

Introduction

- Case studies of complex AI products
- Roles in an AI team
- AI Transformation Playbook
- Taking your first step



Case study: Smart speaker

### Smart speaker



Amazon Echo / Alexa



Google
Home



Apple Siri



Baidu DuerOS

"Hey device, tell me a joke"

# "Hey device, tell me a joke"

#### Steps to process the command:

- Trigger word/wakeword detection
- Speech recognition
- Intent recognition
- Execute joke

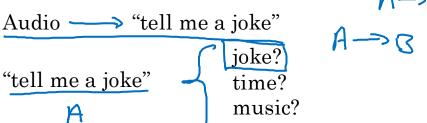






"tell me a joke"

Execution



call?

Audio  $\rightarrow$  "Hey device"? (0/1)

# "Hey device, set timer for 10 minutes"

Steps to process the command:

- 1. Trigger word/wakeword detection Audio→"Hey device"? (0/1)
- 2. Speech recognition Audio "set timer for 10 minutes"
- 3. Intent recognition "set timer for 10 minutes" -> timer
- 4. a) Extract duration
  - "Set timer for 10 minutes"
  - "Let me know when 10 minutes is up"
  - b) Start timer with set duration



#### Other functions

- Play music
- Volume up/down
- Make call
- Current time
- Units conversion
- Simple question
- •

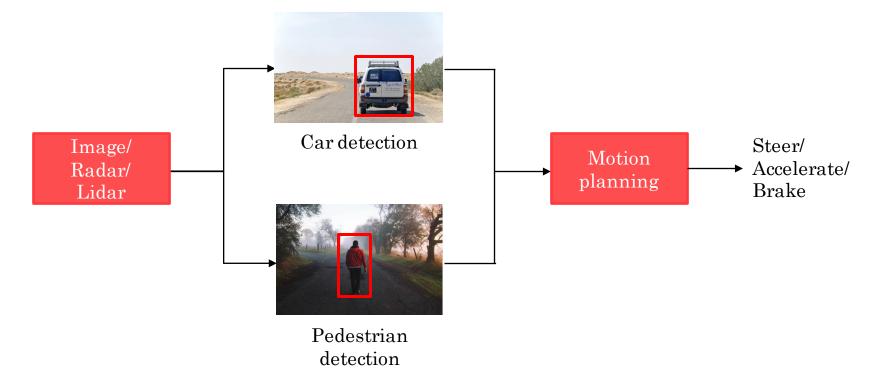
#### Key steps:

- 1. Trigger/wakeword detection
- 2. Speech recognition
- 3. Intent recognition
- 4. Specialized program to execute command



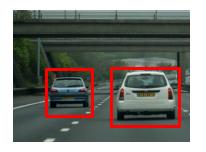
Case study: Self-driving car

# Steps for deciding how to drive



### Key steps:

1. Car detection





2. Pedestrian detection



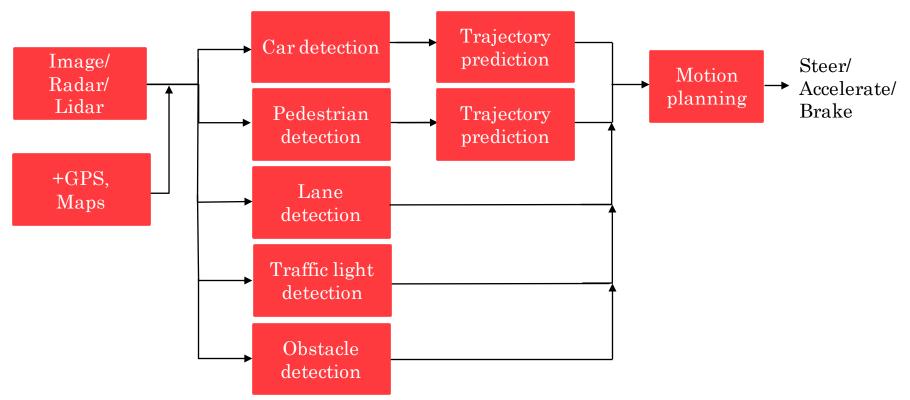


3. Motion planning





# Steps for deciding how to drive





Example roles of an AI team

### Example roles

- Software Engineer
  - E.g., joke execution, ensure self-driving reliability, ...
- Machine Learning Engineer ¬
   A→B



Applied ML Scientist

- Machine Learning Researcher
  - Extend state-of-the-art in ML

### Example roles

- Data Scientist
  - Examine data and provide insights
  - Make presentation to team/executive
- Data Engineer
  - Organize data
  - Make sure data is saved in an easily accessible, secure and cost effective way
- AI Product Manager
  - Help decide what to build; what's feasible and valuable

→ 1 MB (megabyte)

→ 1,000 MB = GB (gigabyte) → 1,000,000 MB = TB (terabyte) → 1,000,000,000 MB = PB (petabyte)

# Getting started with a small team

- 1 Software Engineer, or
- 1 Machine Learning Engineer/Data Scientist, or
- Nobody but yourself



AI Transformation Playbook (Part I)

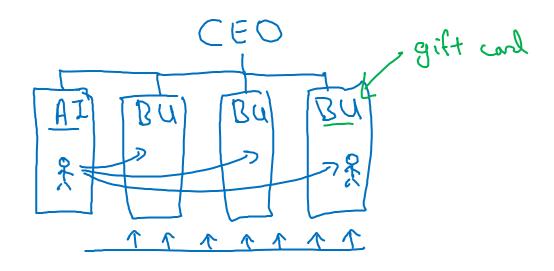
# AI Transformation Playbook

- 1. Execute pilot projects to gain momentum
- 2. Build an in-house AI team
- 3. Provide broad AI training
- 4. Develop an AI strategy
- 5. Develop internal and external communications

### 1. Execute pilot projects to gain momentum

- More important for the initial project to succeed rather than be the most valuable
- Show traction within 6-12 months
- Can be in-house or outsourced

#### 2. Build an in-house AI team



**BU= Business Unit** 

AI function can be under CTO, CIO, CDO, etc. or a new CAIO

# 3. Provide broad AI training

Role	What they should learn

The smart CLO knows they should *curate* rather than *create* content



AI Transformation Playbook (Part II)

# AI Transformation Playbook

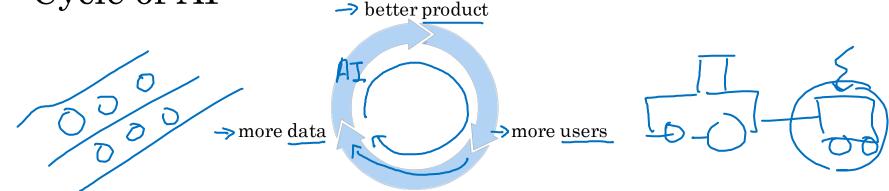
- 1. Execute pilot projects to gain momentum
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- 4. Develop an AI strategy
- 5. Develop internal and external communications



# 4. Develop an AI strategy

• Leverage AI to create an advantage specific to your industry sector

• Design strategy aligned with the "Virtuous Cycle of AI"



# 4. Develop an AI strategy

- Consider creating a data strategy
  - -Strategic data acquisition
  - -Unified data warehouse
- Create network effects and platform advantages
  - -In industries with "winner take all" dynamics,
  - AI can be an accelerator

#### 5. Develop internal and external communications

- Investor relations
- Government relations
- Customer/user education
- Talent/recruitment
- Internal communications

You can download the AI Transformation Playbook in the next section.



AI pitfalls to avoid

# AI pitfalls to avoid

#### Don't:

• Expect AI to solve everything

• Hire 2-3 ML engineers and count solely on them to come up with use cases

#### Do:

- Be realistic about what AI can and cannot do given limitations of technology, data, and engineering resources
- Pair engineering talent with business talent and work crossfunctionally to find feasible and valuable projects

# AI pitfalls to avoid

#### Don't:

- Expect the AI project to work the first time
- Expect traditional planning processes to apply without changes
- Think you need superstar AI engineers before you can do anything

#### Do:

- Plan for AI development to be an iterative process, with multiple attempts needed to succeed
- Work with AI team to establish timeline estimates, milestones, KPIs, etc.
- Keep building the team, but get going with the team you have



Taking your first step in AI

# Some initial steps you can take

- Get friends to learn about AI
  - -This course
  - -Reading group
- Start brainstorming projects
  - -No project is too small
- Hire a few ML/DS people to help
- Hire or appoint an AI leader (VP AI, CAIO, etc.)
- Discuss with CEO/Board possibilities of AI Transformation
  - -Will your company be much more valuable and/or more effective if it were good at AI?





Survey of major AI application areas (optional)

# Computer Vision

• Image classification/Object recognition



cat

-Face recognition

register



new







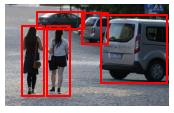


Object detection













# Natural Language Processing

- Text classification
  - Sentiment recognition
- Information retrieval
  - E.g., web search
- Name entity recognition
- Machine translation

Email → Spam/Non-Spam

Product description → Product category

"The food was good" → ★ ★ ★

"Service was horrible" → ★

"Queen Elizabeth II knighted Sir Paul McCartney for his services to music at the Buckingham Palace"

AIは、新たな電気だ AI is the new electricity

# Speech 7 time

- Speech recognition (speech-to-text)
- Trigger word/wakeword detection
- Speaker ID
- Speech synthesis (text-to-speech, TTS)

  The quick brown fox jumps over the lazy dog.

#### Generative AI

Artificial intelligence systems that can produce high quality content, specifically **text**, **images**, **and audio**.

Text generation

- "Suggest three funny, creative names for a line ——of chocolate ice cream"
- 1. Choco-Chuckle Swirl
- 2. Fudge-tastic Delight
- 3. Silly Cocoa Scoops

Image generation

"a purple friendly robot eating ice-cream"

- Audio generation
  - Speech, music

"drum solo 140 bpm"



#### Robotics

- Perception: figuring out what's in the world around you
- Motion planning: finding a path for the robot to follow
- Control: sending commands to the motors to follow a path



# General machine learning

• Unstructured data (images, audio, text)



image



audio AIは、新たな電気だ text AI is the new electricity

Structured data

House size (square feet)	# of bedrooms	Price (1000\$)
523	1	100
645	1	150
708	2	200

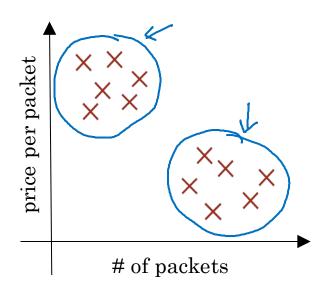
Clay batch	Supplier	Mixing time (minutes)
001	ClayCo	35
034	GooClay	22
109	BrownStuff	28



Survey of major AI techniques (optional)

### Unsupervised learning

#### Clustering Potato chip sales





Given data (without any specific desired output labels), find something interesting about the data



Finding cats from unlabeled YouTube videos

# Transfer learning

#### Car detection







100,000 images

#### Golf cart detection

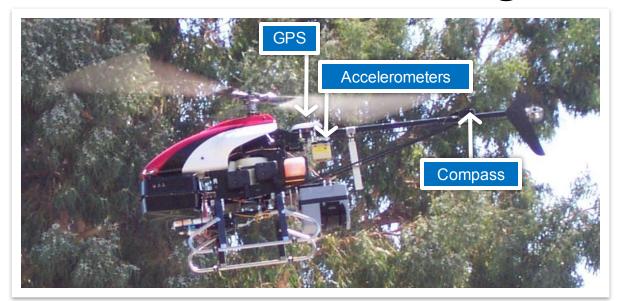




100 images

Learn from task A, and use knowledge to help on task B

# Reinforcement learning





Use a "<u>reward signal</u>" to tell the AI when it is doing well or poorly. It automatically learns to maximize its rewards.

# Reinforcement learning



Use a "reward signal" to tell the AI when it is doing well or poorly. It automatically learns to maximize its rewards.

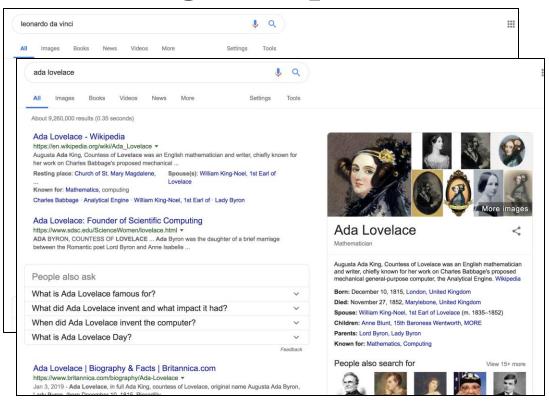
### GANs (Generative Adversarial Network)

Synthesize new images from scratch



[Source: Karras et al. (2018). Progressive Growing of GANs for Improved Quality, Stability, and Variation]

### Knowledge Graph



Ada Lovelace		
Born	Dec 10, 1815	
Died	Nov 27, 1852	
Bio	English mathematician and writer	

Northern Rooster Hotel		
Address	45 Rooster St, LA	
Phone	(650) 555-3992	
Wifi	yes	
Pool	no	