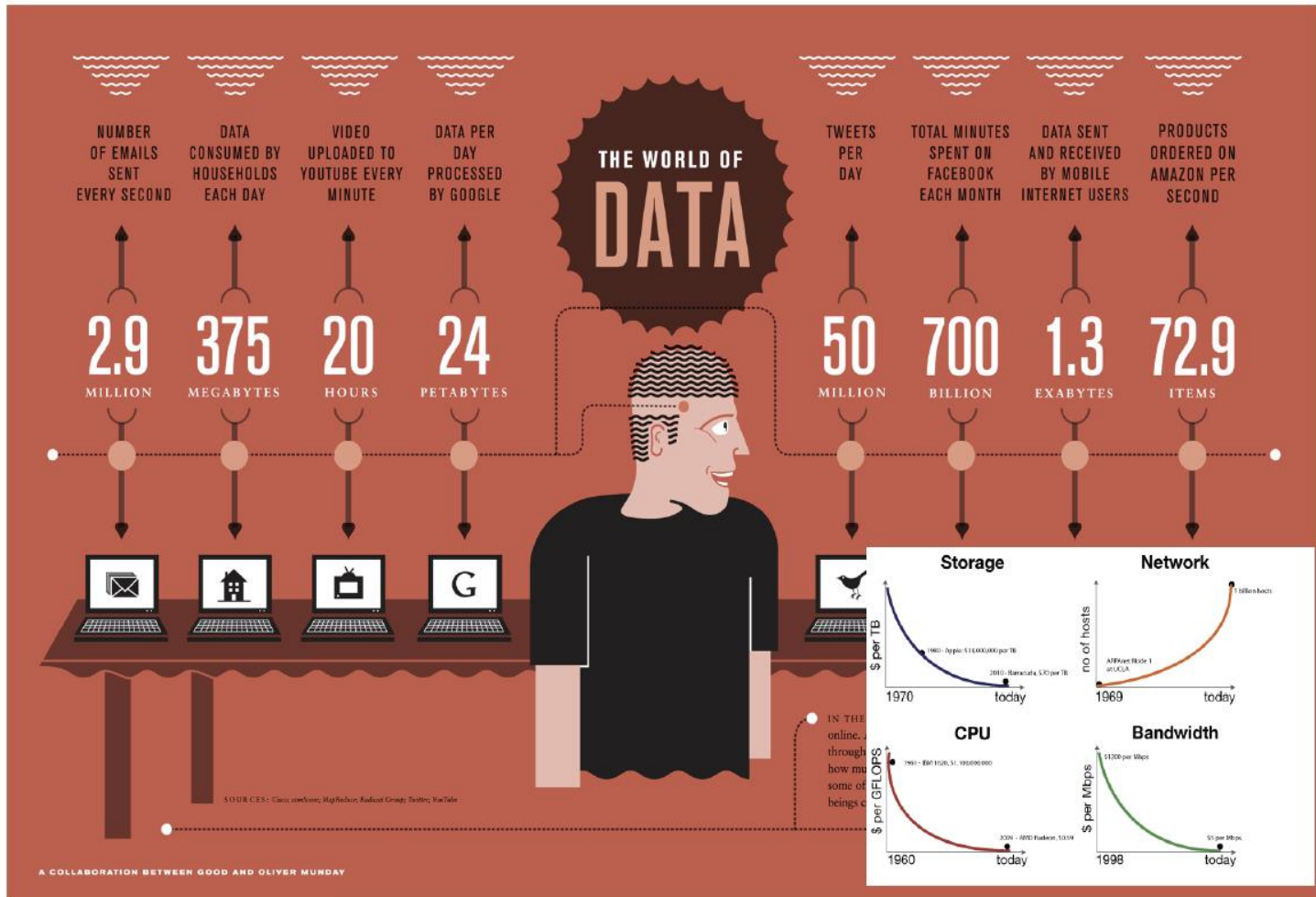


Value



Data Analytics: The Era of “Big Data”

- Volume of Big Data



- Velocity of Big Data



Data Analytics: The Era of “Big Data”

- Variety in Big Data

As of 2011, the global size of data in healthcare was estimated to be

150 EXABYTES

[161 BILLION GIGABYTES]



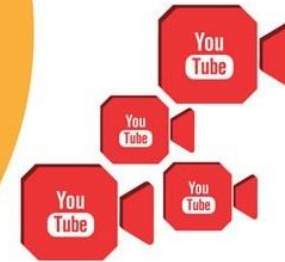
By 2014, it's anticipated there will be

**420 MILLION
WEARABLE, WIRELESS
HEALTH MONITORS**



**4 BILLION+
HOURS OF VIDEO**

are watched on
YouTube each month



Variety
**DIFFERENT
FORMS OF DATA**

**30 BILLION
PIECES OF CONTENT**

are shared on Facebook
every month



400 MILLION TWEETS

are sent per day by about 200
million monthly active users



Data Analytics: The Era of “Big Data”

- Value in Big Data

Big data can generate significant financial value across sectors



US health care

- \$300 billion value per year
- ~0.7 percent annual productivity growth



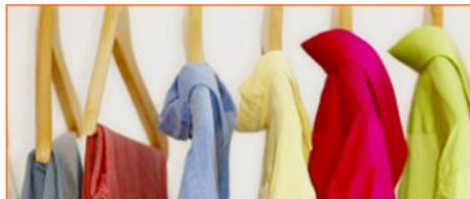
Europe public sector administration

- €250 billion value per year
- ~0.5 percent annual productivity growth



Global personal location data

- \$100 billion+ revenue for service providers
- Up to \$700 billion value to end users



US retail

- 60+% increase in net margin possible
- 0.5–1.0 percent annual productivity growth

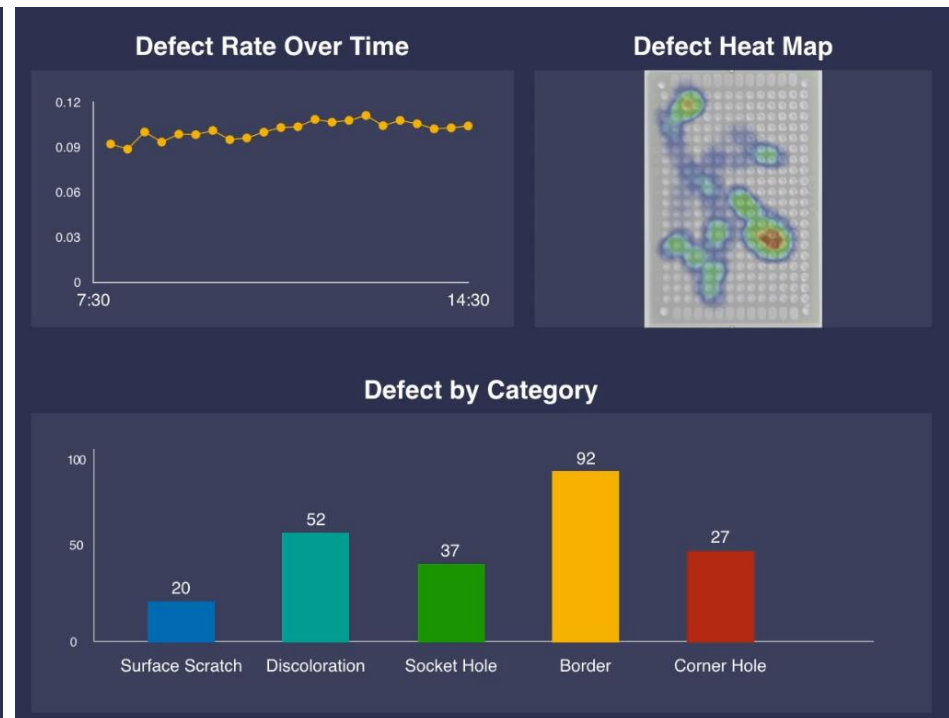


Manufacturing

- Up to 50 percent decrease in product development, assembly costs
- Up to 7 percent reduction in working capital

Data Analytics

- Data Analytics in Industrial Engineering (Manufacturing)
 - ✓ Landing.ai: AI Startup found by Andrew Ng
 - ✓ Provide various image/video analytics solutions for fault detection, leak defect detection, etc.



Understanding Analytics

• Descriptive vs. Predictive vs. Prescriptive Analytics

Understanding analytics Definitions, sample applications and opportunities, and underlying technologies			
	Descriptive	Predictive	Prescriptive
	What HAS happened?	What COULD happen?	What SHOULD happen?
What the user needs to DO	<ul style="list-style-type: none"> • Increase asset reliability • Reduce labor and inventory costs 	<ul style="list-style-type: none"> • Predict infrastructure failures • Forecast facilities space demands 	<ul style="list-style-type: none"> • Increase asset utilization • Optimize resource schedules
What the user needs to KNOW	<ul style="list-style-type: none"> • The number and types of asset failures • Why maintenance costs are high • The value of the materials inventory 	<ul style="list-style-type: none"> • How to anticipate failures for specific asset types • When to consolidate underutilized facilities • How to determine costs to improve service levels 	<ul style="list-style-type: none"> • How to increase asset production • Where to optimally route service technicians • Which strategic facilities plan provides the highest long-term utilization
How analytics gets ANSWERS	<ul style="list-style-type: none"> • Standard reporting - What happened? • Query/drill down - Where exactly is the problem? • Ad hoc reporting - How many, how often, where? 	<ul style="list-style-type: none"> • Predictive modeling - What will happen next? • Forecasting - What if these trends continue? • Simulation - What could happen? • Alerts - What actions are needed? 	<ul style="list-style-type: none"> • Optimization - What is the best possible outcome? • Random variable optimization - What is the best outcome given the variability in specified areas?
What makes this analysis POSSIBLE	<ul style="list-style-type: none"> • Alerts, reports, dashboards, business intelligence 	<ul style="list-style-type: none"> • Predictive models, forecasts, statistical analysis, scoring 	<ul style="list-style-type: none"> • Business rules, organization models, comparisons, optimization
Business value →			

데이터분석을 위한 프로그래밍 언어
수리통계 및 실습
자료구조 및 알고리즘
응용통계 및 실습

데이터마이닝
다변량분석
예측애널리틱스
영상정보시스템

OR-I 및 실습
OR-II 및 실습
최적화이론
최적화응용
메타휴리스틱

Data Scientist

- Data Scientist: The Sexiest Job of the 21st Century

- ✓ Harvard Business Review

- ✓ <https://hbr.org/2012/10/data-scientist-the-sexiest-job-of-the-21st-century>

MODERN DATA SCIENTIST

Data Scientist, the sexiest job of 21st century requires a mixture of multidisciplinary skills ranging from an intersection of mathematics, statistics, computer science, communication and business. Finding a data scientist is hard. Finding people who understand who a data scientist is, is equally hard. So here is a little cheat sheet on who the modern data scientist really is.

MATH & STATISTICS

- ☆ Machine learning
- ☆ Statistical modeling
- ☆ Experiment design
- ☆ Bayesian inference
- ☆ Supervised learning: decision trees, random forests, logistic regression
- ☆ Unsupervised learning: clustering, dimensionality reduction
- ☆ Optimization: gradient descent and variants

PROGRAMMING & DATABASE


- ☆ Computer science fundamentals
- ☆ Scripting language e.g. Python
- ☆ Statistical computing package e.g. R
- ☆ Databases SQL and NoSQL
- ☆ Relational algebra
- ☆ Parallel databases and parallel query processing
- ☆ MapReduce concepts
- ☆ Hadoop and Hive/Pig
- ☆ Custom reducers
- ☆ Experience with xaaS like AWS

DOMAIN KNOWLEDGE & SOFT SKILLS

- ☆ Passionate about the business
- ☆ Curious about data
- ☆ Influence without authority
- ☆ Hacker mindset
- ☆ Problem solver
- ☆ Strategic, proactive, creative, innovative and collaborative

COMMUNICATION & VISUALIZATION

- ☆ Able to engage with senior management
- ☆ Story telling skills
- ☆ Translate data-driven insights into decisions and actions
- ☆ Visual art design
- ☆ R packages like ggplot or lattice
- ☆ Knowledge of any of visualization tools e.g. Flare, D3.js, Tableau



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MarketingDistillery.com is a group of practitioners in the area of e-commerce marketing. Our fields of expertise include: marketing strategy and optimization; customer tracking and on-site analytics; predictive analytics and econometrics; data warehousing and big data systems; marketing channel insights in Paid Search, SEO, Social, CRM and brand.

Marketing
DISTILLERY

Data Science Tasks

- Data Mining

- ✓ The process of **exploration and analysis**, by automatic or semi-automatic means, of **large quantities of data** in order to **discover meaningful patterns and rules**. (Berry and Linoff, 1997, 2000)

Customers who viewed this item also viewed these products



Dualit Food XL1500
Processor

\$560

 Add to cart



Kenwood kMix Manual
Espresso Machine



\$250

 Select options



Weber One Touch Gold
Premium Charcoal
Grill-57cm

\$225

 Add to cart



NoMU Salt Pepper and
Spice Grinders

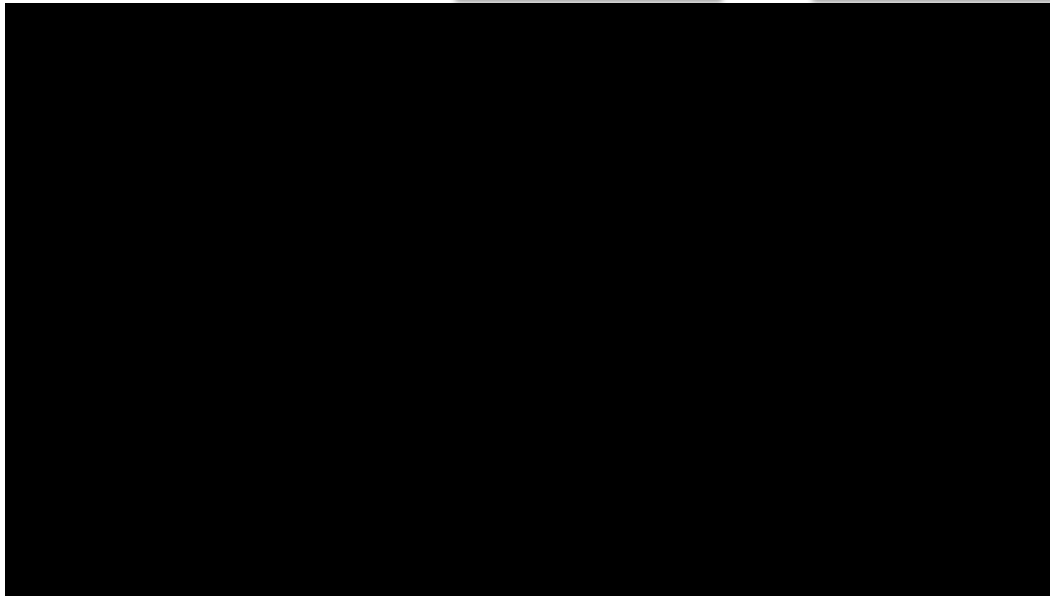
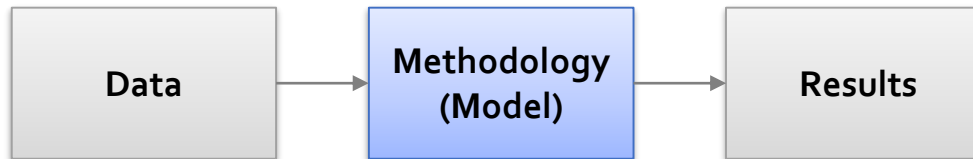
\$3

 View options

Data Science Tasks

- Machine Learning

- ✓ A computer program is said to **learn** from experience E with respect to some class of tasks T and performance measure P, if its performance at task in T, as measured by P, improves with experience E,” – Mitchell et al. (2013)



Data Science Tasks

- Machine Learning Models in Self-Driving Cars



Data Science Tasks

- Artificial Intelligence
 - ✓ Computers and computer software that are capable of intelligent behavior
 - ✓ Intelligent agent perceives its environment and takes actions that maximize its chance of success



AGENDA

01 What is Data Analytics?

02 What Can We Do with Data Analytics?

03 Data Analytics Languages: R & Python

Process Monitoring & Control

Input Data

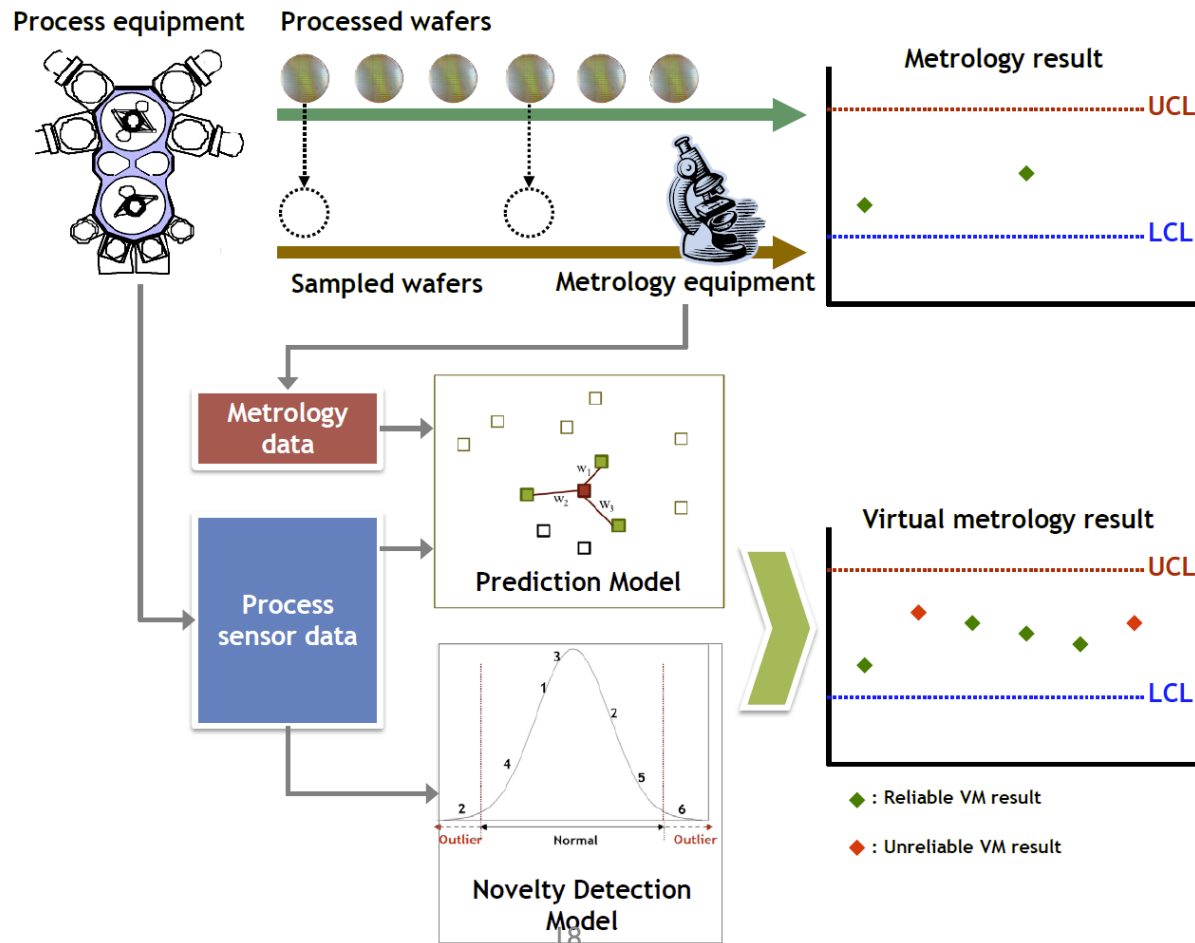
Algorithms

Output

Sensor Data from
Production Equipment

Regression +
Novelty Detection

Metrological Values
With Reliability Scores



Process Monitoring & Control

Input Data

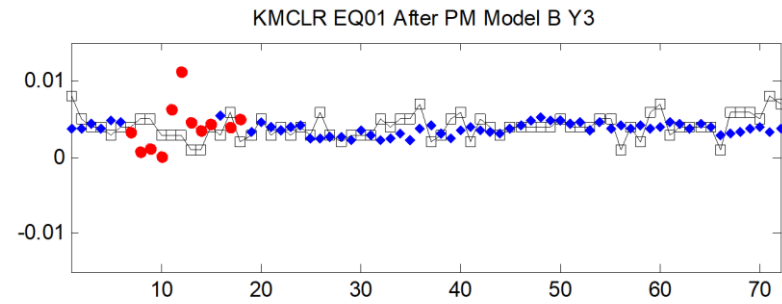
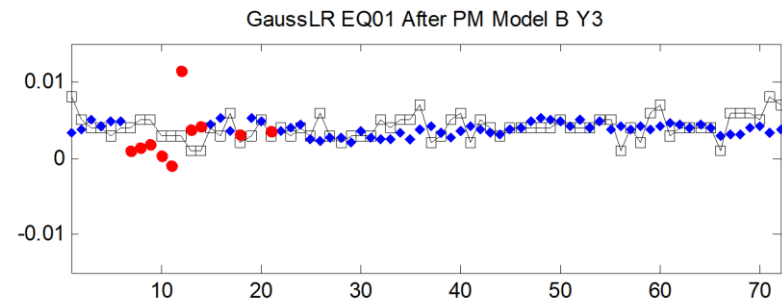
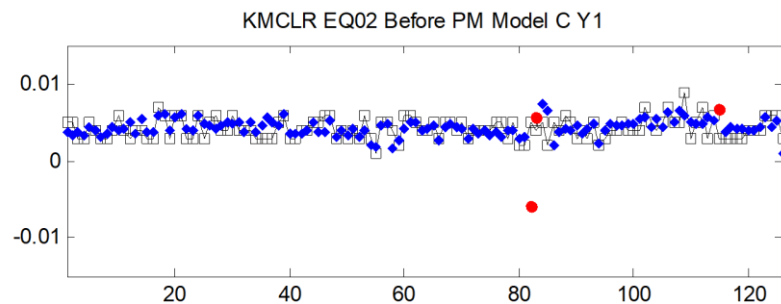
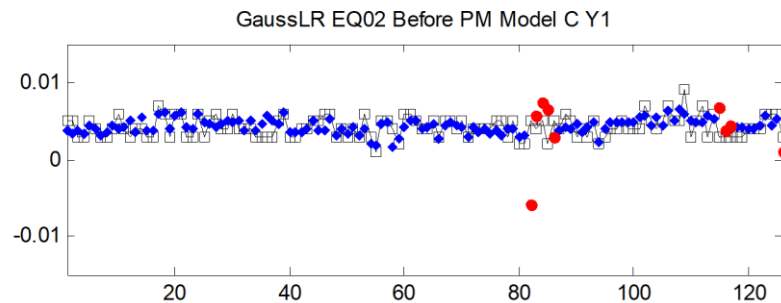
Sensor Data from
Production Equipment

Algorithms

Regression +
Novelty Detection

Output

Metrological Values
With Reliability Scores



Are You a Valid User?

Input Data

Algorithms

Output

Time stamps collected during typing

Novelty Detection

Valid user score

Through various input devices



In any stages

Log in

Don't have an account? [Create one.](#)

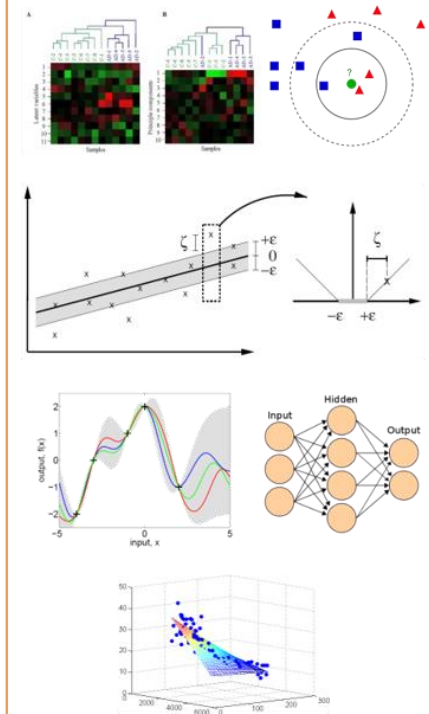
Username:

Password:

☐ Remember me (up to 30 days)



Customized (real-time) authenticator



Who Looks Happy?

Input Data

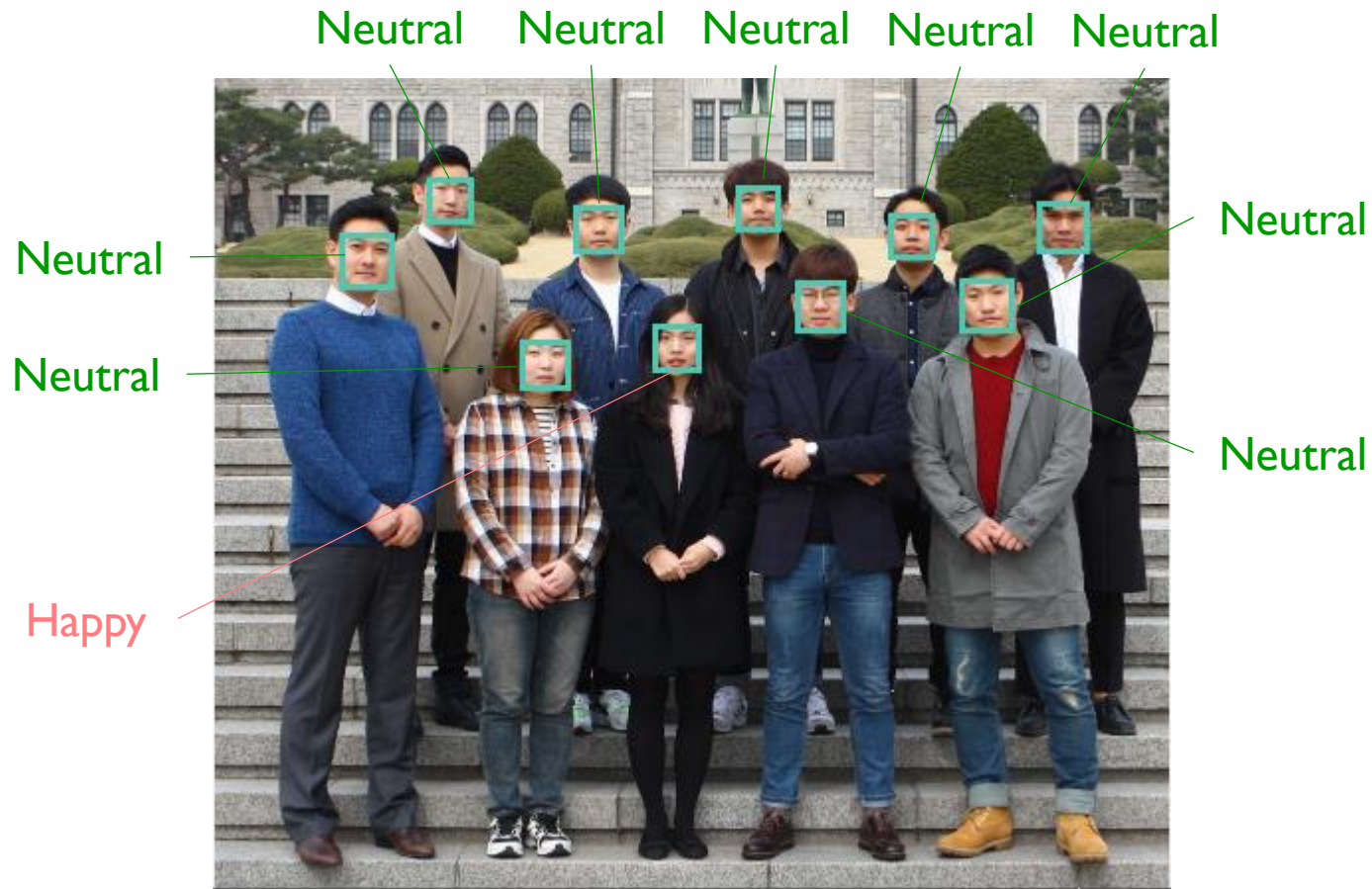
Algorithms

Output

Image

Convolutional Neural
Networks

Emotions Recognized



Favorite Artistic Style

Input Data

Image

Algorithms

Convolutional Neural
Networks

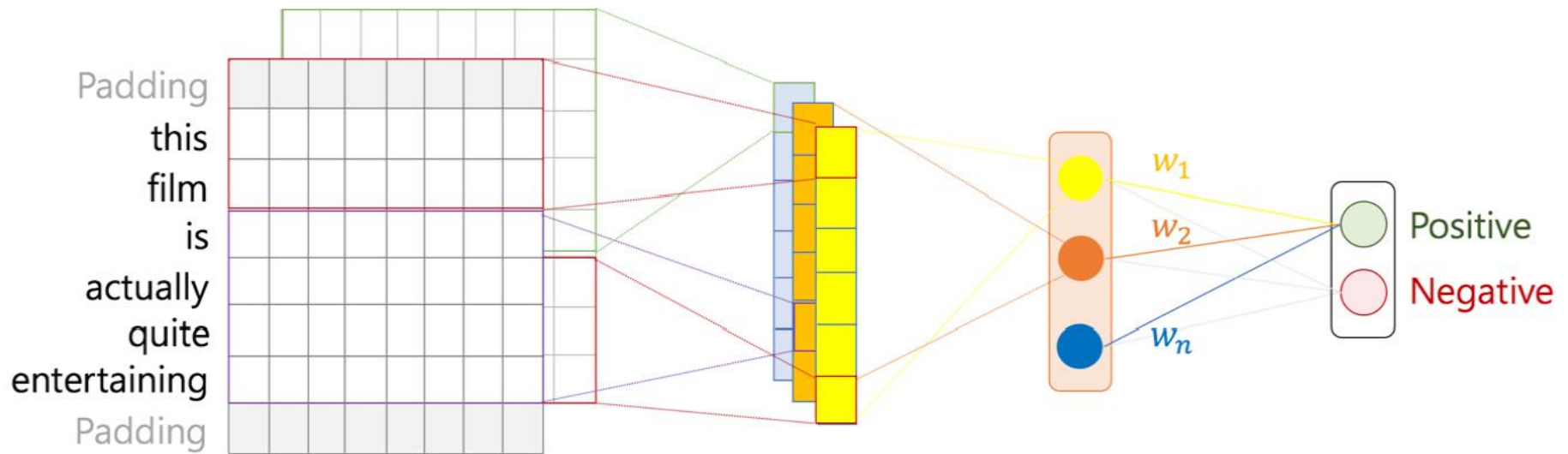
Output

Image with
Preferred Style



Understanding Emotions

Input Data	Algorithms	Output
Movie Review Text	Convolutional Neural Networks	Sentiment (Pos/Neg) & Keyword attention



$$w_1 \times \begin{bmatrix} \text{this} \\ \text{film} \\ \text{is} \\ \text{actually} \\ \text{quite} \\ \text{entertaining} \end{bmatrix} + w_2 \times \begin{bmatrix} \text{this} \\ \text{film} \\ \text{is} \\ \text{actually} \\ \text{quite} \\ \text{entertaining} \end{bmatrix} + \dots + w_n \times \begin{bmatrix} \text{this} \\ \text{film} \\ \text{is} \\ \text{actually} \\ \text{quite} \\ \text{entertaining} \end{bmatrix} = \begin{bmatrix} \text{this} \\ \text{film} \\ \text{is} \\ \text{actually} \\ \text{quite} \\ \text{entertaining} \end{bmatrix}$$

Understanding Emotions

Input Data	Algorithms	Output
Movie Review Text	Convolutional Neural Networks	Sentiment (Pos/Neg) & Keyword attention

Method	Sentence
Raw text	One of the funniest most romantic and most musical movies ever; definitely worth renting/buying especially if you have a taste for older style of cinematography. The animals and the songs alone will make you smile while watching the movie. A definite must for Madonna fans. :o) (10 / 10 points)
Rand	One of the the funniest most romantic and musical movies ever definitely worth renting buying especially if you have a taste for older style cinematography The animals songs alone will make smile while watching movie A definite must Madonna fans Positive
Static	One of the funniest most romantic and musical movies ever definitely worth renting buying especially if you have a taste for older style cinematography The animals songs alone will make smile while watching movie A definite must Madonna fans Positive
NStatic	One of the funniest most romantic and musical movies ever definitely worth renting buying especially if you have a taste for older style cinematography The animals songs alone will make smile while watching movie A definite must Madonna fans Positive
2ch	One of the funniest most romantic and musical movies ever definitely worth renting buying especially if you have a taste for older style cinematography The animals songs alone will make smile while watching movie A definite must Madonna fans Positive

Understanding Emotions

Input Data	Algorithms	Output
Movie Review Text	Convolutional Neural Networks	Sentiment (Pos/Neg) & Keyword attention

Method	Sentence
Raw text	This is one of the most boring films I've ever seen. The three main cast members just didn't seem to click well. Giovanni Ribisi's character was quite annoying. For some reason he seems to like repeating what he says. If he was the Rain Man it would've been fine but he's not. (3 / 10 points)
Rand	This is one of the most boring films I ve ever seen The three main cast members just didn t seem to click w ell Giovanni Ribisi s character was quite annoing For some reason he seems like repeating what says If Rain Man it would be fine but he s not Negative
Static	This is one of the most boring films I ve ever seen The three main cast members just didn t seem to click w ell Giovanni Ribisi s character was quite annoying For some reason he seems like repeating what says If Rai n Man it would be fine but he s not Negative
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What are the Main Topics in Anonymous Posts of University Students?

Input Data

Algorithms

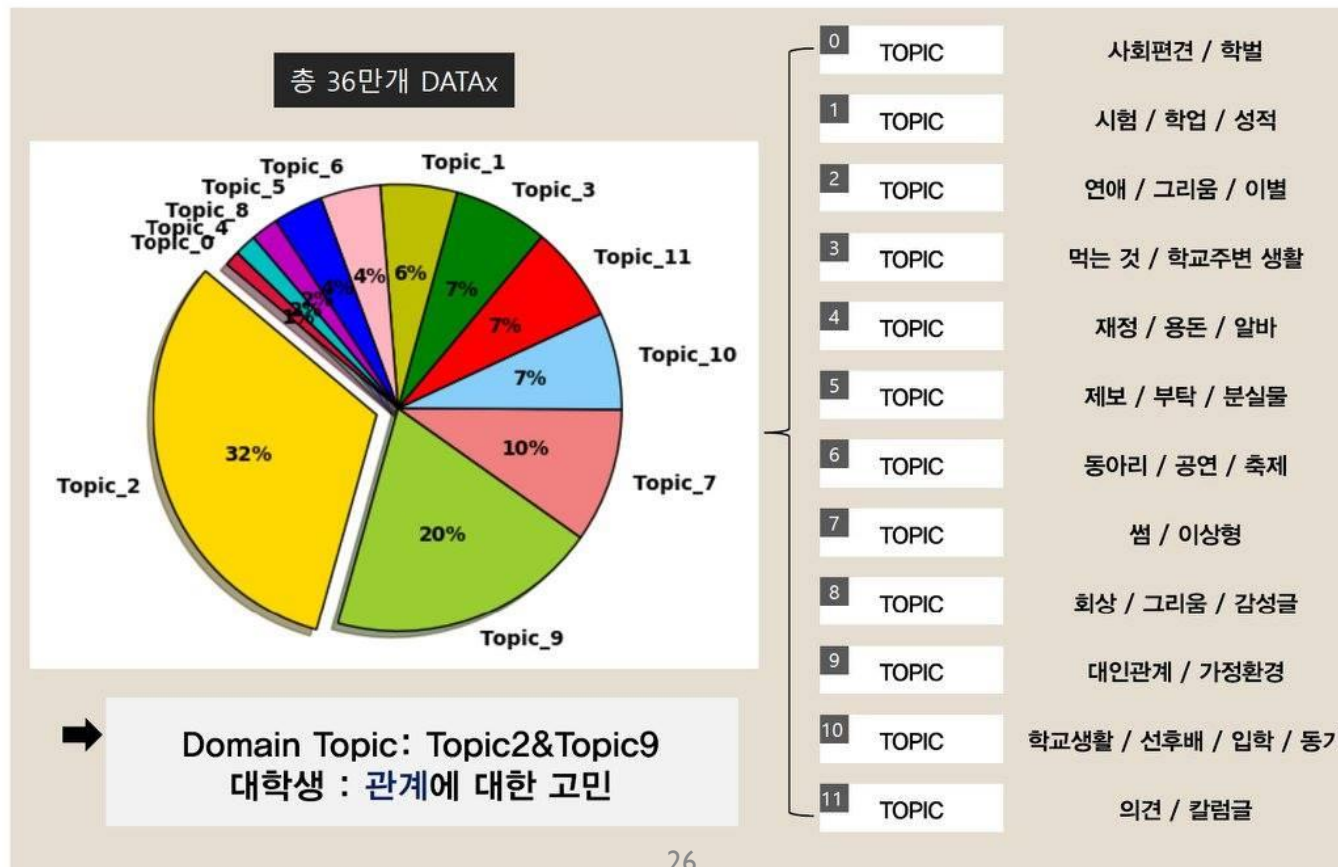
Output

Facebook Posts
(Bamboo forest)

Latent Dirichlet Allocation
(Topic Modeling)

Topic Distribution

[1] 28개 대학 페이스북 대나무숲 주제 분포



What are the Main Topics in Anonymous Posts of University Students?

Input Data

Algorithms

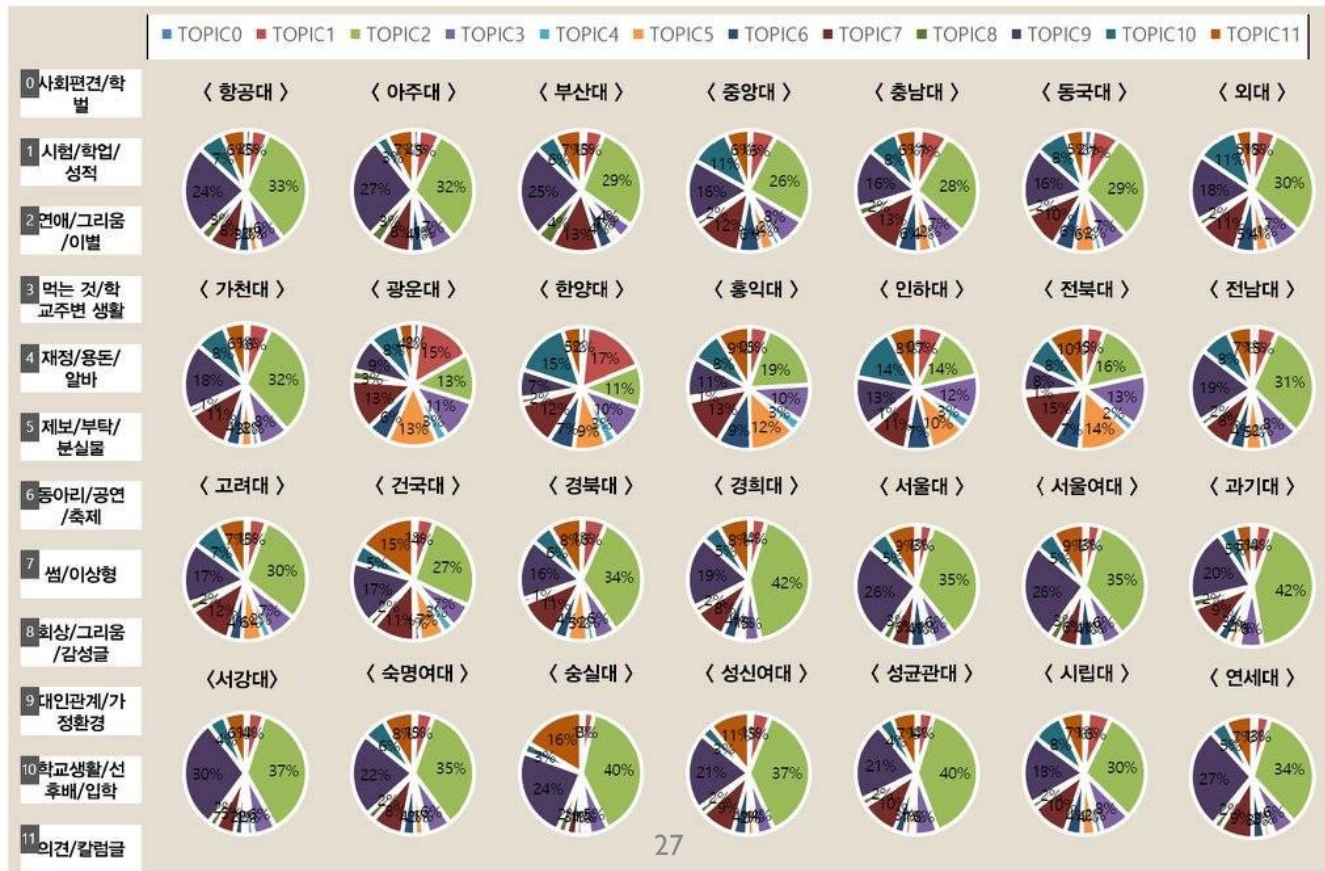
Output

Facebook Posts
(Bamboo forest)

Latent Dirichlet Allocation
(Topic Modeling)

Topic Distribution

[2] 대학별 페이스북 대나무숲 주제 분포



What are the Main Topics in Anonymous Posts of University Students?

Input Data

Algorithms

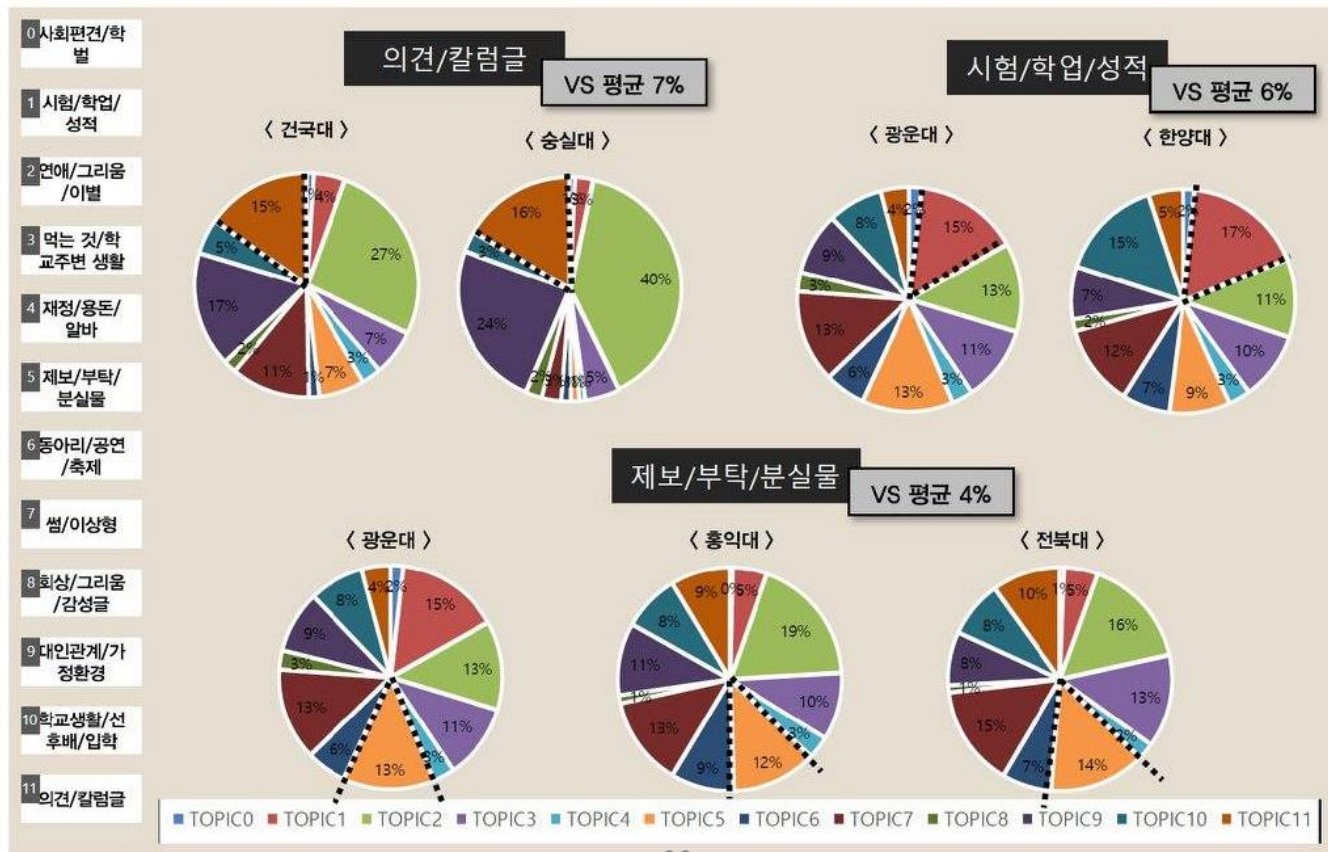
Output

Facebook Posts
(Bamboo forest)

Latent Dirichlet Allocation
(Topic Modeling)

Topic Distribution

[3] 대학별 특이 사항



Connecting the Dots



Connecting the Dots

You can't connect the dots looking forward; you can only connect them looking backwards.

So you have to trust that the dots will somehow connect in your future.

AGENDA

01 What is Data Analytics?

02 What Can We Do with Data Analytics?

03 Data Analytics Languages: R & Python

R vs. Python

- Learn Data Science, not Programming
 - ✓ R vs. Python, different brushes
 - ✓ Do not choose between R & Python, learn both
 - ✓ It strengthens your data science communication skills
 - ✓ It boosts your data science career
 - ✓ It is not that hard

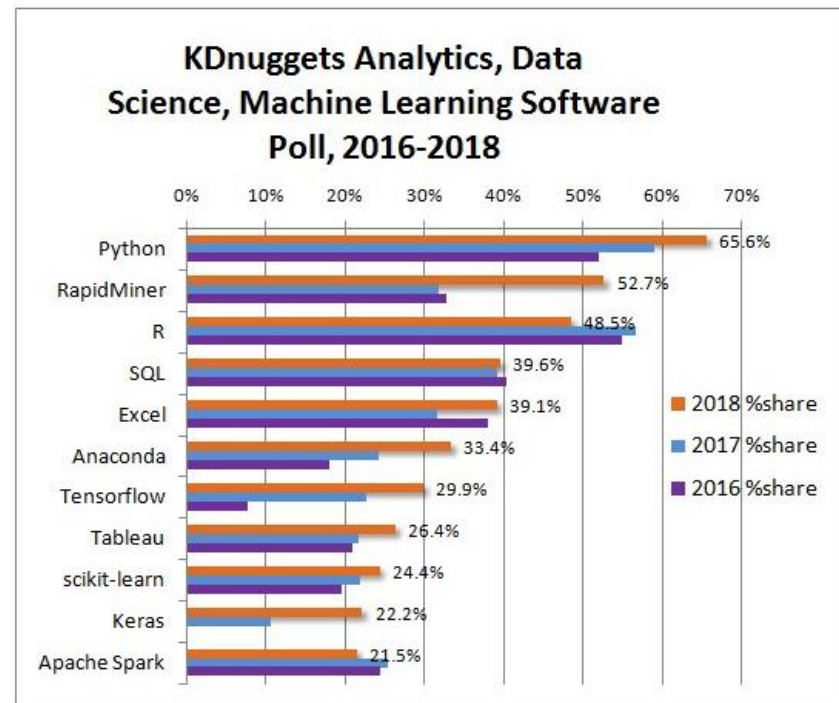


R vs. Python

- Some interesting polls (2018)

Table 1: Top Analytics/Data Science/ML Software in 2018 KDnuggets Poll

Software	2018 % share	% change 2018 vs 2017
Python	65.6%	11%
RapidMiner	52.7%	65%
R	48.5%	-14%
SQL	39.6%	1%
Excel	39.1%	24%
Anaconda	33.4%	37%
Tensorflow	29.9%	32%
Tableau	26.4%	21%
scikit-learn	24.4%	11%
Keras	22.2%	108%



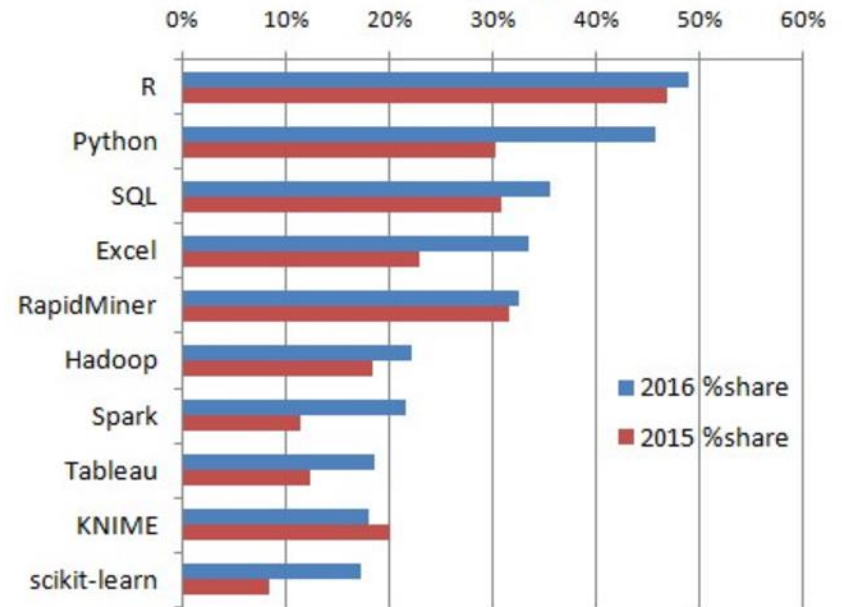
R vs. Python

- Some interesting polls (2016)

Next table has the top 10 most popular tools in 2016 poll

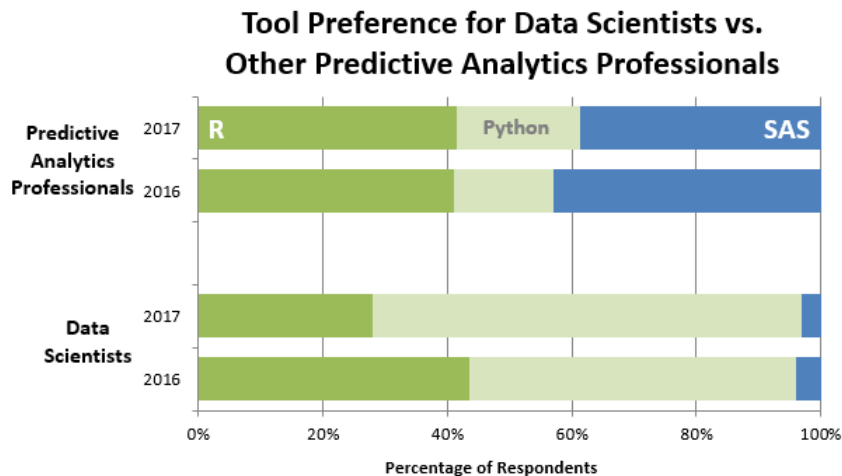
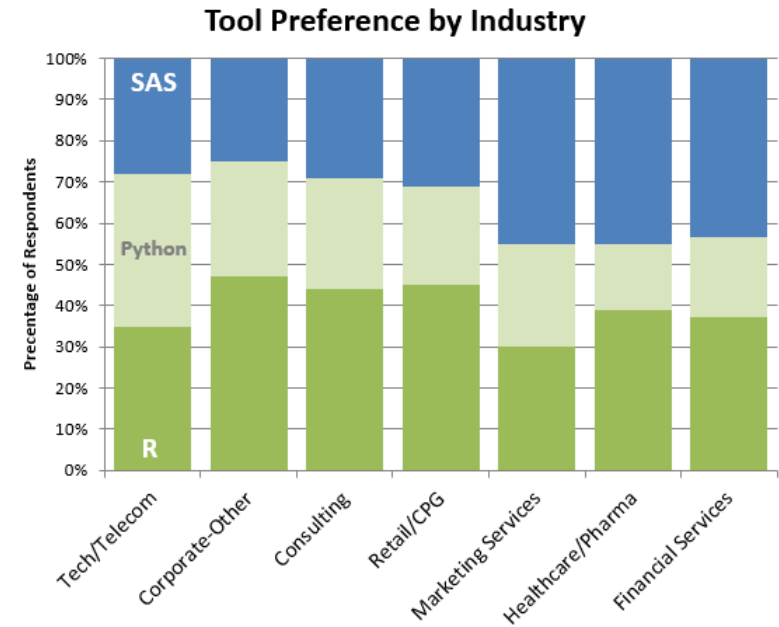
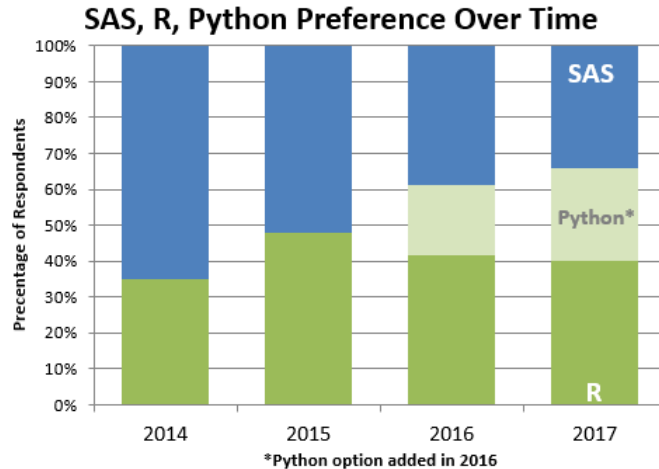
Tool	2016 % share	% change	% alone
R	49%	+4.5%	1.4%
Python	45.8%	+51%	0.1%
SQL	35.5%	+15%	0%
Excel	33.6%	+47%	0.2%
RapidMiner	32.6%	+3.5%	11.7%
Hadoop	22.1%	+20%	0%
Spark	21.6%	+91%	0.2%
Tableau	18.5%	+49%	0.2%
KNIME	18.0%	-10%	4.4%
scikit-learn	17.2%	+107%	0%

**KDnuggets Analytics/Data Science
2016 Software Poll, top 10 tools**



R vs. Python

- Some interesting polls



R vs. Python

- Difference between R and Python

Difference between R and Python

Parameter	R	Python
Objective	Data analysis and statistics	Deployment and production
Primary Users	Scholar and R&D	Programmers and developers
Flexibility	Easy to use available library	Easy to construct new models from scratch. I.e., matrix computation and optimization
Learning curve	Difficult at the beginning	Linear and smooth
Popularity of Programming Language. Percentage change	4.23% in 2018	21.69% in 2018
Average Salary	\$99.000	\$100.000
Integration	Run locally	Well-integrated with app
Task	Easy to get primary results	Good to deploy algorithm
Database size	Handle huge size	Handle huge size
IDE	Rstudio	Spyder, Ipython Notebook
Important Packages and library	tidyverse, ggplot2, caret, zoo	pandas, scipy, scikit-learn, TensorFlow, caret
Disadvantages	Slow High Learning curve Dependencies between library	Not as many libraries as R
Advantages	<ul style="list-style-type: none"> • Graphs are made to talk. R makes it beautiful • Large catalog for data analysis • GitHub interface • RMarkdown • Shiny 	<ul style="list-style-type: none"> • Jupyter notebook: Notebooks help to share data with colleagues • Mathematical computation • Deployment • Code Readability • Speed • Function in Python

R vs. Python

- Data Science Wars: R vs. Python

✓ <https://101.datascience.community/2015/05/12/data-science-wars-r-vs-python/>

