

Artificial intelligence platforms: A new research agenda for digital platform economy

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Defining AI

“Artificial Intelligence . . . is intended to make computers do things, that when done by people, are described as having indicated intelligence”

Brooks, R. A. (1991). *Intelligence without reason.*

AI everywhere?



☰ Google Translate

🗨️ Text

📄 Documents

DETECT LANGUAGE

ENGLISH

SPANISH

FRENCH



ENGLISH

SPANISH

ARABIC



|

Translation



0 / 5000



Customers Who Bought This Item Also Bought



Galaxy S6 Case, Spigen [METALLIZED BUTTONS] Neo Hybrid Series Case for Samsung Galaxy S6
★★★★★ 553
\$18.99 ✓Prime



Spigen Galaxy S6 Case, Spigen [AIR CUSHION] Slim Armor Case [KICK-STAND] for Samsung
★★★★★ 206
\$16.77 ✓Prime



Samsung Wireless Charging Pad w/ 2A Wall Charger - Retail Packaging - Black Sapphire, Part #
★★★★☆ 569
\$29.45 ✓Prime



Galaxy S6 Case, MoKo [Heavy Duty] Full Body Rugged Holster Cover Case with Swivel Belt Clip -
★★★★★ 87
\$6.99 ✓Prime

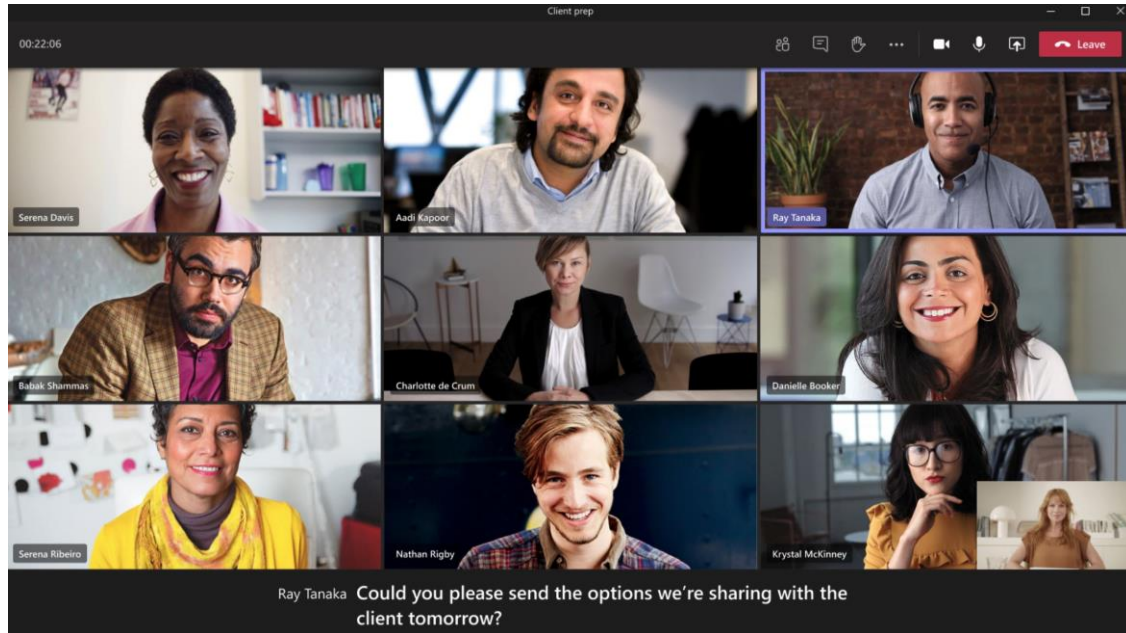
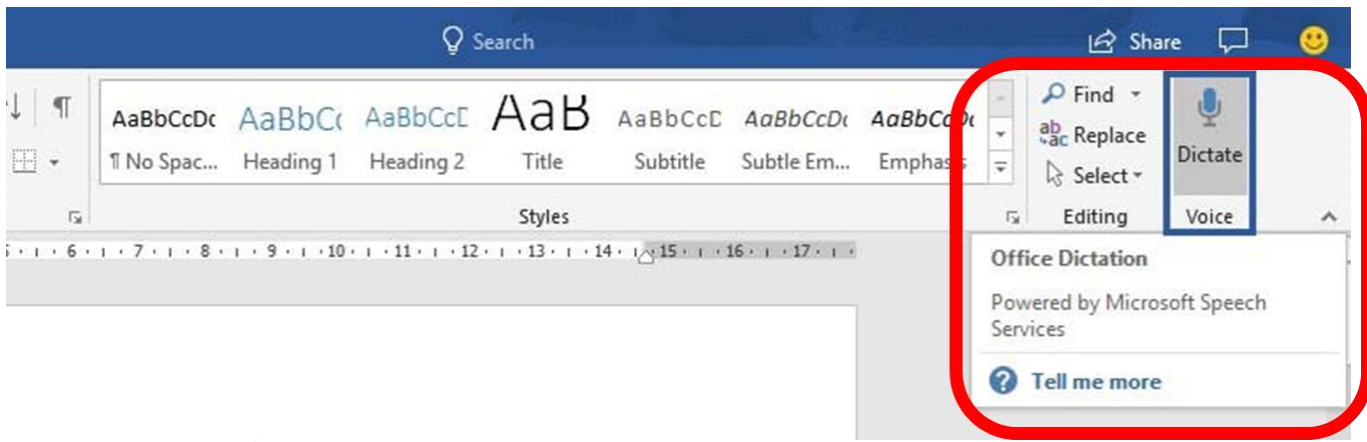


OtterBox DEFENDER SERIES for Samsung Galaxy S6 - Frustration-Free Packaging - Black
★★★★★ 358
\$49.95 ✓Prime



OtterBox COMMUTER SERIES for Samsung Galaxy S6 - Retail Packaging - Black
★★★★★ 271
\$25.33 ✓Prime





What about others?



storaenso

TOP data science
A MORPHO COMPANY



Fimlab

inscripta }





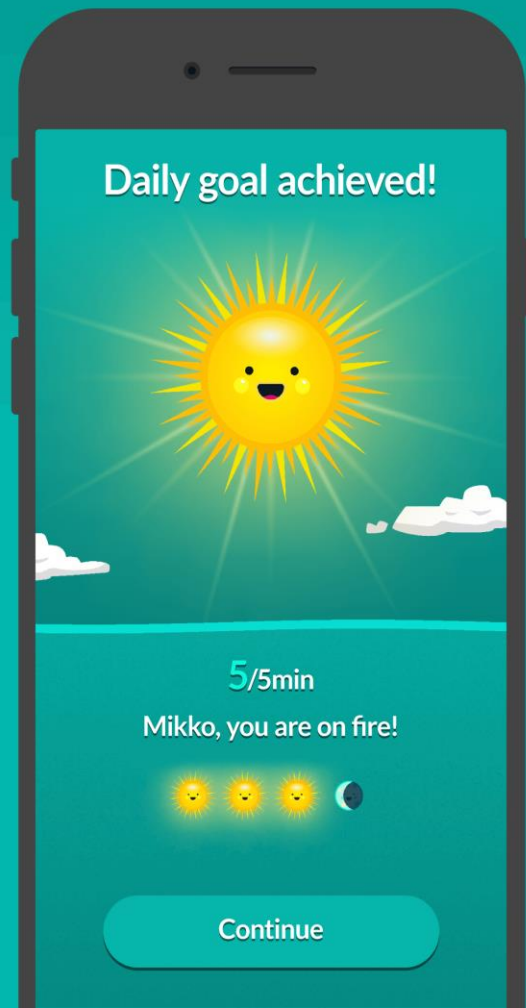
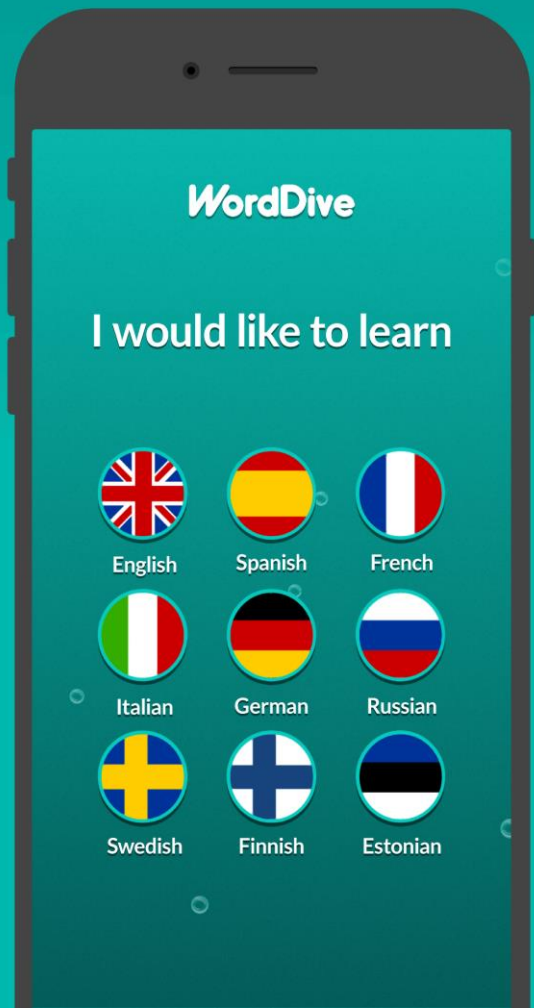
FOURKIND



Learn a new language

Award-winning method for language learning

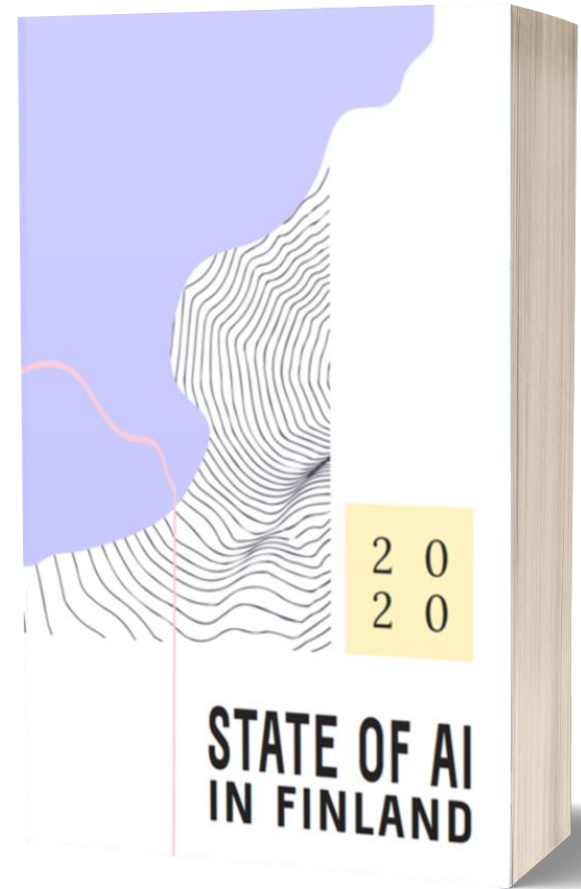
Personally optimized learning - Start now!



**These were just
some examples**

More insights:

<https://faia.fi/state-of-ai-in-finland/>



**What do executives say
about AI use cases?**



Investor Day
17 June 2016

Investor Day
17 June 2016

Image Source Credit: Orkla / image modified / CC BY 2.0

Background data

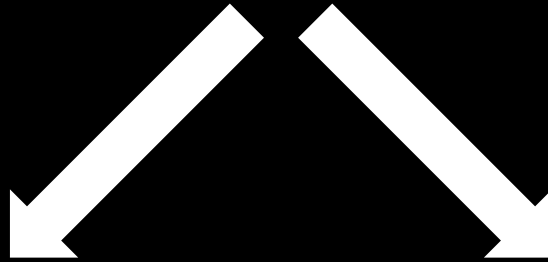
- **Qualitative analysis**
 - Inductive analysis of publicly available content
- **Data**
 - January 2004 – May 2019
 - Transcripts of S&P500 company investor presentations and earnings calls where “AI” or “machine learning” are mentioned

Total transcript count	2 062
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Count per company	
Median	1
Mean	4
Min	0
Max	91

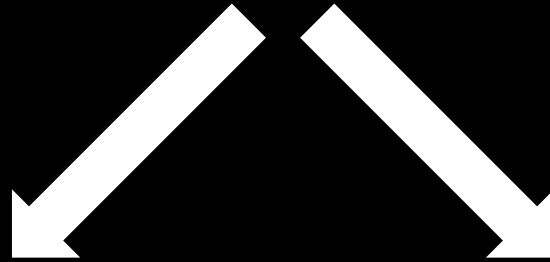
Count per sector	
Median	134
Mean	186
Min	15
Max	949

Two approaches





Two approaches



**Gold
miners**

**Shovel and
jeans sellers**

**Shovel and
jeans sellers**

Who are they?

**Shovel and
jeans sellers**

AI platform strategy

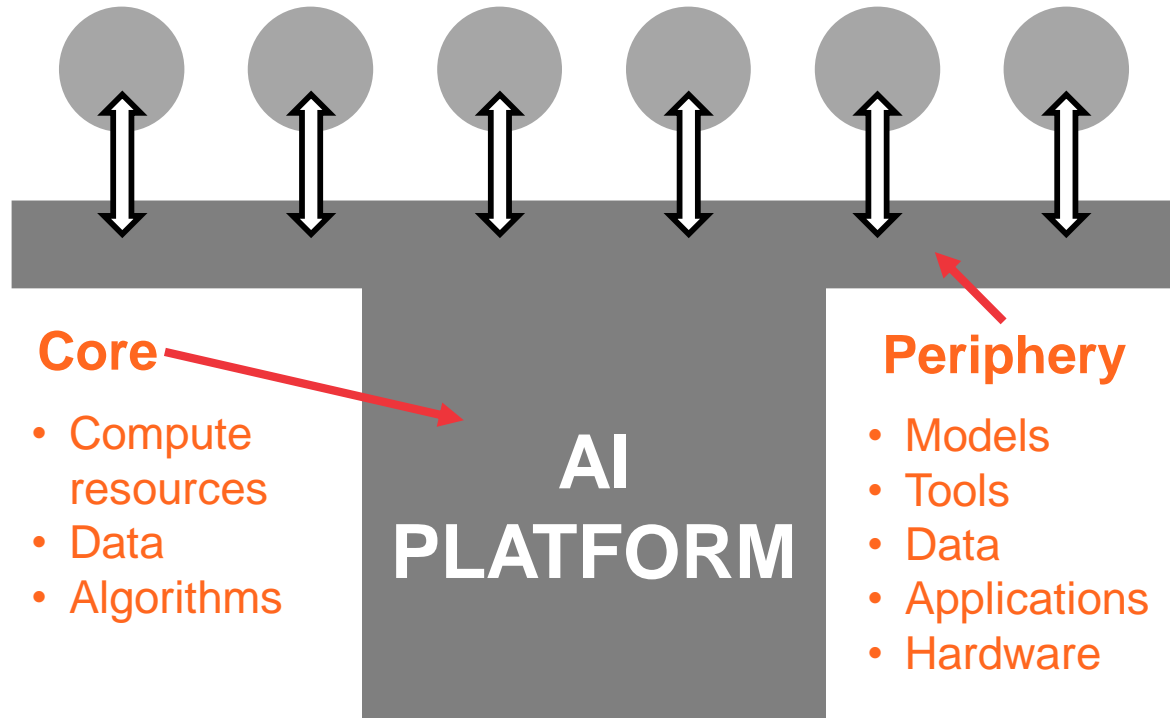
Google

 Microsoft

amazon.com

**Shovel and
jeans sellers**

AI platform strategy



Platform definition

“Evolving organizations or meta-organizations that:

- 1. federate and coordinate constitutive agents who can innovate and compete;**
- 2. create value by generating and harnessing economies of scope in supply or/and in demand; and**
- 3. entail a technological architecture that is modular and composed of a core and a periphery.”**

Gawer, A. (2014). Bridging differing perspectives on technological platforms: Toward an integrative framework.

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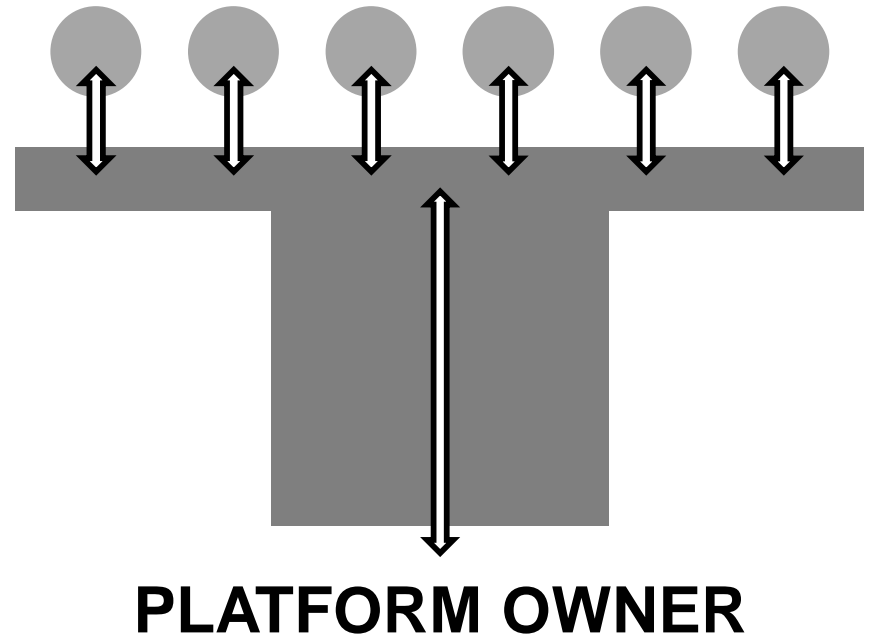
PLATFORM OWNER

Platform definition

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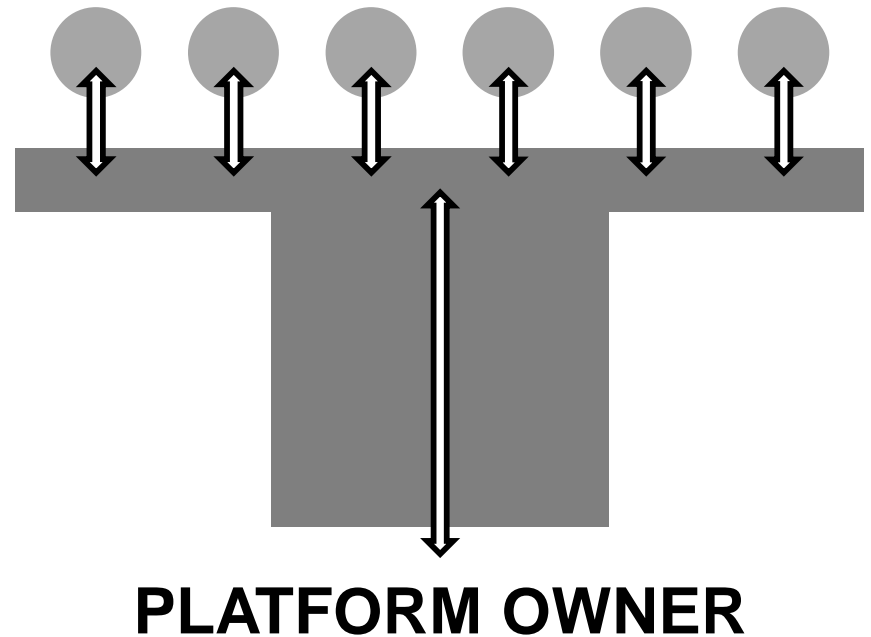


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Amazon SageMaker algorithms and model packages monetization example

Seller's environment/SageMaker

SageMaker

AWS Marketplace

1



Package your code

Build your algorithm or model and package the code in a Docker container.

2



Create algorithm or model package in Amazon SageMaker

Ingest your algorithm or model into Amazon SageMaker. Set training and inference specifications and validation profiles, then upload sample data.

3



List and monetize your product

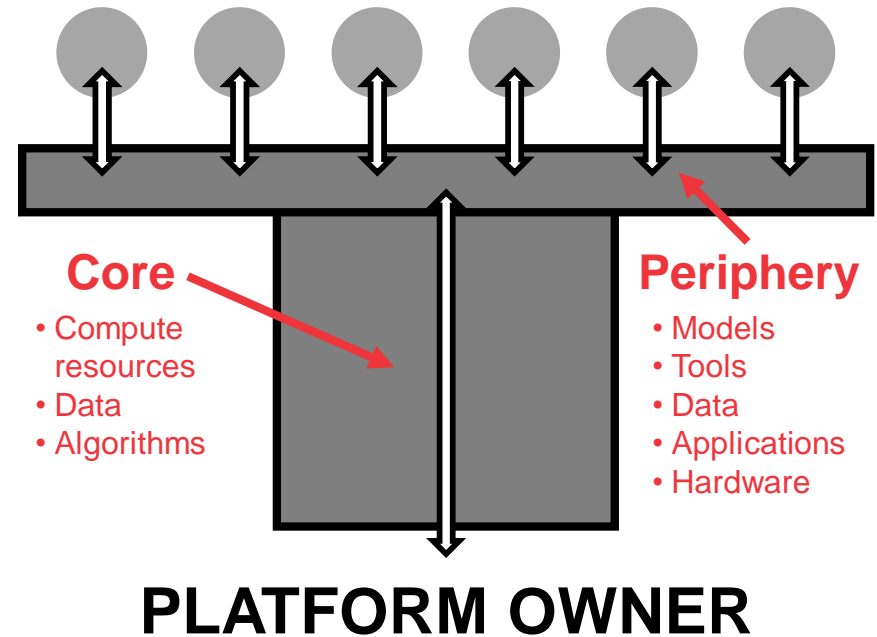
Add a description, promotions, and pricing information, and distribute your product globally.

Platform definition

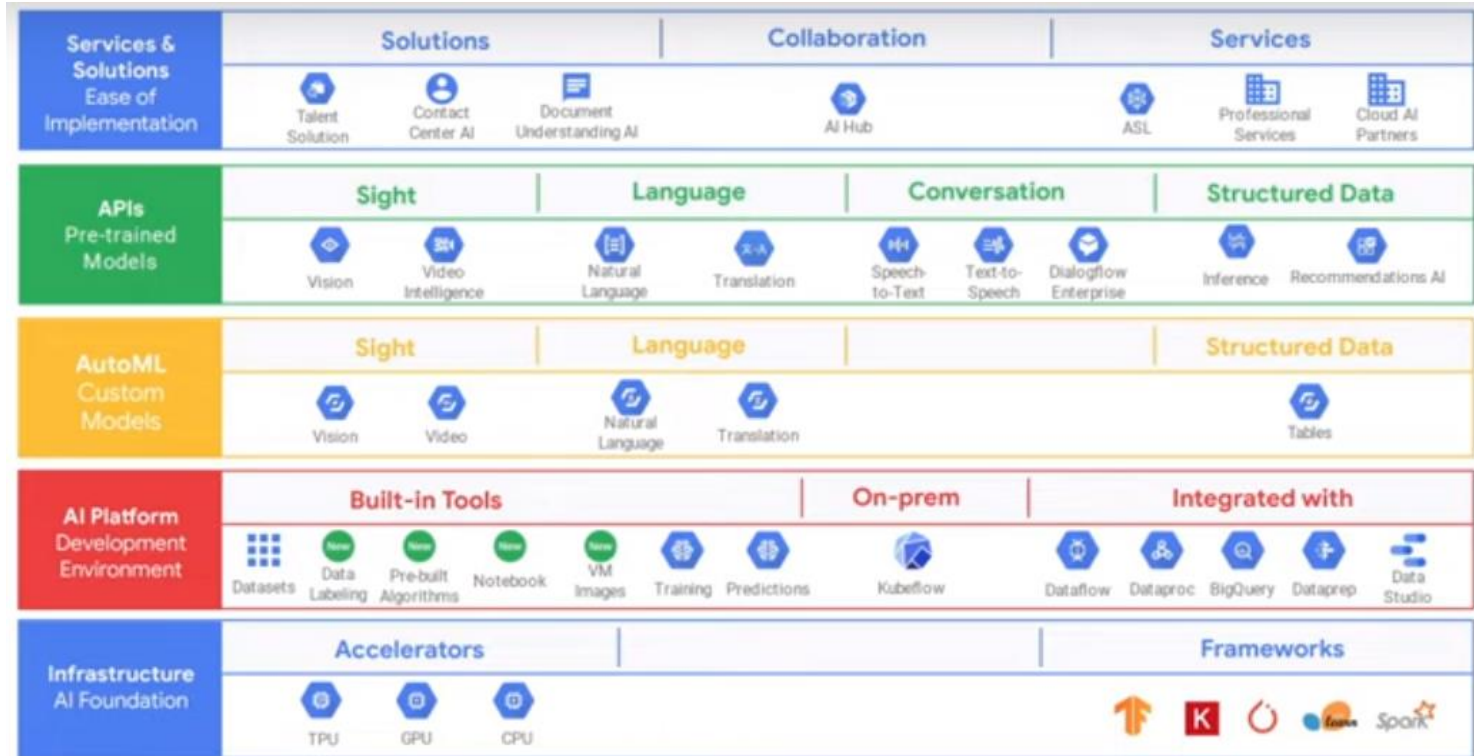
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Google's AI cloud components as of 2019

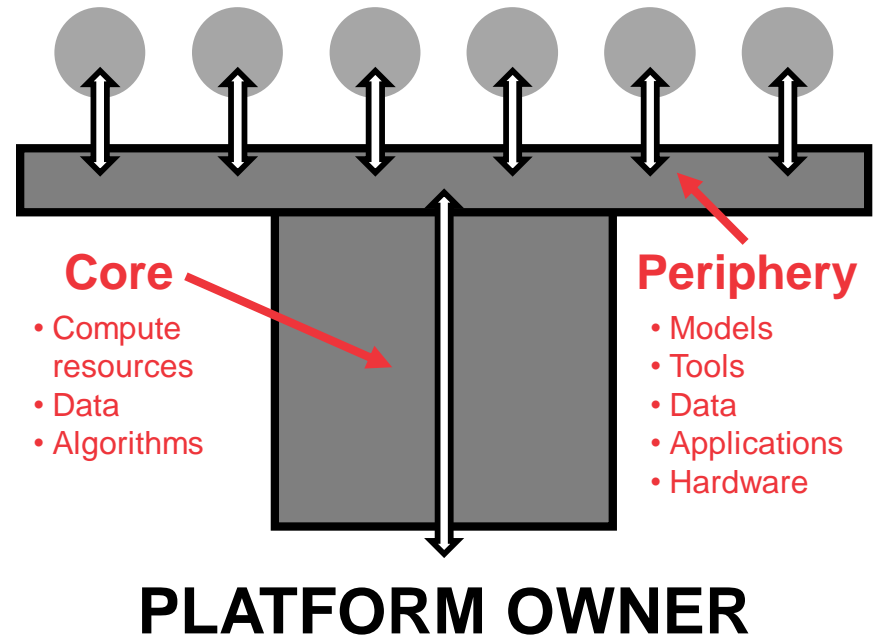


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**Who are AI platform
scholars?**

A new research agenda for digital platform economy

<https://www.etla.fi/en/publications/artificial-intelligence-platforms-a-new-research-agenda-for-digital-platform-economy/>

Artificial Intelligence Platforms:

NEW RESEARCH AGENDA FOR DIGITAL PLATFORM ECONOMY



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<http://pub.etla.fi/ETLA-Working-Papers-76.pdf>

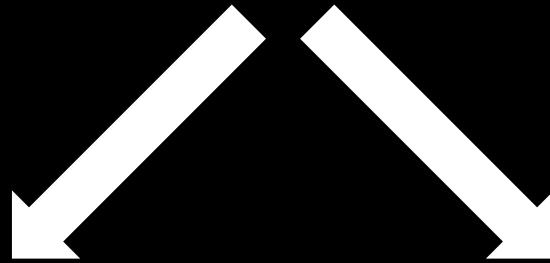
Abstract

Three out of nine of S&P500 digital platform companies stand out as building own artificial intelligence (AI) platforms. There is overwhelming empirical evidence of AI technologies are being central to running a digital platform business. However, the current research agenda is not directing researchers to study AI technologies in the context of digital platforms.

We have divided the proposed AI platforms research agenda as follows: The first set of questions we propose relates to an overall conceptualization of AI platforms. Thereafter, we recognize specific aspects of AI platforms, which need to be investigated in detail to gain understanding that is more complete. The second set of questions we propose relates to understanding the dynamics between AI platforms and the broader socio-economic context.

This topic might be particularly relevant to economies of countries without indigenous AI platforms. Our paper builds on the proposition that AI is a general-purpose technology, which by itself carries properties of a digital platform.

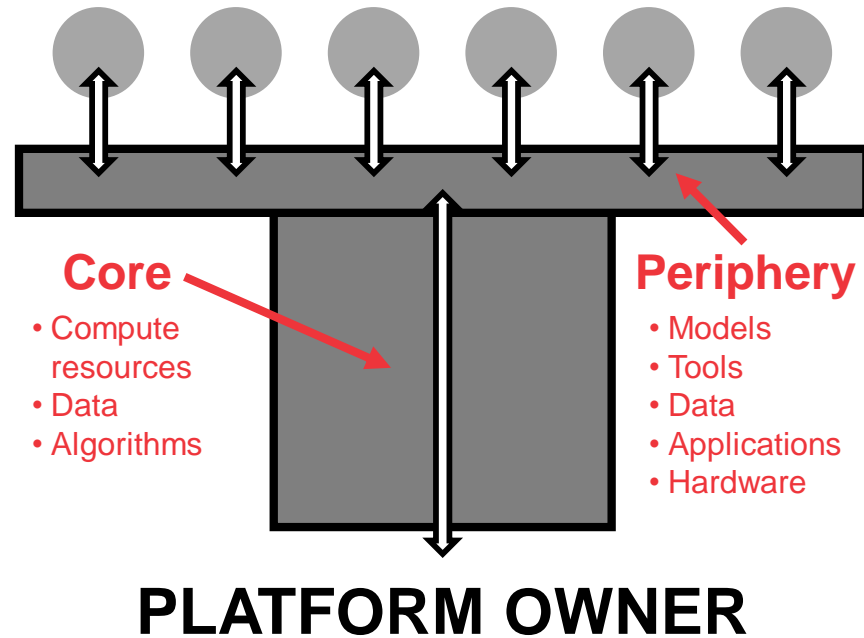
The research agenda



**Micro
level**

**Macro
level**

Micro perspective on AI platforms

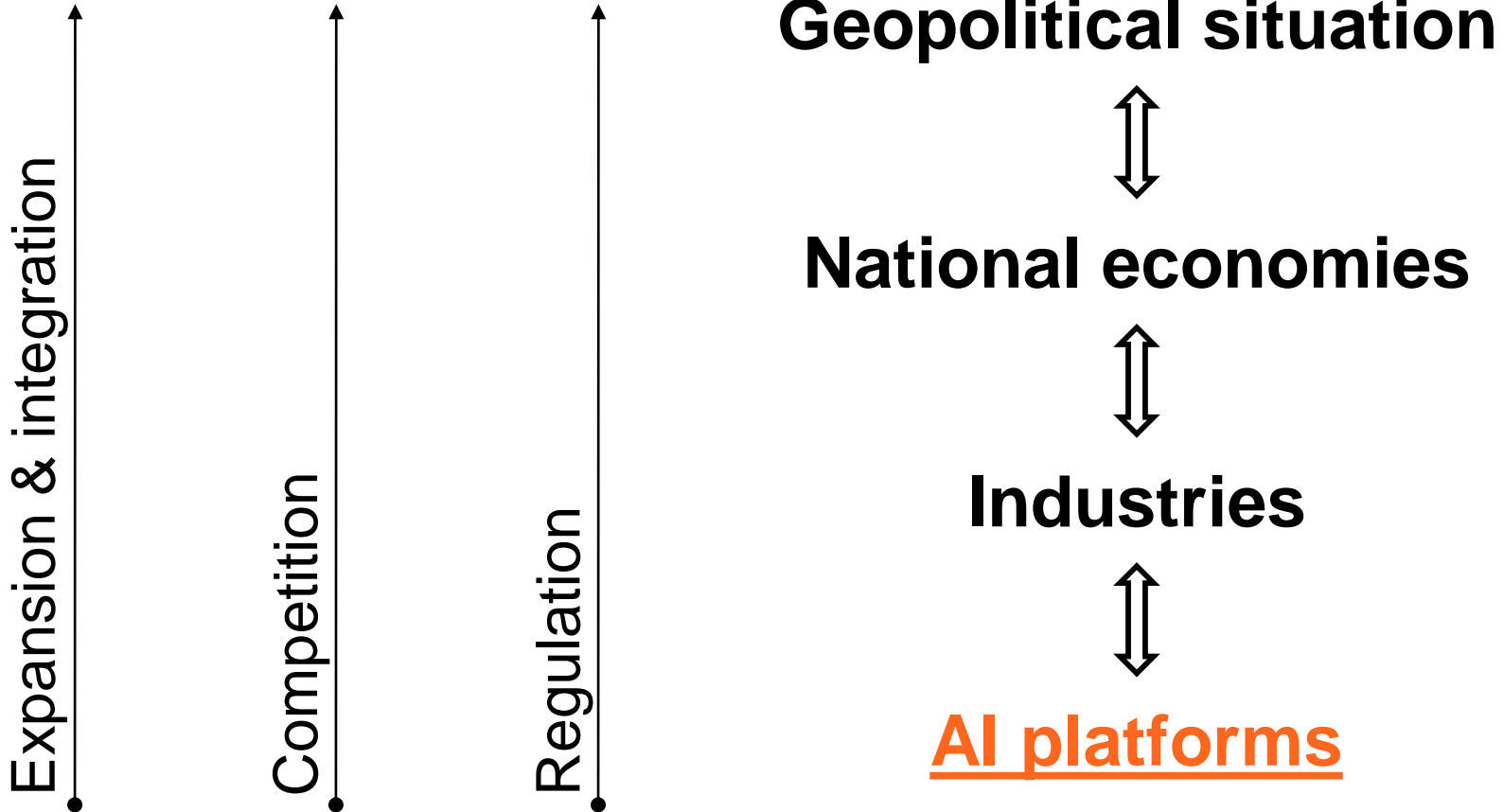


Research agenda:

Micro perspective on AI platforms

Theme	Research questions
1. Conceptualization of AI platform	<ul style="list-style-type: none">• Who are the agents participating in AI platform and its ecosystem?• What constitutes core and periphery of an AI platform?• What is the overall AI platform architecture?
2. AI platform openness and boundary resources	<ul style="list-style-type: none">• How open are AI platforms?• What are the boundary resources used in controlling and facilitating AI platforms?
3. Value creation and capture in AI platforms	<ul style="list-style-type: none">• How value is created and distributed within AI platforms?• What are the AI platform externalities?
4. AI platform strategy, ownership and control	<ul style="list-style-type: none">• What are the building blocks of AI platform strategy?• What are the governance models of AI platforms?
5. Sustainability of AI platforms	<ul style="list-style-type: none">• What are the operating costs / operating cost models of AI platforms?• Is the future of AI platforms sustainable?

Macro perspective on AI platforms



Research agenda:

Macro perspective on AI platforms

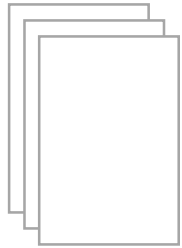
Theme	Research questions
6. AI platforms as (quasi) utility companies	<ul style="list-style-type: none">• Do AI platforms resemble utility companies? To what extent?• What level of AI platform concentration/ competition is optimal for the economy?• What role should regulation play in relation to AI platforms?
7. Expansion/integration of AI platforms with other digital platforms and industrial sectors	<ul style="list-style-type: none">• What are the mechanisms and consequences of AI platform expansion/integration with other digital platforms?• What are the mechanisms and consequences of AI platform expansion/integration with different industrial sectors?
8. Impact of AI platforms on national economies and geopolitical relationships	<ul style="list-style-type: none">• What are the AI platform related economic synergies and conflicts of interests between regions and nations?• What are the AI platform related economic implications for Europe, with no indigenous AI platform offering?• What are the AI platform related economic implications for the developing economies?

Next steps...

Micro level



Empirical paper



Contribution:
Explication of
distinct roles played
by AI in platforms

Macro level



Research agenda



Contribution:
Recognition of important
policy-motivated
research questions