



K A L E I D O
INSIGHTS

Automatically Generated Content

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Media Hungary | May 8., 2018



Agenda

1. What Is AI in Journalism?
2. Technologies
3. Risks
4. Rewards

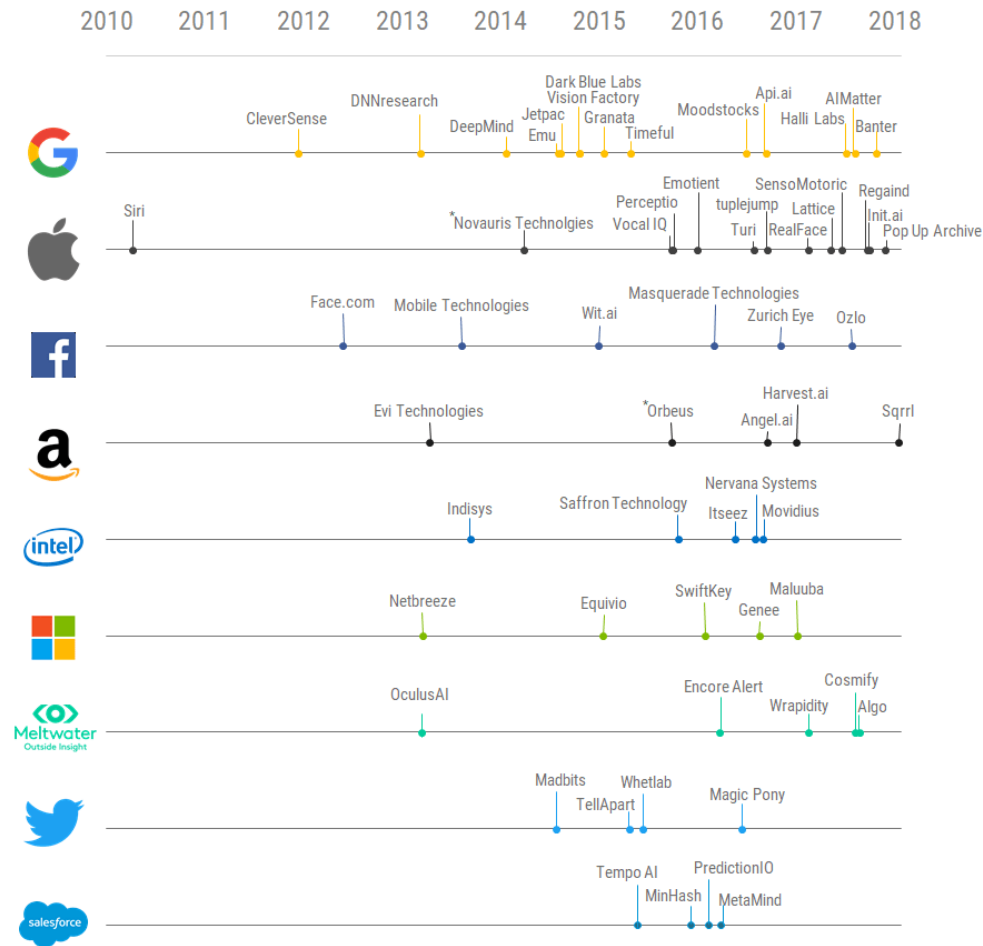
What Is Automation in Journalism?

- Machines automate some of the repetitive tasks and chores involved in getting news published.
- Inputs: Analyzing sources, information and data.
- Outputs: Automatically-generated stories and reporting.



Race To Acquire Top AI Startups Heats Up

Date of acquisition (only includes 1st exits of companies)



Source: cbinsights.com

*approximate dates of acquisition

CBINSIGHTS

Journalistically Relevant AI Technologies

1. Machine Learning

- Supervised
- Unsupervised

2. Natural Language

- Generation
- Processing

3. Speech

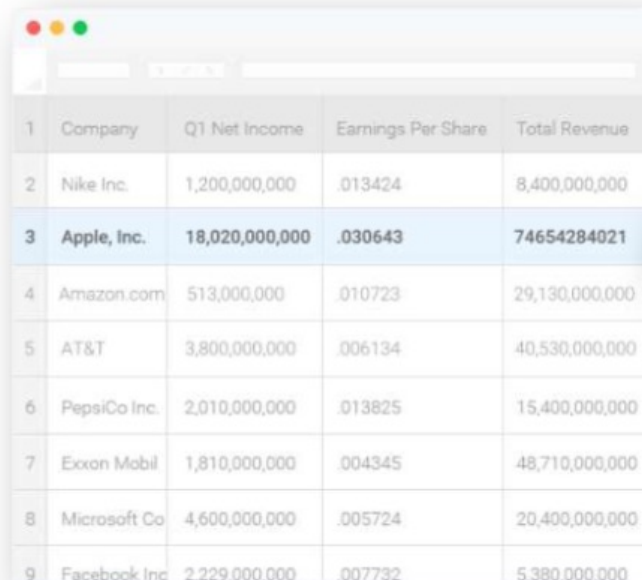
- Speech to text
- Text to speech

4. Vision

- Image recognition
- Computer Vision

5. Robotics

Natural Language Generation



1	Company	Q1 Net Income	Earnings Per Share	Total Revenue
2	Nike Inc.	1,200,000,000	.013424	8,400,000,000
3	Apple, Inc.	18,020,000,000	.030643	74654284021
4	Amazon.com	513,000,000	.010723	29,130,000,000
5	AT&T	3,800,000,000	.006134	40,530,000,000
6	PepsiCo Inc.	2,010,000,000	.013825	15,400,000,000
7	Exxon Mobil	1,810,000,000	.004345	48,710,000,000
8	Microsoft Co.	4,600,000,000	.005724	20,400,000,000
9	Facebook Inc.	2,229,000,000	.007732	5,380,000,000



www.ap.org

Apple tops Wall Street 1Q forecasts

CUPERTINO, Calif. (AP) - Apple, Inc. (AAPL) on Tuesday reported fiscal first-quarter net income of \$18.02 billion. The Cupertino, California-based company said it had profits of \$3.06 per share. The results surpassed Wall Street expectations.



The average estimate of analysts surveyed by Zacks Investment Research was for earnings of \$2.60 per share. The maker of iPhones, iPads and other products posted revenue of \$74.6 billion in the period, also exceeding Street forecasts. Analysts expected \$67.38 billion, according to Zacks. For the current quarter ending in March, Apple said it expects revenue in the range of \$52 billion to \$55 billion. Analysts surveyed by

- 10x increase of content produced in business news.
- Free up journalists time to do more multi-format journalism

Source: Automated Insights/ AP

Natural Language Generation

Quakebot from the Los Angeles Times creates an earthquake report within seconds of the event:

“A ____ magnitude earthquake occurred ____ mi ____ of _____, ____.”



LA QuakeBot
@earthquakesLA



A 1.5 magnitude earthquake occurred 6.21mi S of Acton, CA. Details: eqbot.com/KPU Map: eqbot.com/KP5

1:48 AM - May 8, 2018 · California, USA



34°22'36.6"N 118°12'07.8"W

google.com

Knowledge Extraction from News Articles



Source: IBM Watson

Pattern Recognition

Quartz is using AI to analyze Trump's tweets for similarities and contradictions

 **Donald J. Trump** @realDonaldTrump

2 million more people just dropped out of ObamaCare. It is in a death spiral. Obstructionist Democrats gave up, have no answer = resist!

 Twitter | June 13th at 9:56 AM

 **Donald J. Trump** @realDonaldTrump

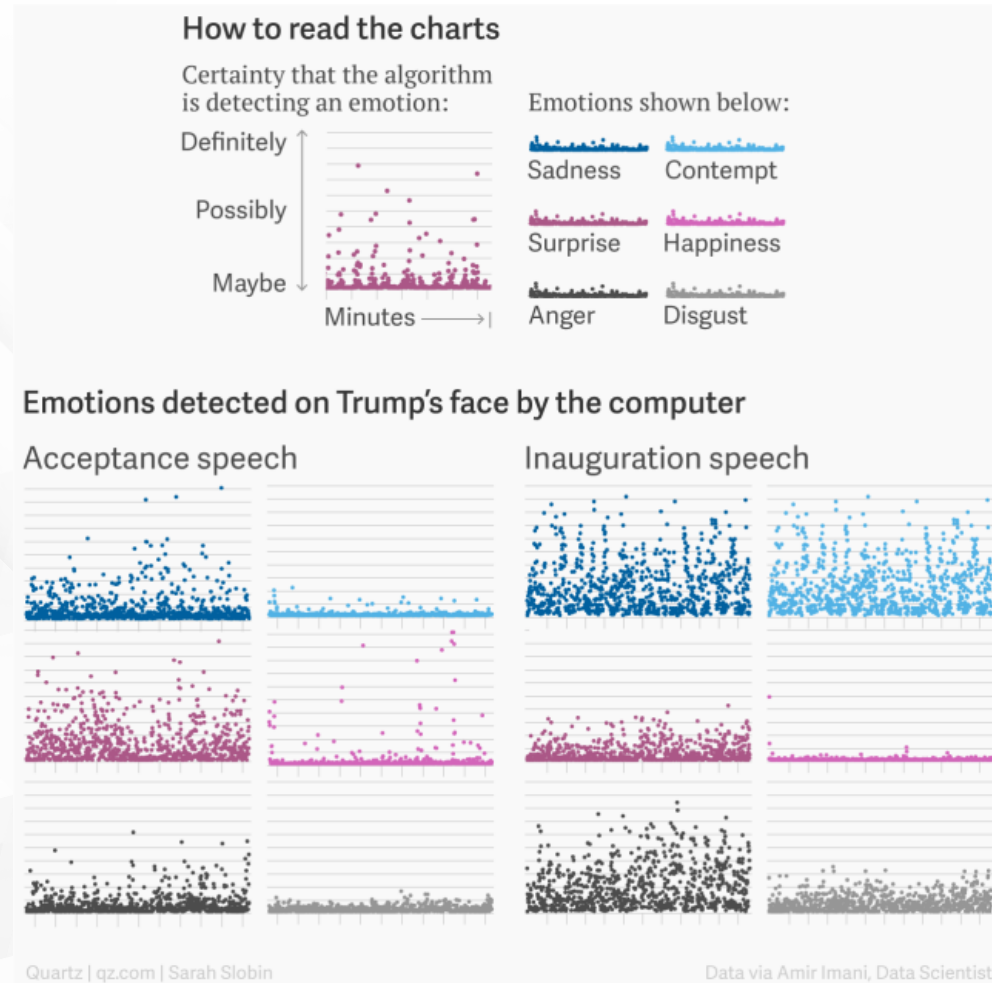
7 million Americans are going to lose their jobs due to ObamaCare. 46 million face 300% premium increases. DEFUND! #MakeDCListen

 Twitter | Sept 26th, 2013 at 4:10 PM

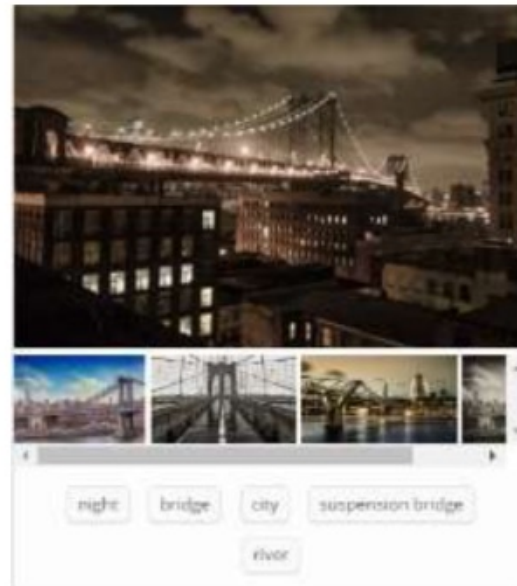
Source: Quartz

Emotional Analysis

Quartz used AI to analyze Trump's facial expressions during acceptance and inaugural speeches.



Content Recognition, Tagging, Similar Concepts



Source: ClarifAI

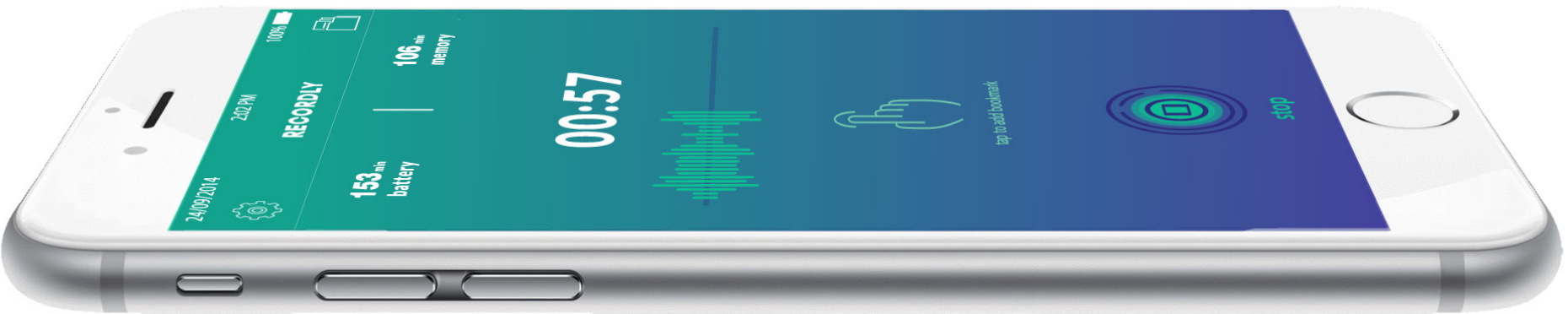
Optimized Content Discovery

- Toutiao is a Chinese aggregation app that works with thousands of publications to select stories for individual readers based on AI analysis of user activity.



Speech to Text

Recordly captures audio and creates instant transcriptions



Text to Video

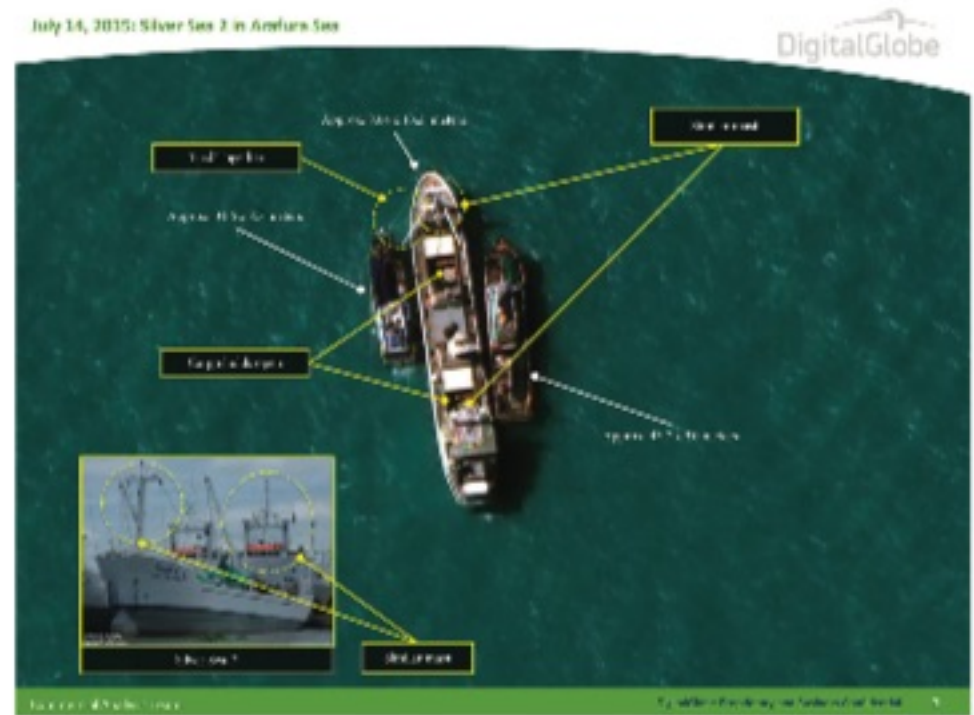
Wibbitz creates a video from an article or blog post in less than five minutes



A Popular Science blog post was converted into a video using Wibbitz.

Computer Vision

Computer vision can help editors quickly classify and organize a vast corpus of images and video, speed the editing process and enable journalists to source evidence for investigative pieces.



Rewards of AI in Journalism

AI can enable journalists to:

- Identify trends, insights and actionable insights from multiple source
- See things the naked eye cannot
- Turn data and spoken word into text
- Turn text into audio and video
- Understand sentiment
- Analyze scenes for objects, faces, text, colors, etc.
- Save time and money, keep pace with growing scale and scope of news cycle

POLITICIANS

The Power Players

Panama Papers The Power Players ⓘ

EN ▼

Country leaders

Politicians/public officials

Filters Region ▼ Country ▼

Hidden in 11.5 million secret files:

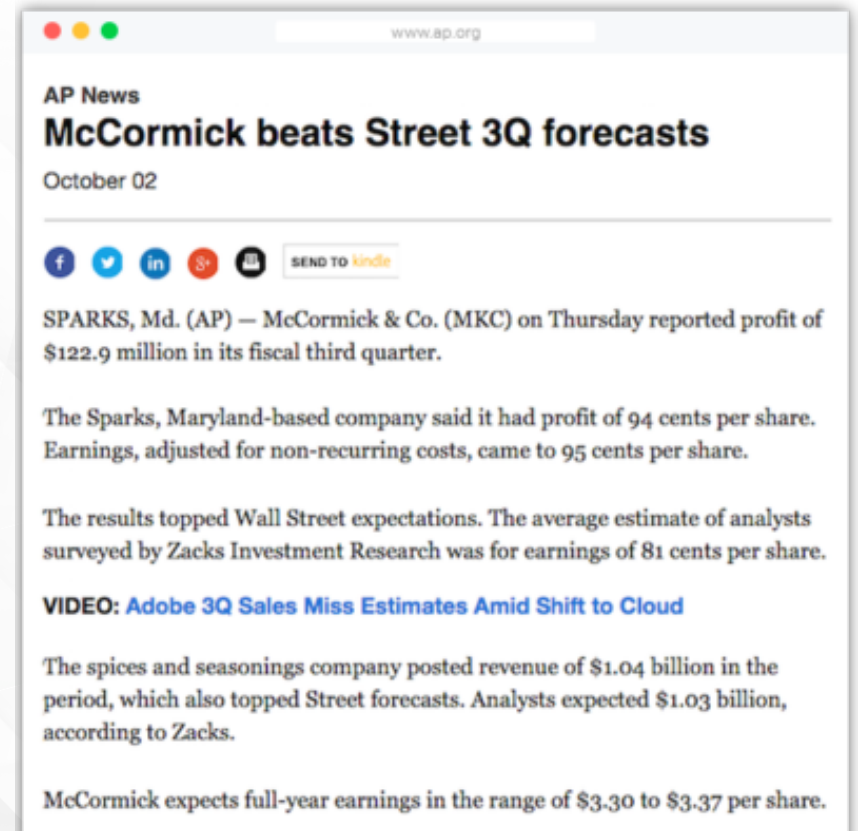
**_140 politicians from more than 50 countries;
_connected to offshore companies in 21 tax havens;
_heads of state, their associates, ministers, elected officials.**

Explore dozens of stories in this interactive
to see **who did what, and how**

Automated Article Generation

The Associated Press uses Wordsmith to transform raw earnings data into thousands of publishable stories, covering hundreds more quarterly earnings stories than previous manual efforts.

- 4,400 quarterly recaps produced
- 12X increase over manual efforts



Risk of AI in Journalism

- Unchecked algorithmic news generation
- Potential for workflow disruption
- Skill set gap
- Algorithms are prone to human bias
- Bad data = bad story

THANK YOU!



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K A L E I D O
I N S I G H T S

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