



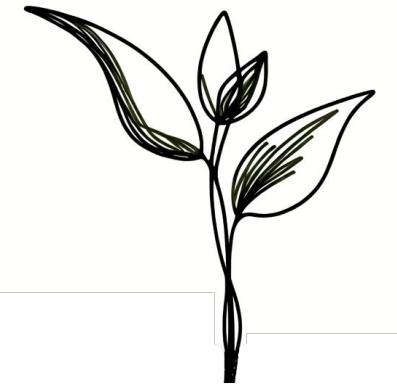
Applied Generative-AI for Digital Transformation

AI Enabled Economy

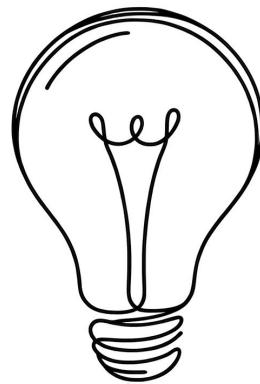
Abel Sanchez, John R. Williams

MIT Campus Course | Cambridge, MA

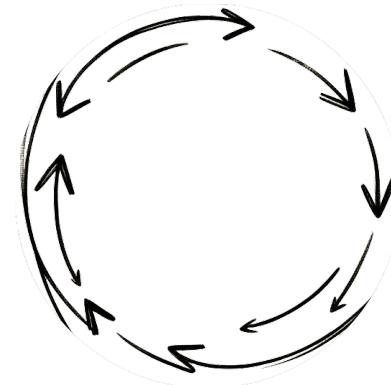
What is it?



Create

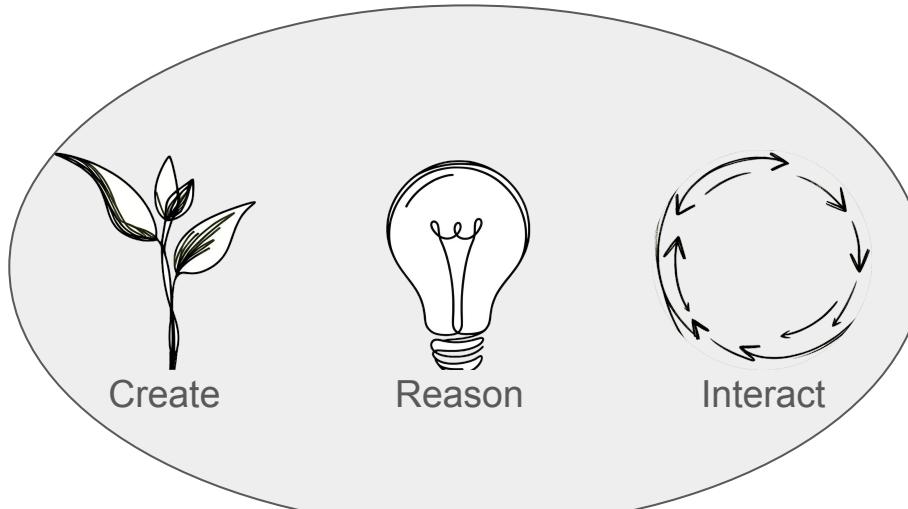


Reason



Interact

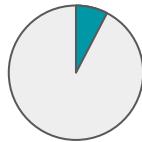
Why do we care?



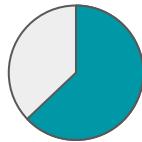
*Opportunity to
replace services
with software*



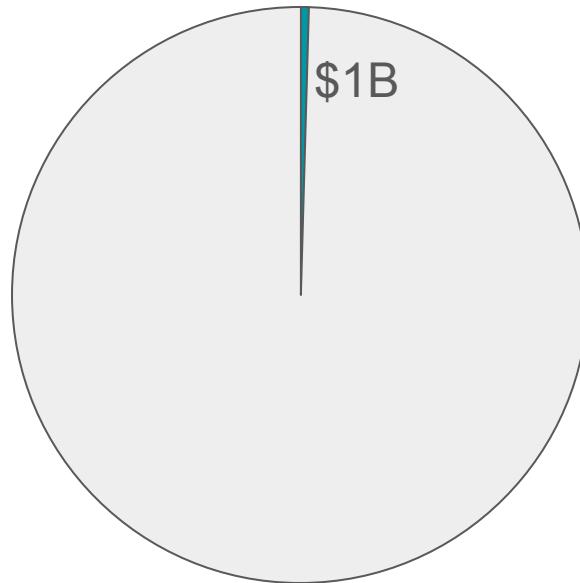
Marketplace



In 2010
\$350B all software
\$6B cloud

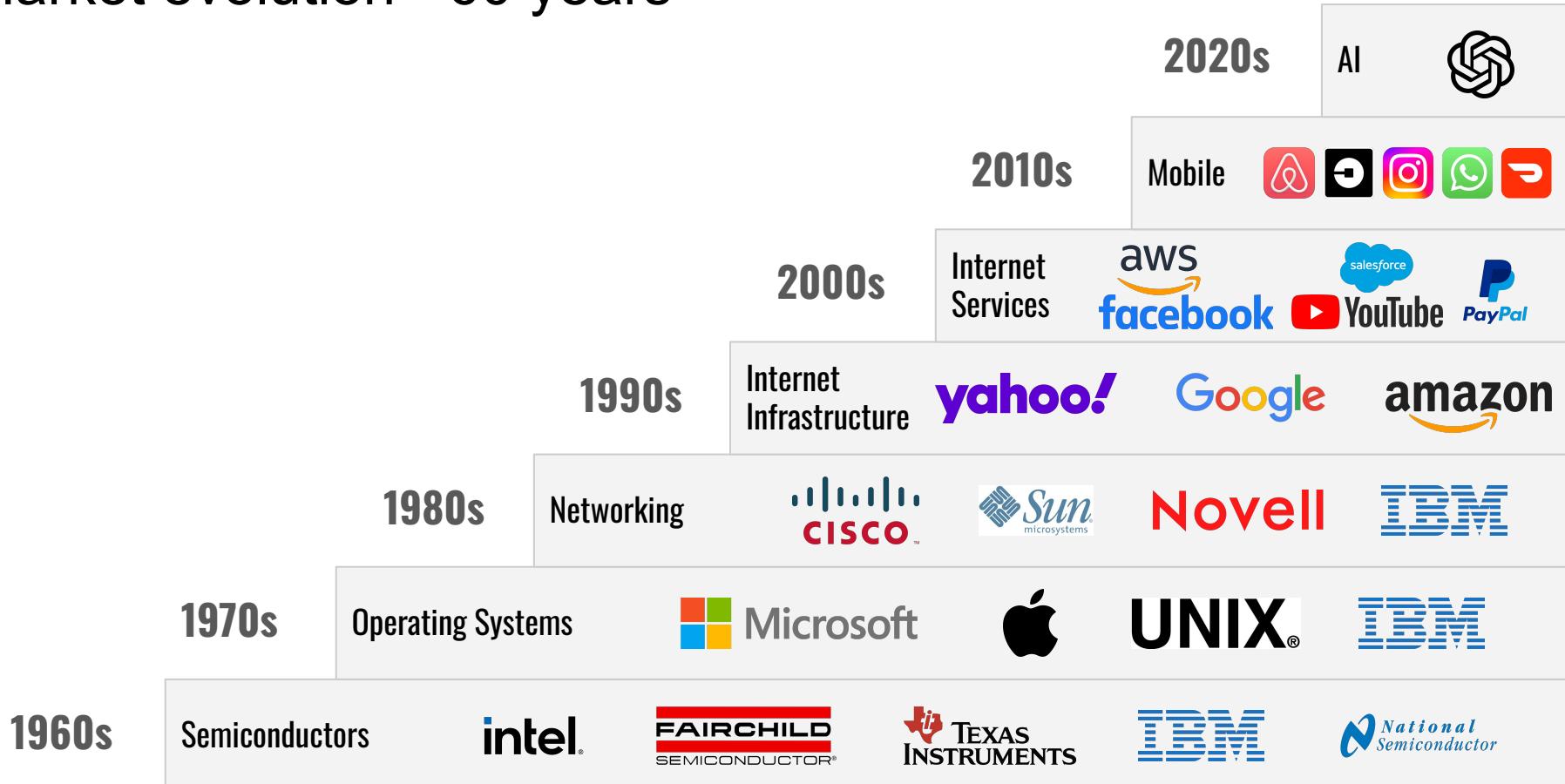


Present
\$650B all software
\$400B cloud
Over 40% growth/yr



\$15,000B Services

Market evolution - 60 years



What is missing?

	Cloud	Mobile	AI
Apps	       	                      	
Developer	   		
Data	   		
Security	  		
Infrastructure	  		   

AI Everywhere

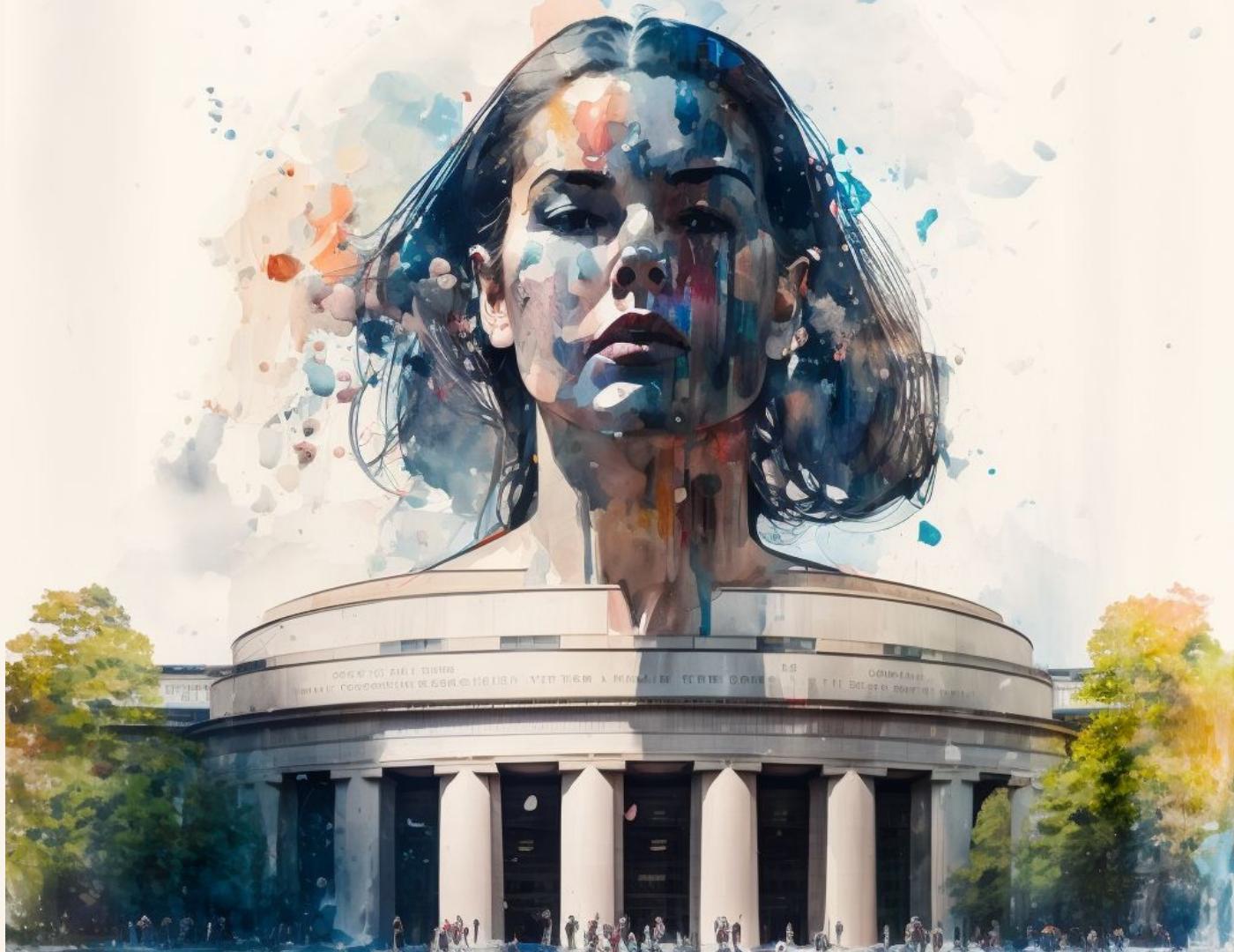
State of the Practice

How enterprises are building and buying Gen-AI

- Generative AI budgets skyrocketing
- Leaders reallocating AI investments to recurring software budget lines (IT).
- ROI is still an art and a science.
- Implementing and scaling generative AI requires the right technical talent, which currently isn't in-house for many enterprises.
- A multi-model future
- Open source is booming.
- While cost factored into open source appeal, it ranked below control and customization as key selection criteria.
- Desire for control stems from sensitive use cases and enterprise data security concerns.
- Leaders generally customize models through fine-tuning instead of building models from scratch.
- Cloud is still highly influential in model purchasing decisions.
- Customers still care about early-to-market features.
- That said, most enterprises think model performance is converging.
- Optimizing for optionality.
- Enterprises are building, not buying, apps—for now.
- Enterprises are excited about internal use cases but remain more cautious about external ones (apps).
- Enterprise spend projected at \$5B in 2024

Klarna AI assistant handles two-thirds of customer service chats

- 2.3 million conversations, **two-thirds of Klarna's customer service chats**
- It is doing the equivalent work of **700 full-time agents**
- It is on par with human agents in regard to customer satisfaction score
- It is more accurate, leading to a **25% drop in repeat inquiries**
- Customers resolve errands in less than **2 mins compared to 11 mins** previously
- Available in **23 markets, 24/7** and communicates in more than 35 languages
- Estimated **\$40 million USD in profit improvement to Klarna in 2024**

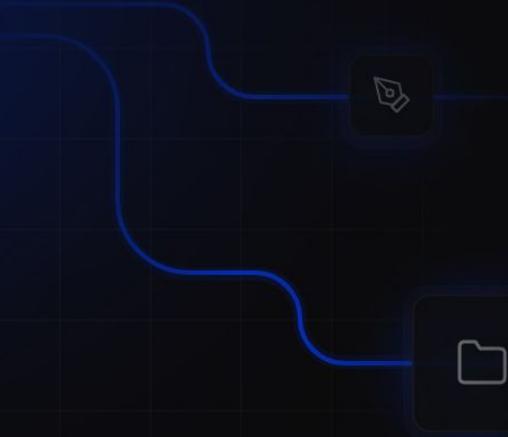


Cost Comparison - Human vs Gen-AI

- Graphic artist image
 - Gen-AI cost: ~\$.001, takes ~1 second
 - Human cost: \$100s min, takes hours or days
 - 100,000 times cheaper (assuming \$100)
 - 3,600 times faster
- Lawyer, summarize and answer questions on a complex legal brief
 - Gen-AI cost: ~\$.001, takes ~10 second
 - Human cost: \$100s min, takes hours or days
- Therapist
 - Gen-AI cost: ~\$.001, takes ~10 second
 - Human cost: \$100s, takes 1 hour
 - Availability: scalable and global

Harvey.

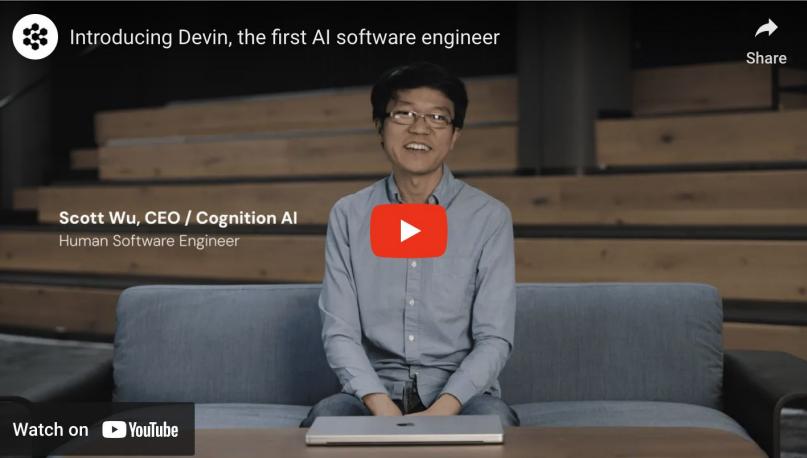
Unprecedented Legal AI



Introducing Devin, the first AI software engineer

 Cognition

About us Blog



Introducing Devin, the first AI software engineer

Scott Wu, CEO / Cognition AI
Human Software Engineer

Watch on  YouTube

Share

March 12th, 2024 | Written by Scott Wu

Introducing Devin, the first AI software engineer

And setting a new state of the art on the SWE-bench coding benchmark

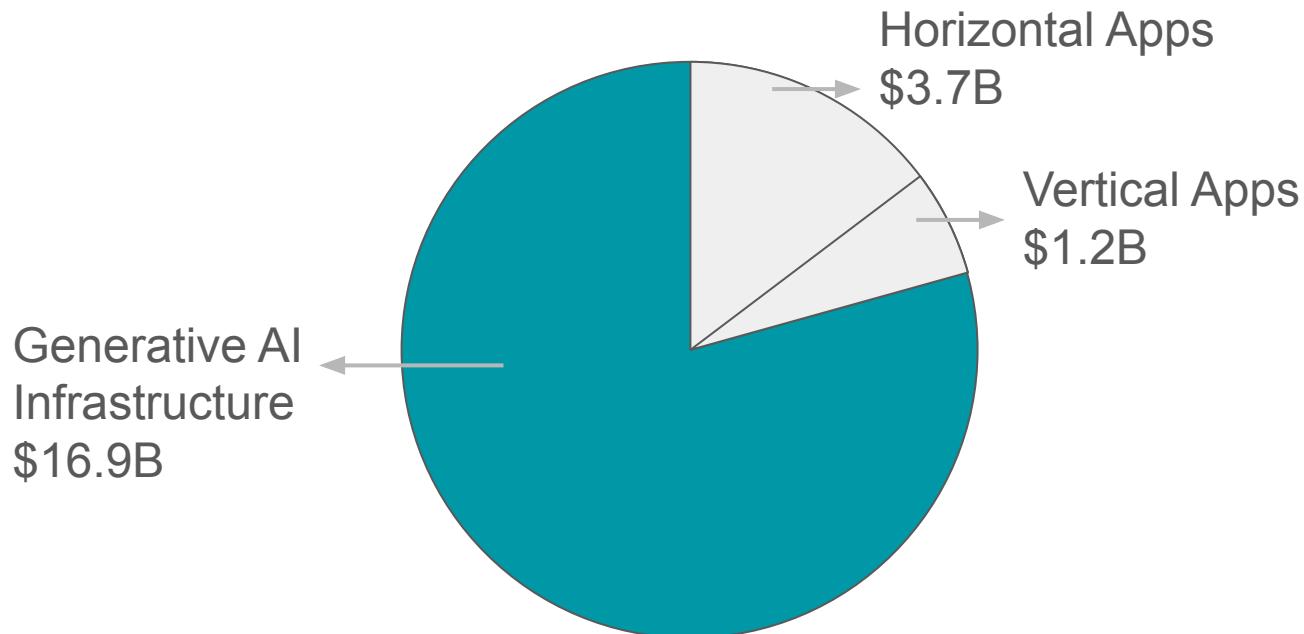
AI 10x faster than SaaS to \$3B USD



Caveats

Infrastructure getting more funding than applications - ROI?

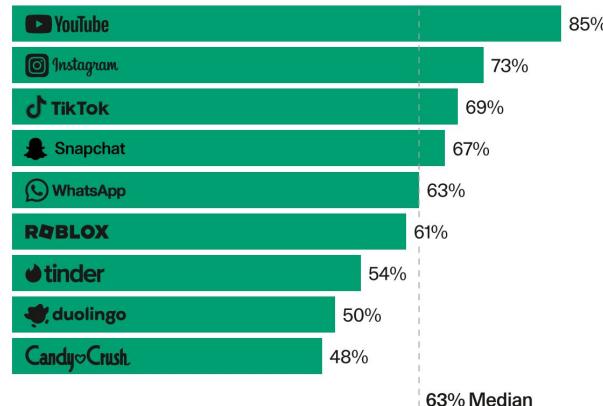
\$50B on
NVideo
GPUs in
2023



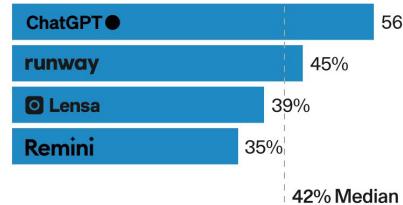
Retention - user disillusionment

One Month Retention

Incumbents



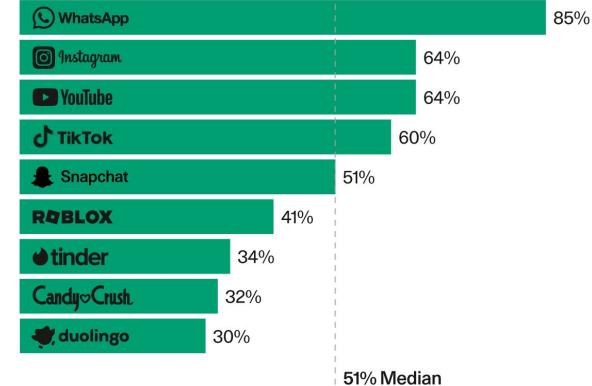
AI-First Companies



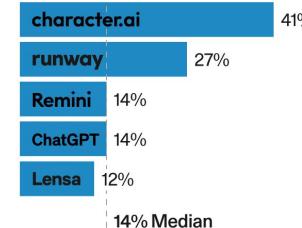
Data from mobile apps only.
Averaged over the past 12
months of cohorts in the US.

DAU/MAU

Incumbents



AI-First Companies



Data from mobile apps only.

Good news, lots of competition, capabilities increasing

	Claude 3 Opus	Claude 3 Sonnet	Claude 3 Haiku	GPT-4	GPT-3.5	Gemini 1.0 Ultra	Gemini 1.0 Pro
Undergraduate level knowledge <i>MMILU</i>	86.8% 5 shot	79.0% 5-shot	75.2% 5-shot	86.4% 5-shot	70.0% 5-shot	83.7% 5-shot	71.8% 5-shot
Graduate level reasoning <i>GPQA, Diamond</i>	50.4% 0-shot CoT	40.4% 0-shot CoT	33.3% 0-shot CoT	35.7% 0-shot CoT	28.1% 0-shot CoT	—	—
Grade school math <i>GSM8K</i>	95.0% 0-shot CoT	92.3% 0-shot CoT	88.9% 0-shot CoT	92.0% 5-shot CoT	57.1% 5-shot	94.4% Maj1@32	86.5% Maj1@32
Math problem-solving <i>MATH</i>	60.1% 0-shot CoT	43.1% 0-shot CoT	38.9% 0-shot CoT	52.9% 4-shot	34.1% 4-shot	53.2% 4-shot	32.6% 4-shot
Multilingual math <i>MGSM</i>	90.7% 0-shot	83.5% 0-shot	75.1% 0-shot	74.5% 8-shot	—	79.0% 8-shot	63.5% 8-shot
Code <i>HumanEval</i>	84.9% 0-shot	73.0% 0-shot	75.9% 0-shot	67.0% 0-shot	48.1% 0-shot	74.4% 0-shot	67.7% 0-shot
Reasoning over text <i>DROP, Fi score</i>	83.1 3-shot	78.9 3-shot	78.4 3-shot	80.9 3-shot	64.1 3-shot	82.4 Variable shots	74.1 Variable shots
Mixed evaluations <i>BIG-Bench-Hard</i>	86.8% 3-shot CoT	82.9% 3-shot CoT	73.7% 3-shot CoT	83.1% 3-shot CoT	66.6% 3-shot CoT	83.6% 3-shot CoT	75.0% 3-shot CoT
Knowledge Q&A <i>ARC-Challenge</i>	96.4% 25-shot	93.2% 25-shot	89.2% 25-shot	96.3% 25-shot	85.2% 25-shot	—	—
Common Knowledge <i>HellaSwag</i>	95.4% 10-shot	89.0% 10-shot	85.9% 10-shot	95.3% 10-shot	85.5% 10-shot	87.8% 10-shot	84.7% 10-shot

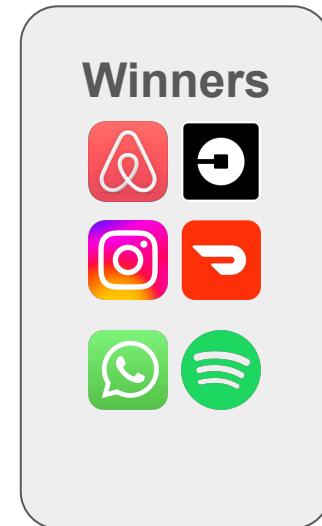
Success takes time - same with internet (e.g. Google)



2007



2008



First successes - they may pale in the future



Customer
Support



Interactive
AI browser
Chatbot



Enterprise
Knowledge

Predictions



Agentic Resoning

Prototyping
to production

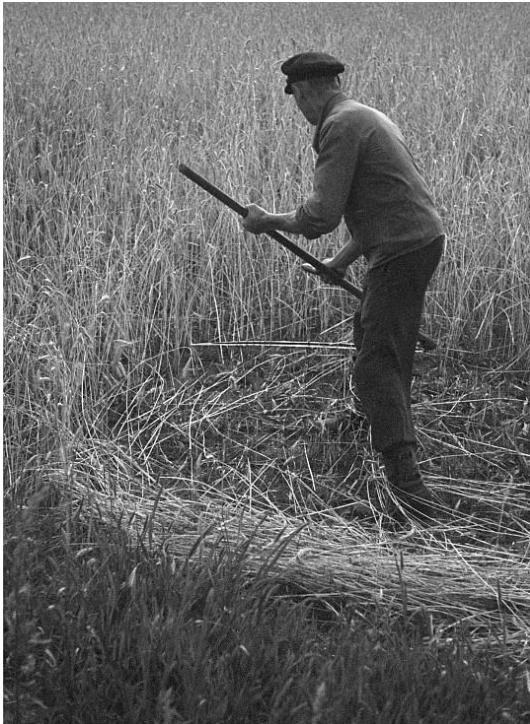
Reliability and
robustness

Predictions - human coordination to agents (AI) coordination. Agentic Reasoning.



Looking forward

Agriculture evolution



Human + Tool



Human + Machine



Data, AI, Network

Computation evolution



Human + Tool



Human + Machine



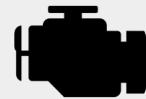
Data, AI, Network

AI Transformation



Tool

Human plus the tool



Machine

Human plus a collection of tools



Data, AI, Networks

Collection of tools plus data, plus networks (llms, cloud)

Price Reductions

Workers needed at S&P 500 companies to generate \$1 million in revenue:

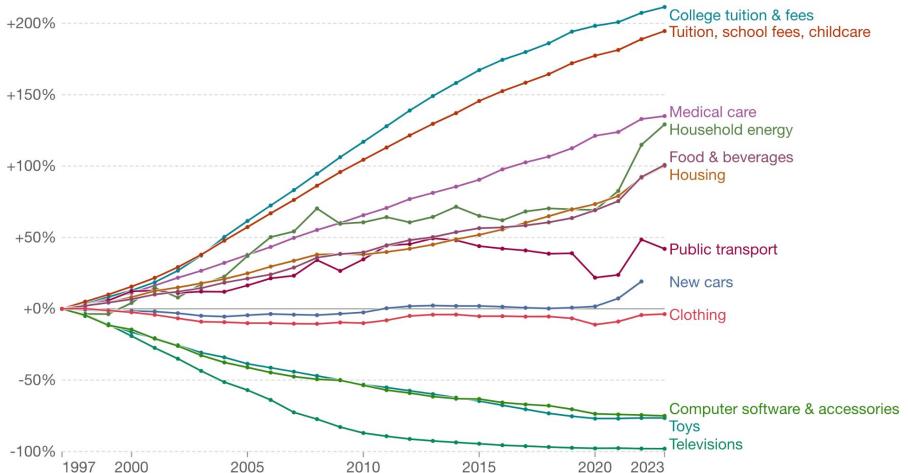


Chart: Bradley Saacks/Semafor • Source: Bank of America



Price changes in consumer goods and services in the United States

Price change in consumer goods and services in the United States, measured as the percentage change since 1997. Data is based on the consumer price index (CPI) for national average urban consumer prices.



Data source: United States Bureau of Labor Statistics (BLS)

Note: Some services – such as medical care – are not adjusted for quality. When adjusted for quality, some treatments have decreased in price rather than increased.

OurWorldInData.org/technological-change | CC BY

You can think of course production like film making



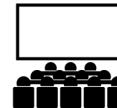
Write Script



Shoot Movie



Production



Operation & Distribution



Feedback

Design Course Content

Create course content

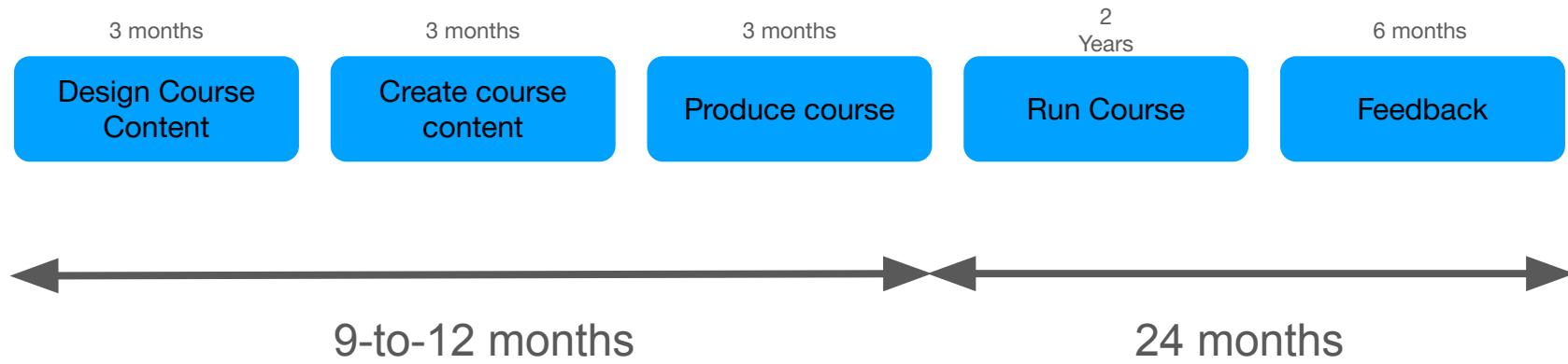
Produce course

Run Course

Feedback



Timeline



Content Create Content Produce

Counter Narcotics/
Crime Ops

Launch

Integration

Requirements

Validation

Coding

Marketing

Leads/Sales

Reuse

Quality

Operations Support Maintenance

AI Process Transformation

Amplify

Increase Process Productivity

Tool: chat bot

Reimagine

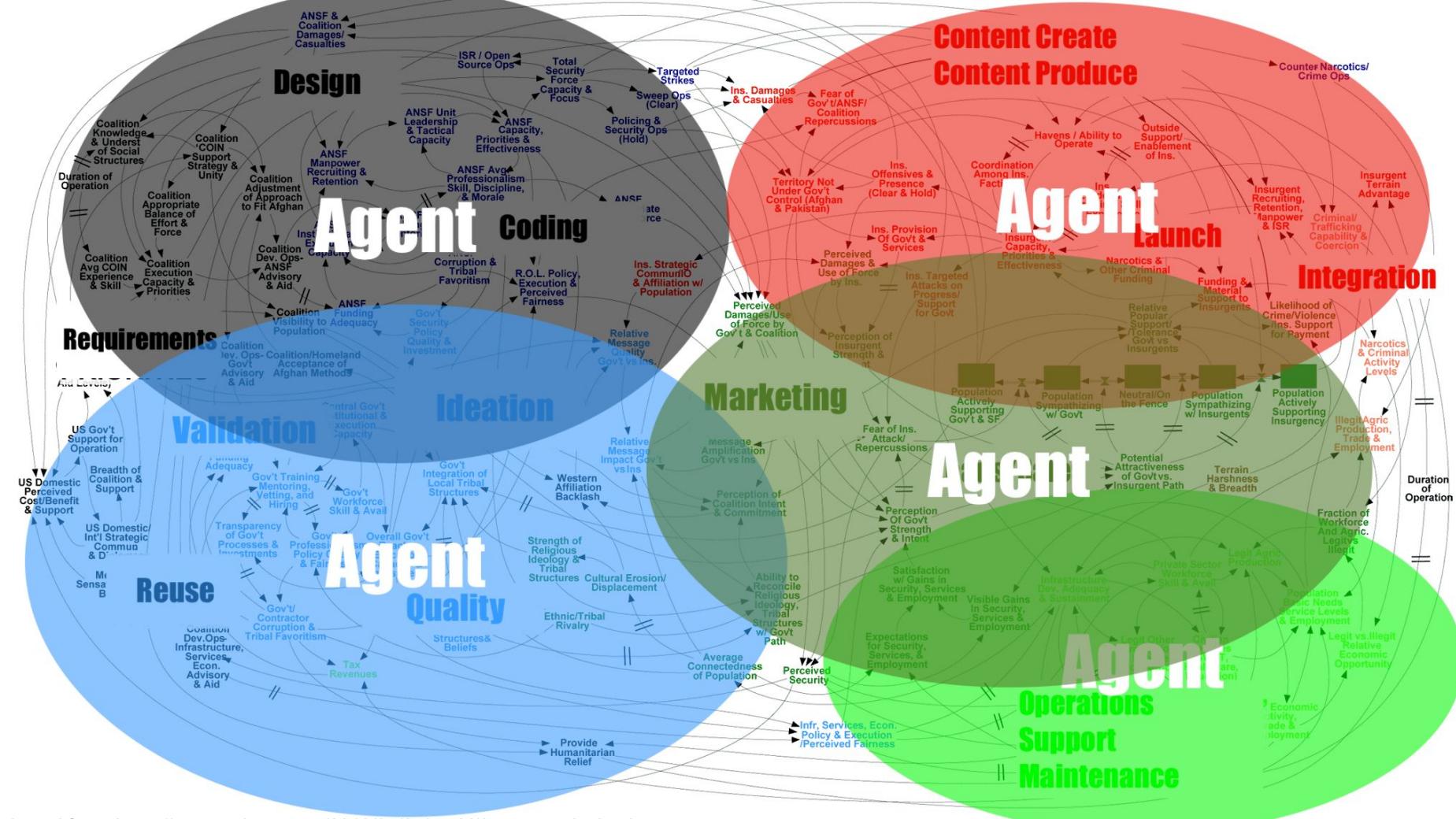
Transform Processes & Business Model

Machine: knowledge base, auto grading

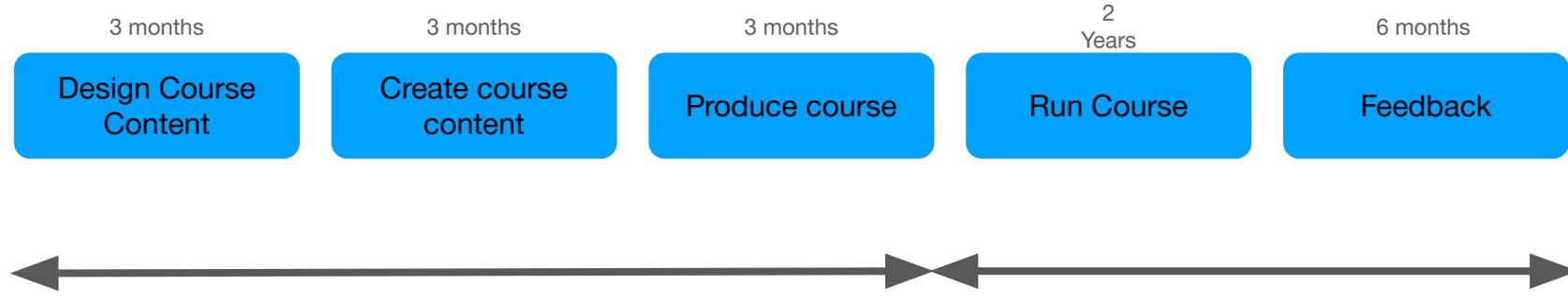
Autonomous

Business/Product Fully Automated with AI.

Fully autonomous



Timeline



- Automated market research
- Automated course design
- Automated course syllabus

- Automated lecture scripts
- Automated exercise creation
- Automated knowledge base
- Automated reference material
- Train avatars
- Give lectures, record

- Automated marketing
- Automated video promotion
- Automated course administration
- Automated course updates
- Automated content refresh

- Automated Operations
- Automated Delivery
- Automated Support
- Automated Q&A

Abel Corp?

The self-directed company



Enabling the one person company?



Enterprise Strategy I

When will AI be adopted by the enterprise?

- High data privacy concerns
- High IP retention concerns
- Argument: my data is special
- Parallels to cloud in 2010
- Education needed - understand the limitations
- Is cloud storage safe?
 - Nothing has had more high profile leaks than S3

Turf wars

- Data is power
- Classic debate of public cloud vs internal data center
- Stakeholders protecting turf
- Classic journey of data maturity
 - Multi-year internal build
 - Months in the public cloud
- The cloud has proven itself
 - Biggest IT spend globally

Generative-AI, and technology, can drive growth, enhance productivity and improve customer and employee experiences.

CIO → CEO

- 10 years ago the CIO reached out
- Today is the CEO
 - Discuss strategy
 - how can I reinvent what I do with tech
 - Discuss data
 - Mindset: maybe with Gen-AI and my data I can beat the competition
 - I want to do it myself
 - I do not want to give it to OpenAI, Anthropic, etc
 - I want to own the IP
 - I have lined out my office of my people saying they can do it

Can you do it yourself?

- Yes, but it's hard, you need elite talent, access to hardware, and lots of cash
- Requires lots of GPUs
- Vendors have already figured out how to do it at scale
 - OpenAI & Scale, Microsoft
 - Anthropic, Amazon & Google
 - AWS, GCP, Azure
 - Databricks, Mosaic

Strategy - Parallels to the internet

- Cisco \$224M in 1990 → by 2000 \$500B, bypassing Microsoft
- Today Microsoft \$2.7T → Cisco \$193B
- Hypercompetitive: foundational models, developer platform & tools
- Big opportunity: Apps on top of LLM platforms

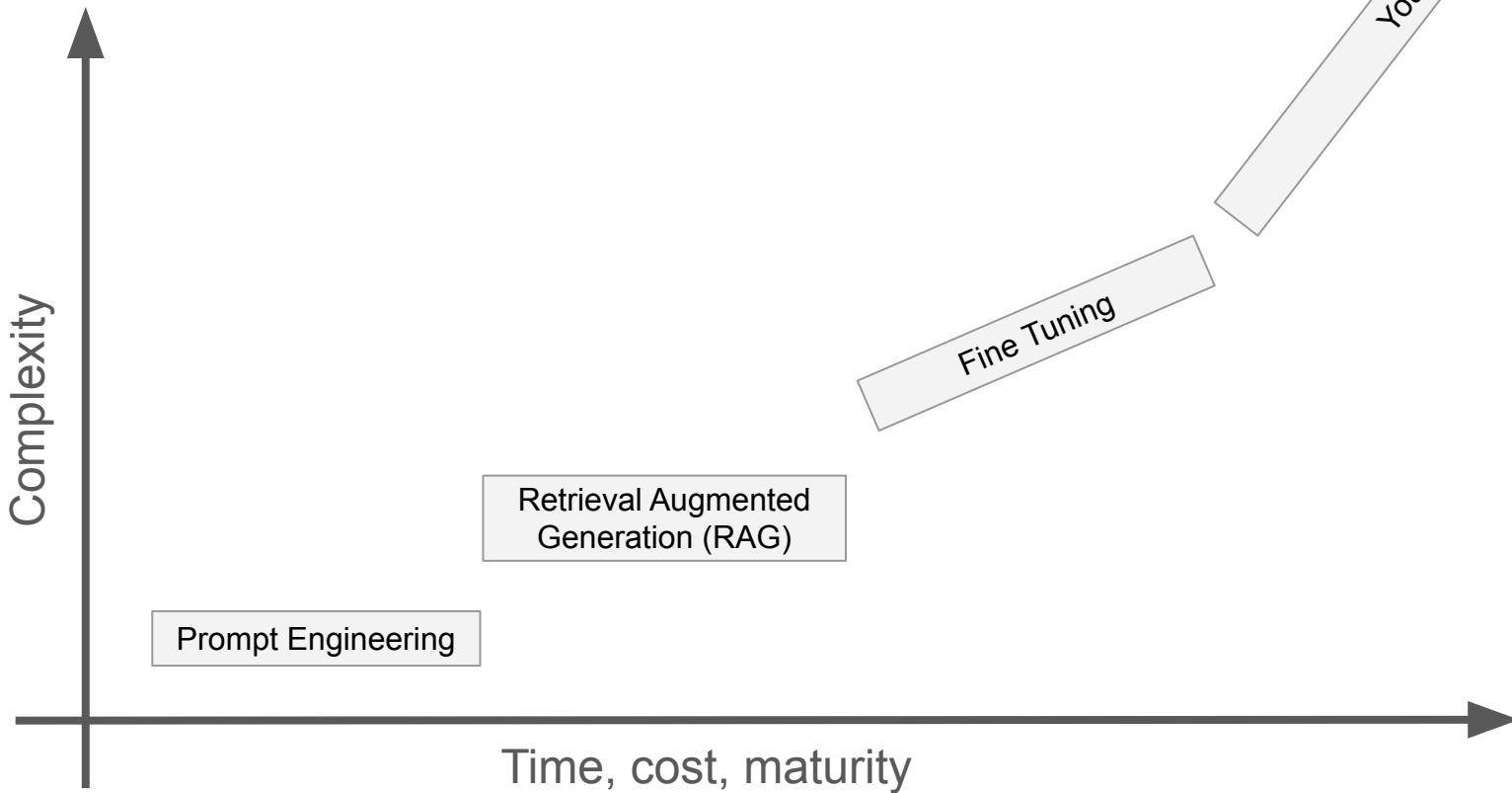
Apps

CONSUMER USES		ENTERPRISE STACK				INDUSTRY VERTICALS					
ENTERTAINMENT	character.ai MidJourney Pika	GENERAL PRODUCTIVITY	ChatGPT● DeepL glean tome	A DEPT Claude Notion WRITER	CREATIVE	DEFENSE	HEALTH & BIO	INDUSTRIAL	PROFESSIONAL SERVICES		
PRODUCTIVITY	ChatGPT● Claude DeepL perplexity Notion tome	LEARNING & DEVELOPMENT	Sana	synthesia	Rosebud AI	ANDURIL	VANNEVAR Labs	FIGURE	ABRIDGE	Cradle	Harvey. Hebbia
		CUSTOMER EXPERIENCE	CRESTA	SIERRA	PiKa	runway	Insitro		OWKIN	Waabi	
		DEVELOPER & DATA TEAMS	AssemblyAI kumo	codeium GitHub*	PiKa	IIElevenLabs					

Infrastructure

INFERENCE PROVIDERS				APP DEV FRAMEWORKS		MODEL HUBS		FOUNDATION MODEL PROVIDERS			
anyscale	databricks	Replicate	LangChain	Hugging Face	Replicate	ANTHROPIC	cohere	MISTRAL AI_	OpenAI		
together.ai	baseten										
STORE & COMPUTE				CLOUD DATA PROVIDERS				CLOUD SERVICE PROVIDERS			
LABEL / PROCESS DATA		databricks		Pinecone	Weaviate	MongoDB*		Google Cloud*	aws*	Azure*	cerebras
Cleanlab	scale	UNSTRUCTURED									NVIDIA*
				snowflake*							AMD* intel* (etc.)

Maturity evolution

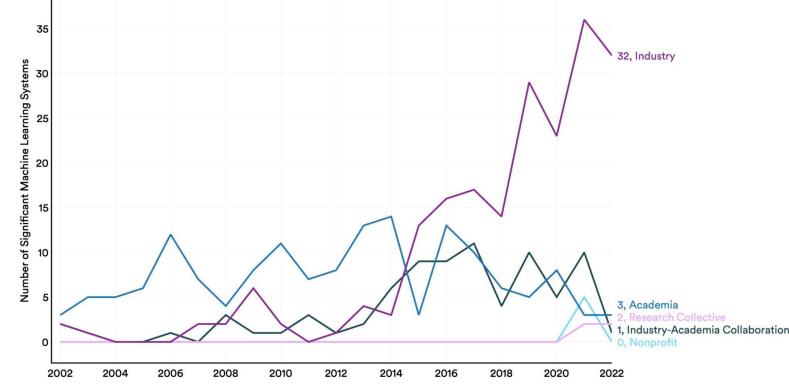


Enterprise Strategy II

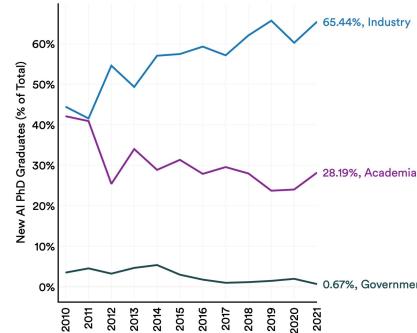
Why is university struggling?

- Funding: AI research is too expensive
- Too hard to get GPUs
- Talent drain, big money in industry
- Industry is innovating faster
- Talent seeks other talent
- The same is true for you!

Number of Significant Machine Learning Systems by Sector, 2002–22
Source: Epoch, 2022 | Chart: 2023 AI Index Report



Employment of New AI PhDs (% of Total) in North America by Sector, 2010–21
Source: CRA Taulbee Survey, 2022 | Chart: 2023 AI Index Report



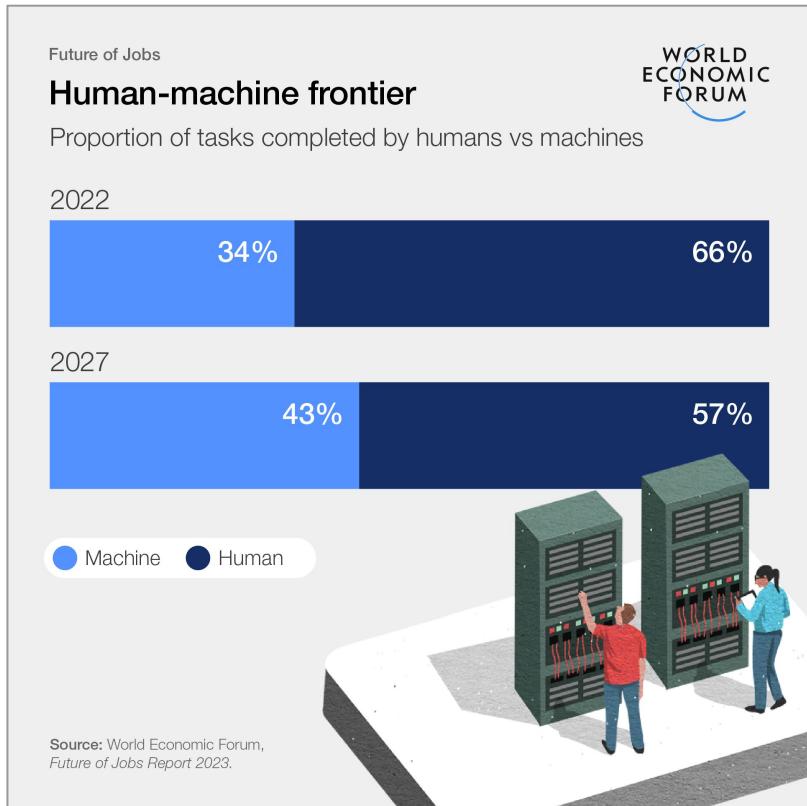
The AI-enabled economy

The key drivers of progress, discovery and strategic advantage in AI are access to **people**, **data**, **compute** and **finance** – all of which face huge global competition.

Millions need to be retrained for the AI-enabled economy

- Industry
- Education
- Government
- Defense
- Finance
- Healthcare
- Retail
- Transportation
- Infrastructure

Reskilling

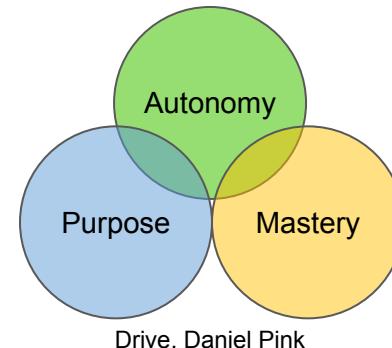


Inversation

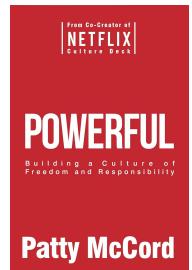


How to attract talent?

- You already have some
- Others are highly motivated to learn
- 10-to-1 stars - magnets
- Autonomy - get out of the way
- Career advancement without being a manager
- small teams - two pizza teams
- project to product - DevDataOps
- Salaries - MIT data



Drive, Daniel Pink



Developer marketing does not exist

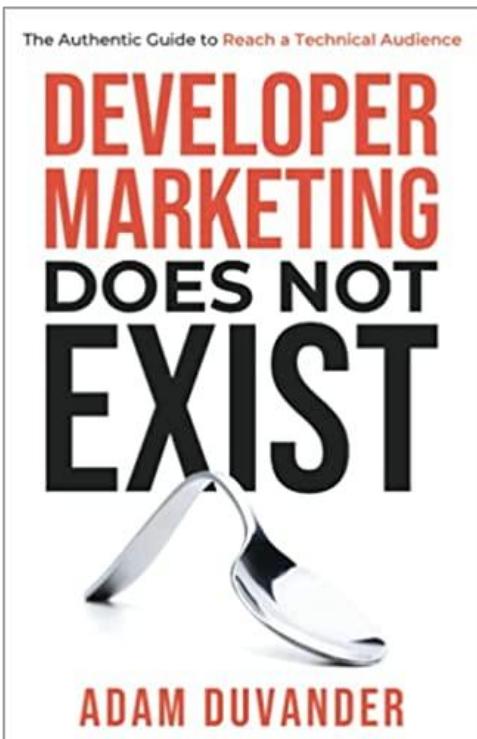


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Organizational Change

There is a lot to do

Gen-AI Digital Transformation: Amplify, Reimagine, Autonomous

Customer Experience Transformation

- Content Generation
- Predictive Personalization
- Interactive AI Solutions

Operational Process Transformation

- Intelligent Automation
- Advanced Analytics
- Enhanced Resource Management

Business Model Transformation

- AI-Driven Products/Services
- Dynamic Business Strategies
- Innovative Ecosystems

Cross-Cutting Factors

- Robust Ethical Frameworks
- Advanced AI Talent Development
- Scalable and Future-Proof Infrastructure
- Regulatory Foresight

KPIs

1. Innovation Rate
2. Automation Rate
3. Accuracy Improvement
4. Adoption Rate
5. Customer Satisfaction
6. Operational Efficiency
7. Innovation ROI
8. Data Utilization Effectiveness
9. Compliance and Security
10. Employee Skill Advancement



Maturity Models

1. Awareness and Education
2. Experimentation and Exploration
3. Integration and Adoption
4. Optimization and Expansion
5. Innovation and Leadership

Key Considerations:

- Ethics and governance
- Talent development
- Stakeholder engagement
- Infrastructure for scalability



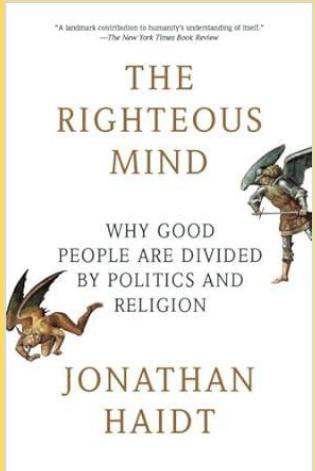
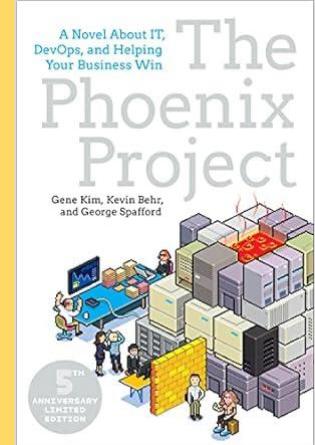
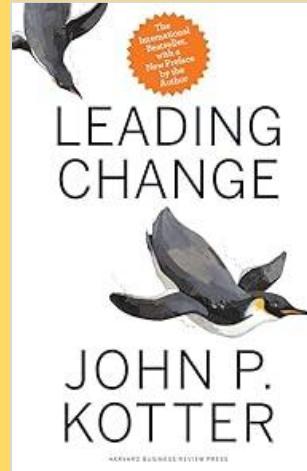
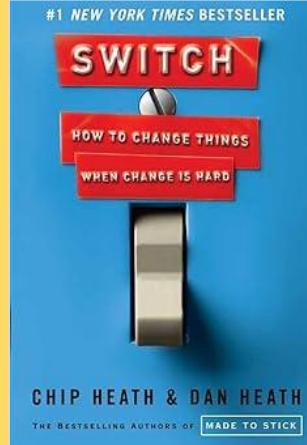
Ethics - AI policy

1. Stakeholder Engagement
2. Define Objectives and Scope
3. Ethical and Legal Considerations
4. Governance and Oversight
5. Risk Management
6. Development and Deployment
7. Training and Awareness
8. Monitoring and Evaluation



The Change Management

1. The elephant
2. The rider
3. The environment (situation)



Learn & Change

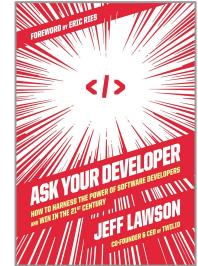
Transformation is hard

70% of transformation projects fail

80% of digital transformation fail

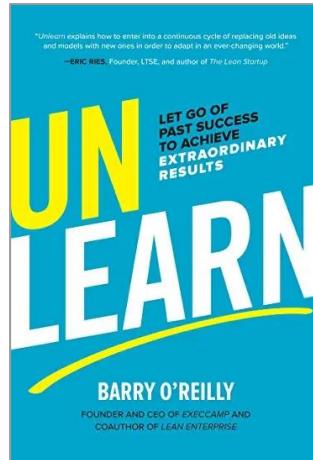
85% of big data projects fail

GE, \$10 billion failure

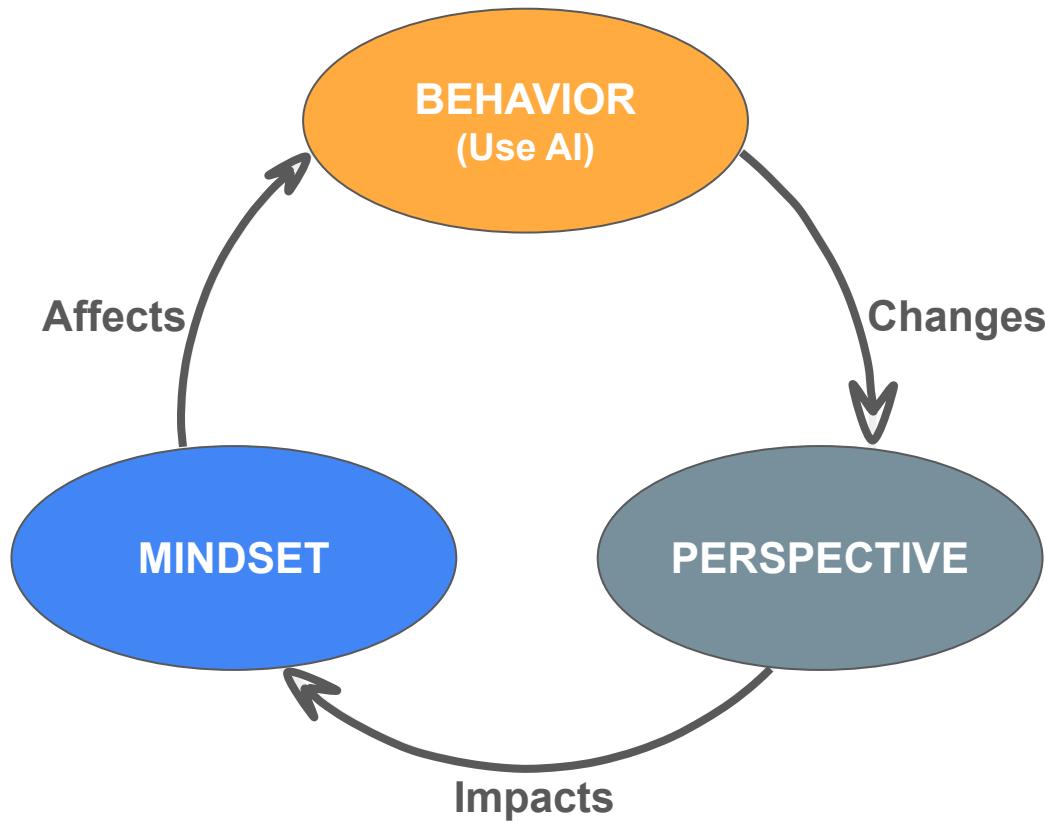


Disruption

Disruption does not actually apply to organizations. The truth is it applies to individuals.

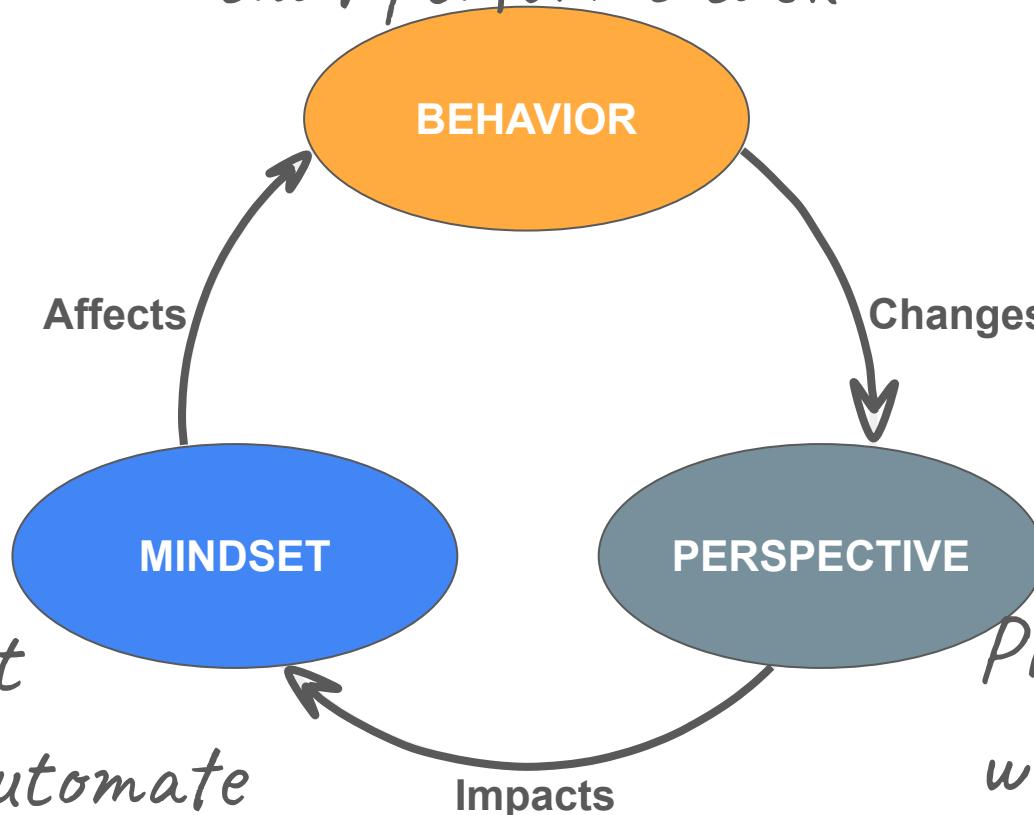


Transformation - live the life, get in the pool



*Write a prompt
that performs task*

Prompting

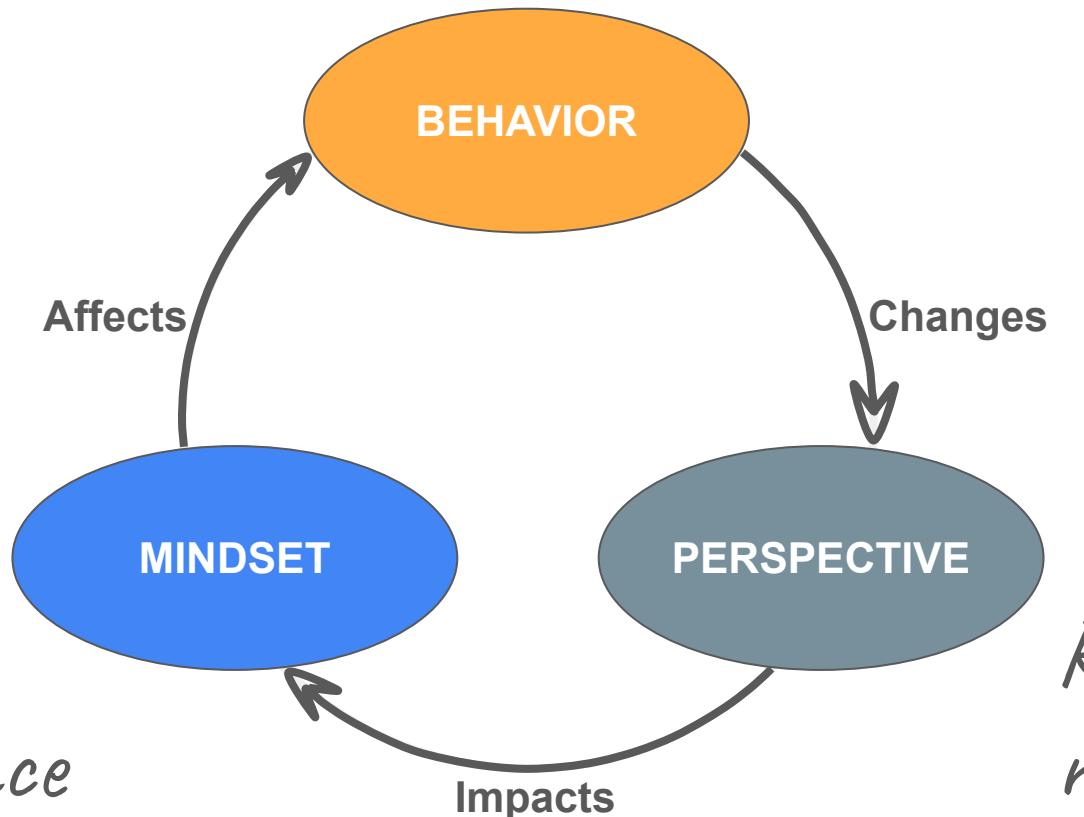


*Prompt that
plans and automate*

*Prompt that
writes prompts*

Prompting

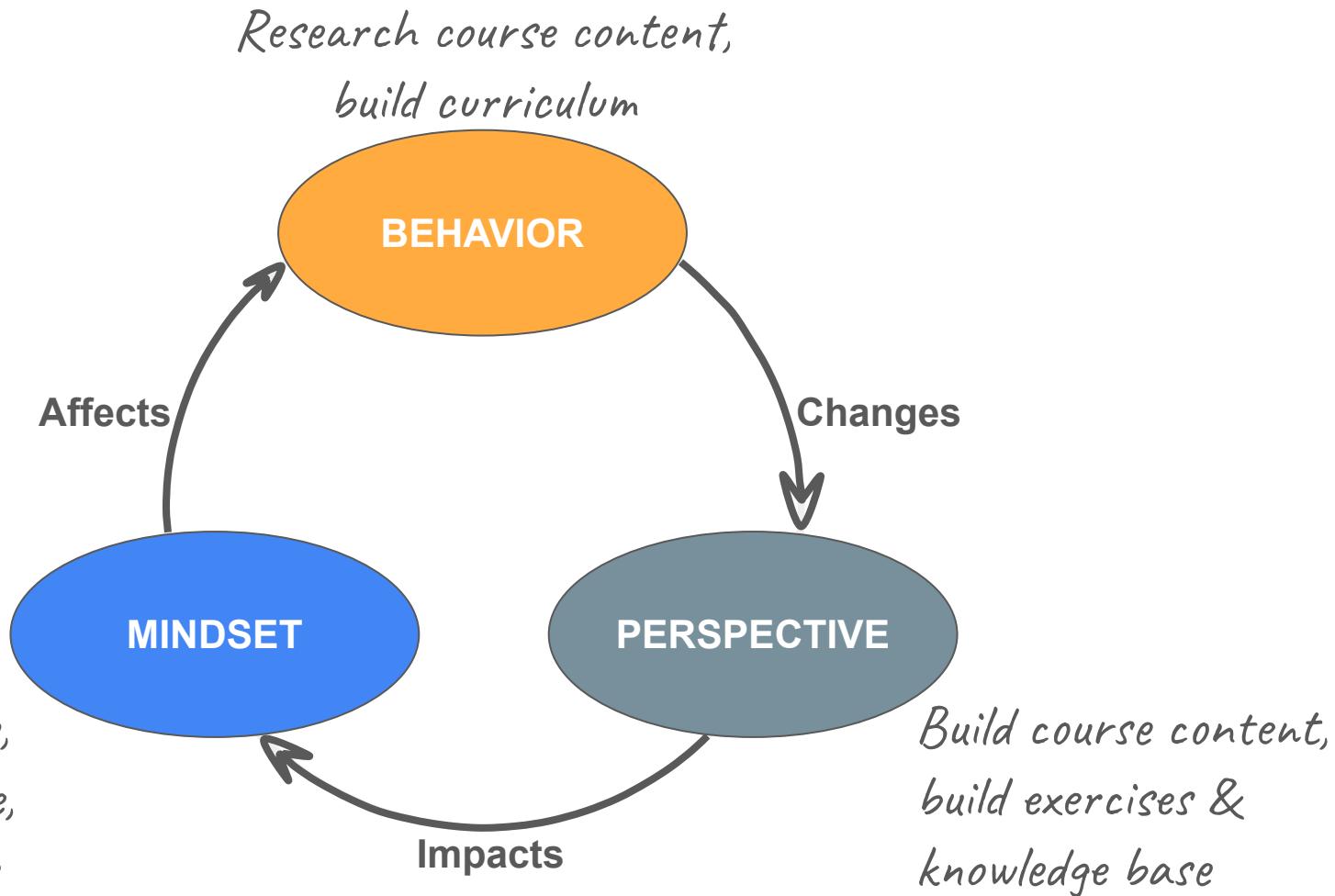
Negative/Positive



Extract
intelligence

Requires
response

Prompting



I hear and I forget.
I see and I remember.
I do and I understand.

Attributed to Xunzi

Invest an hour per week

- 10 minutes/day - 5 minute scan, 5 minute dive
- See recommended sources
- 30 minutes/week - new service, app, or device, you need to touch it
 - Use it, “Live the life”
- Get a Gen-AI buddy
- Make it fun!

A screenshot of the Feedly application interface. On the left, there's a sidebar with various feed categories like "All", "Tech News Overview", "vc", "press", and specific sources like "TechCrunch", "Wired - AI", "Andressen Horowitz", "Anecdote", "OpenAI", "Sequoia Capital", "Ars Technica", "NYT - AI", and "Slashdot". The main area shows news items from "Wired - AI" under the "TODAY" section. One article is visible: "How OpenAI's Bizarre Structure Gave 4 People the Power to Fire Sam Altman" by Paresh Dave / 1h. Below it, under "YESTERDAY", are other articles: "What Sam Altman's Firing Means for the Future of OpenAI" and "Sam Altman's Sudden Exit Sends Shockwaves Through OpenAI and Beyond".

Feedly

Sample Sources

<h2>Tech News Overview</h2> <ul style="list-style-type: none"> TechCrunch Wired - AI	<h2>press</h2> <ul style="list-style-type: none"> Ars Technica NYT - AI Slashdot Stories by Netflix Technology The GitHub Blog The Official Google AI Blog The Official Google Blog	<h2>data</h2> <ul style="list-style-type: none"> Brent Ozar Unlimited® Engineering Blog – Databricks KDnuggets Statistical Modeling, Causal Infer Towards Data Science Data Engineering Podcast Seattle Data Guy	<h2>crypto</h2> <ul style="list-style-type: none"> Bitcoin Magazine - Bitcoin News CoinDesk Ethereum Blog The Coinbase Blog <h2>languages</h2> <ul style="list-style-type: none"> JavaScript Weekly Planet Python Real Python RisingStack Engineering
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We need AI

The background image shows the interior of a grand library, likely the Trinity College Library in Dublin, Ireland. The room is vast with high ceilings, dark wood paneling, and floor-to-ceiling bookshelves. The shelves are filled with numerous books, and the overall atmosphere is one of historical significance and knowledge. A blue banner hangs from the ceiling on the left side.

Average Person



750 books/life



130 million exist



0.0000058

Digital Data Universe

175 zettabytes

1.4 billion x bigger

We need AI: Intrusion detection system events, millions/day

The screenshot shows a "Security Event Manager" interface with the following details:

Top Navigation: Security Event Manager, Events, Nodes, Rules, SEM CONSOLE, Settings, Help.

Section Header: Events - All Events, Showing all 2000 latest items, Export to CSV.

Left Sidebar (FILTERS):

- Overview:**
 - All Events: 3726
 - Subscriptions: 0
 - SEM Internal Events: 80
 - New Unmatched Connector Data: 0
 - Rule Activity: 32
- Security:**
 - Incidents: 17
 - Security Events: 16
 - Network Event Threats: 0
 - All Firewall Events: 27
 - All Threat Events: 60
 - Unusual Network Traffic: 8
 - Blocked Web Traffic: 0
 - Virus Attacks: 2
 - IDS Scan/Attack Activity: 2

Live Filter: NAME, EVENT INFO, DETECTION IP, DETECTION TIME. Show results from history, Live Mode (checked).

Event Log Table:

NAME	EVENT INFO	DETECTION IP	DETECTION TIME
WebTrafficAudit	URL Access By megatron.corp.trigeo.com	192.168.168.10	2019-06-20 15:24:01
MachineLogon	Network Logon "CORP\CTX\$"	WALLACE	2019-06-20 15:24:01
MachineLogoff	Logoff "CORP\CTX\$"	WALLACE	2019-06-20 15:24:01
PolicyScopeChange	Privilege assigned to "\CTX\$"	WALLACE	2019-06-20 15:24:01
ServiceWarning	duplex mismatch discovered on Fast	192.168.168.204	2019-06-20 15:23:59
ConfigurationTrafficAudit	DHCP: Renew from 192.168.168.48 ()	192.168.168.5	2019-06-20 15:23:55
SystemStatus	56 connections in use	192.168.167.1	2019-06-20 15:23:55
TCPTrafficAudit	Deny TCP (no connection)	192.168.167.1	2019-06-20 15:23:53
RegistryDelete	Registry Value Delete "\REGISTRY..."	10.110.250.54	2019-06-20 15:23:53
WebTrafficAudit	Secure URL Access By scotty.corp.trigeo...	192.168.168.10	2019-06-20 15:23:47
RegistryRead	Registry Value Read "\REGISTRY..."	10.110.250.54	2019-06-20 15:23:46
RegistryRead	Registry Key Read "\REGISTRY..."	10.110.250.54	2019-06-20 15:23:45

32,000 deaths/year, leading cause of death, ages 4-to-35



Potential for
80% reduction

UPS - best route

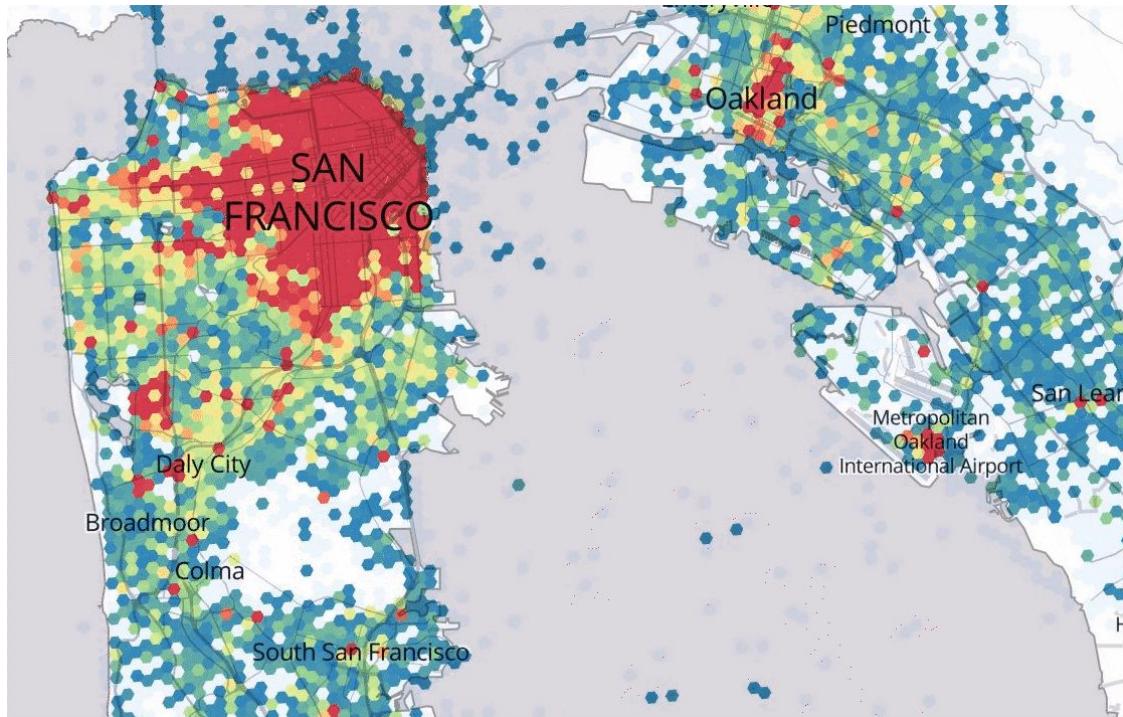
Each UPS driver makes an average of 120 stops per day. There are:

alternatives for ordering those stops. Which option is the most efficient, after considering variables such as special delivery times, road regulations, and the existence of private roads that don't appear on a map?

Even if an optimal answer exists, the human mind will never figure it out.

UPS best route, 120 stops, $7e^198$

Uber - 1 million predictions per second

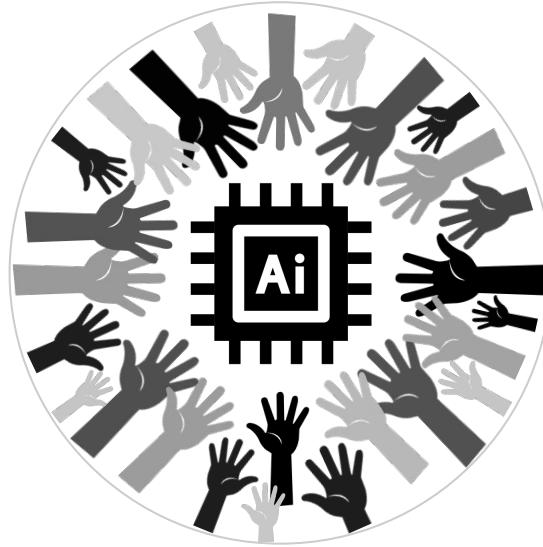


Marketplace forecasting in California's Bay Area allows us to direct drivers to high-demand areas

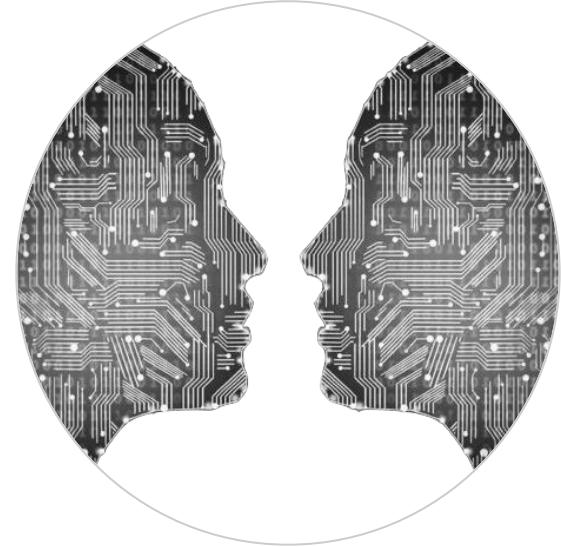
Democratized access - A new opportunity



Data



AI



Human
Simulation

END