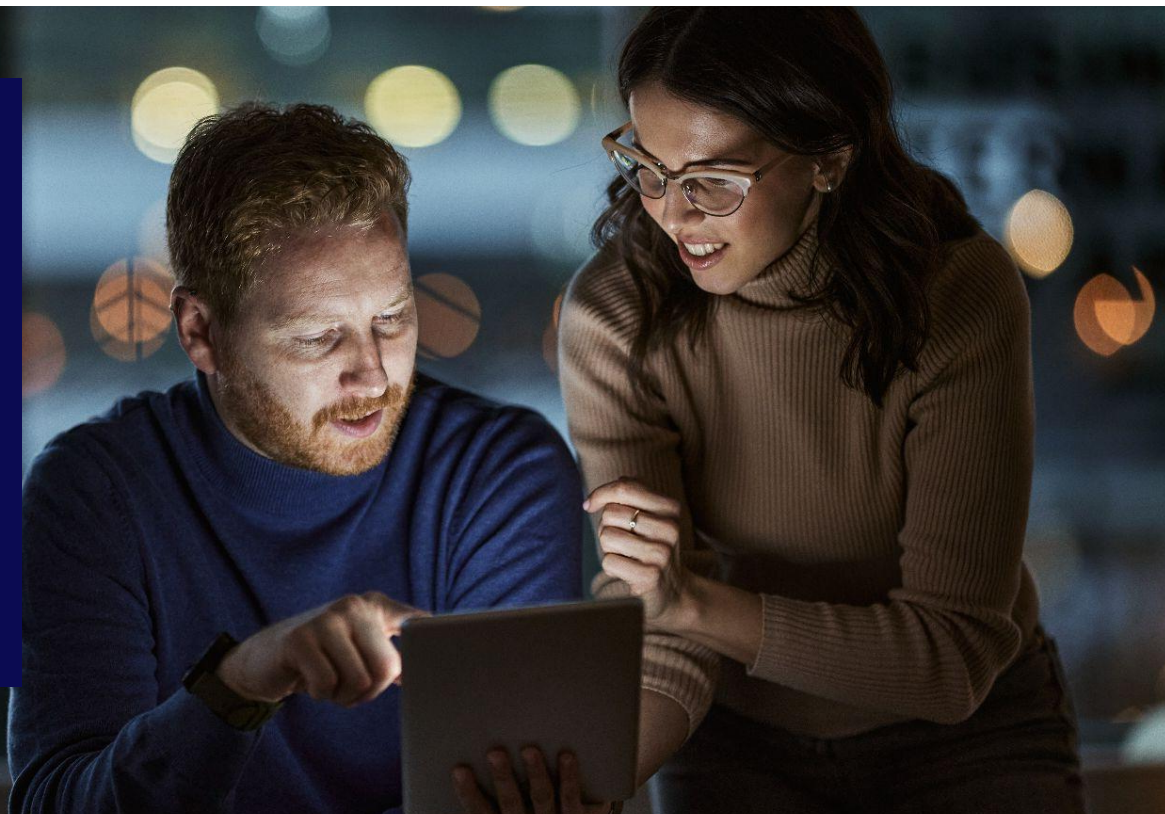




faculty

Making better decisions with Generative AI

An executive briefing



Today's agenda

-
- 01 An introduction to Faculty + OpenAI

 - 02 Large Language Models (LLMs) - an overview

 - 03 Putting LLMs to work in your organisation

 - 04 How to get started

 - 05 Q&A



OpenAI

Faculty

Leading today's call



Marc Warner

Co-founder and CEO



Kat James

Technical Director
Retail & Consumer



Josh Muncke

Commercial Director
Retail & Consumer



Andrew Perry

Commercial Director
Energy Transition & Environment

Faculty design, build and implement intelligent decision systems

Faculty is Europe's leading applied AI firm, with a high density of PhD+ Data Scientists and ML Engineers

We have built and deployed over 450+ high-impact AI systems for over 250 organisations across both public and private sectors

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LONDON FIRE BRIGADE

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AMNESTY
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sky

▲ Faculty's AI solutions underpin critical operations for healthcare providers, leading retail and consumer businesses, energy companies and governments.

▲ Our technology is trusted to operate safely in some of the world's most demanding contexts. We are pioneers and global leaders in safe and ethical deployments of AI.

Our partnership with OpenAI helps you unlock the potential of Generative AI safely and responsibly in the real world.



Leverage the power of OpenAI to make better decisions - [learn more](#)



AI Technology Experts

We have deep expertise in AI technology including NLP, LLMs, computer vision and transformer architecture.



Applied Experience

We are Europe's largest applied AI firm. We have designed, built and deployed AI extensively in both public and private sector.



Commitment to AI Safety

We are world leaders in [AI safety](#). We are proud that customers trust us to mitigate risks in the real world.



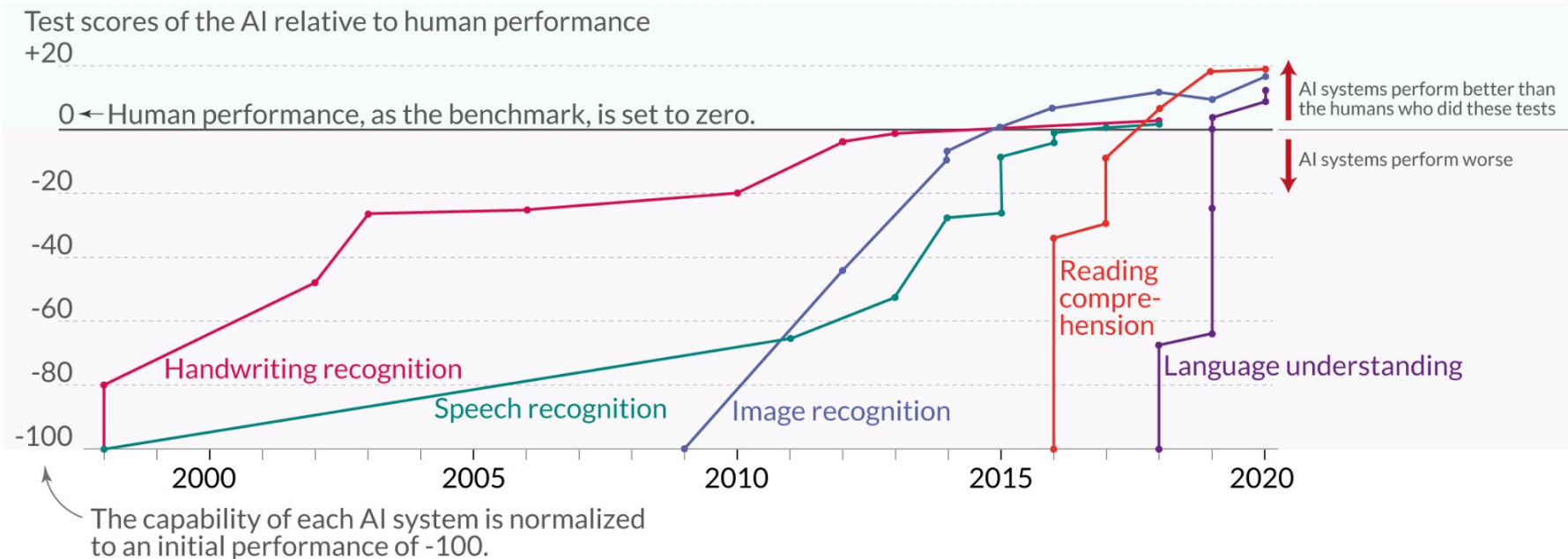
"We chose to work with Faculty because they understand our technology and its potential but also have the experience to ensure it is implemented successfully and safely.

Generative AI is going to change the world, and we look forward to Faculty helping us on our journey to extend the benefits of Generative AI to businesses and their customers."

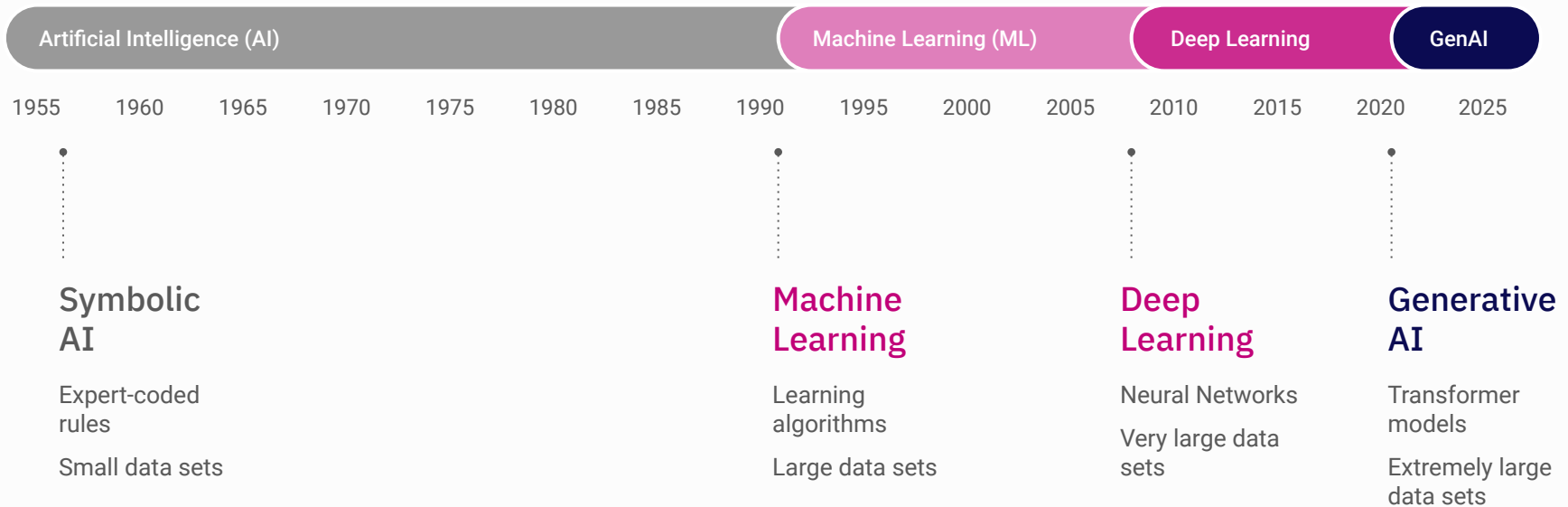
Zack Kass, Chief Customer Officer, OpenAI

Large Language Models - an overview

We have reached an inflection point when it comes to the performance of AI against a range of human tasks



Generative AI is the latest advance in the field - but it represents a massive step forward in capability



Generative AI moves us beyond classification and prediction tasks, and into creative capabilities (traditionally things machines were bad at)



Unlike “traditional” AI models - Generative AI delivers novel, generalisable outputs **akin to what a human might produce**

Traditional “discriminative” AI

Generative AI

Outputs are aggregations, summarisations or extrapolations of the inputs

Outputs are synthetic and entirely novel

Models with a narrow focus - built for a specific purpose and context

Large, general models that are multi-purpose and often exhibit “zero-shot” capabilities

Can often be trained and deployed / operated by in-house teams

Extremely expensive to train. Currently exclusively served via API

Input is generally data generated by some sort of process or behaviour (e.g. sales transactions)

Input is typically in the form of a text “prompt”

Depending on the model, outputs can be easy or difficult to explain

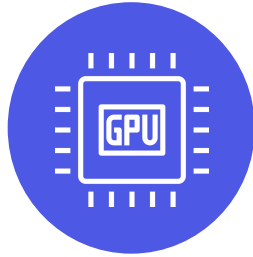
Outputs are in text/image format and are easily consumed and understood by humans

3 key breakthroughs have enabled the acceleration of Large Language Model (LLM) capability



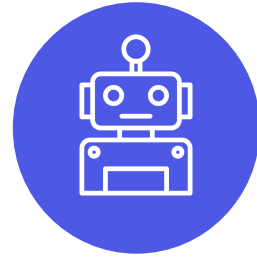
1. Massive data

This unlocked the ability to synthesize an extremely large amount of human knowledge across multiple domains



2. Massive compute

Advances in computing hardware (Moore's Law) have made parallel computations extremely fast and more cost effective than ever.



3. Algorithm advances

Transformer models have unlocked huge improvements in language models by allowing sequential operations to be trained in parallel.

How GPT-*x* is built

01

Train on massive amounts of data

Objective: base model is trained over a massive corpus of text, building a probabilistic distribution used to predict the next token

Input text data



Train transformer

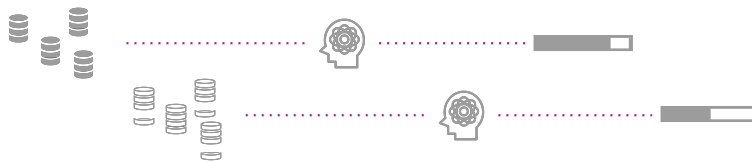


02

Fine tune with some humans in the loop

Objective: base model is fine-tuned on a reward signal from human feedback. This biases the model to the domain where human preferences have assigned a higher reward

Fine-tune model based on RLHF framework



03

Add safety features

Objective: as well as including safety in RLHF, rule-based reward models (RBRMs) are applied to reduce likelihood that GPT will return harmful content

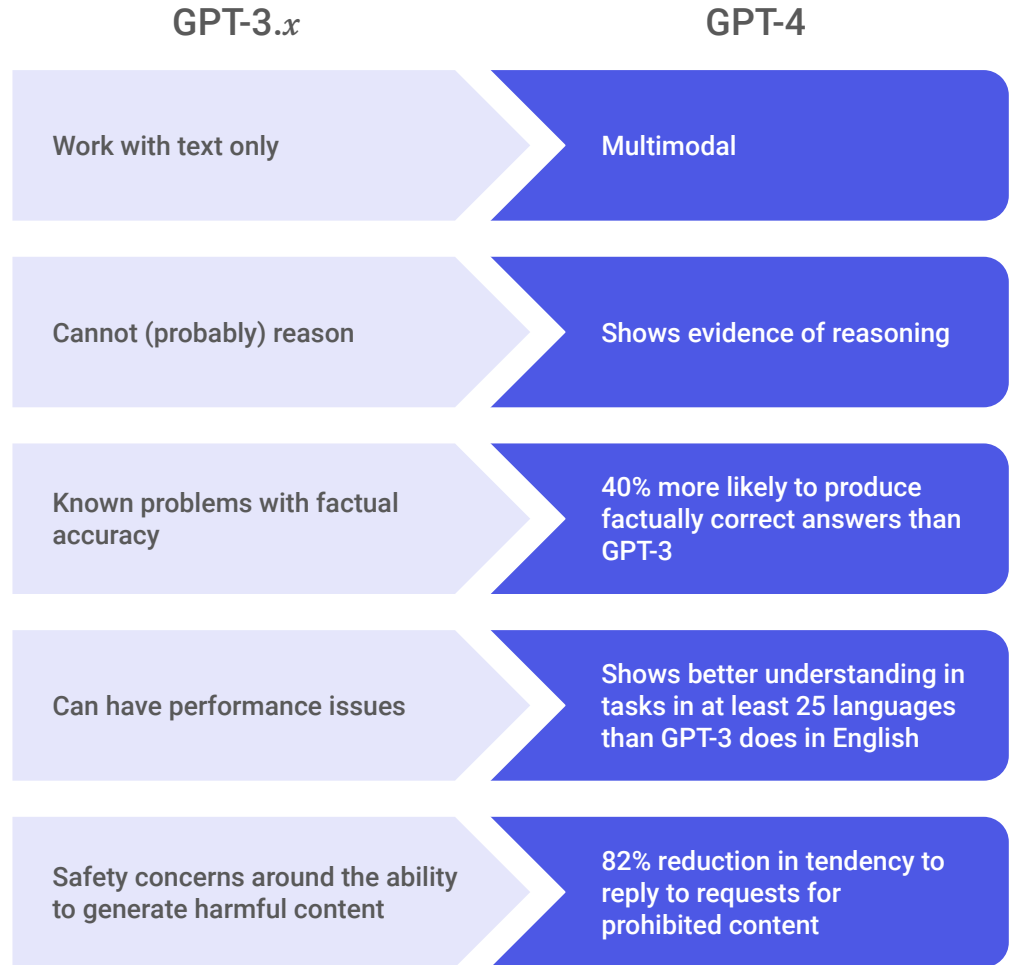
Anticipate malicious actors



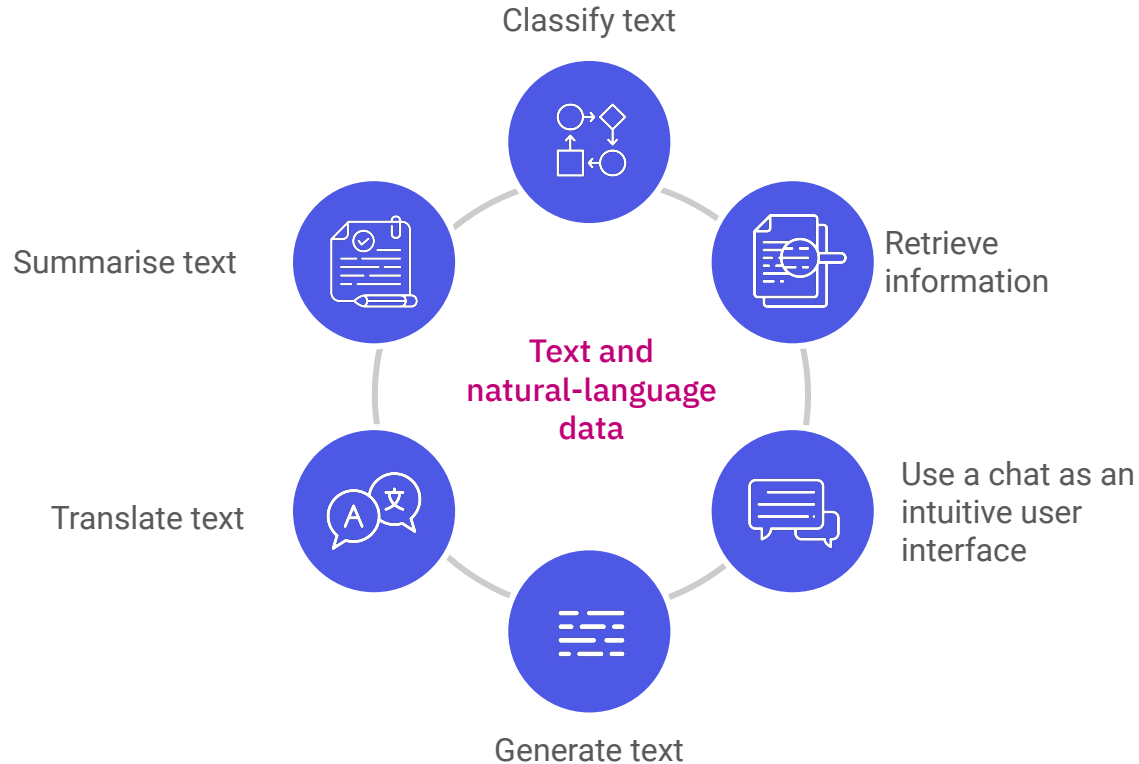
Include safety features



GPT-4 changes the game again and shows significant **performance improvement** compared with GPT-3



General purpose capabilities associated with Large Language Models



There are **known risks and issues** with the current generative systems that need to be taken into account



Hallucination

WIRED SUBSCRIBE

AI Has a Hallucination Problem That's Proving Tough to Fix

Machine learning systems, like those used in self-driving cars, can be tricked into seeing objects that don't exist. Defenses proposed by Google, Amazon, and others are vulnerable too.



Frozen in time

BE Who is the current prime minister of the UK?

As of my knowledge cutoff in September 2021, the current Prime Minister of the UK was Boris Johnson. However, since my training data only goes up to that point and I am not constantly updated, it is possible that there has been a change in the Prime Minister since then.



Bias

USA TODAY TECH

Is ChatGPT 'woke'? AI chatbot accused of anti-conservative bias and a grudge against Trump

JESSICA GUYNN | USA TODAY



Unexpected behaviour

The New York Times

Artificial Intelligence > An Unsettling Chat with Bing Read the Conversation How Chatbots Work

Bing's A.I. Chat: 'I Want to Be Alive.'

In a two-hour conversation with our columnist, Microsoft's new chatbot said it would like to be human, had a desire to be destructive and was in love with the person it was chatting with.



Legal Uncertainty

REUTERS World Business Legal Markets More Register

My View Following Saved

Copyright Litigation Technology Intellectual Property Data Privacy

2 minute read - February 6, 2023 5:32 PM GMT - Last Updated 23 days ago

Getty Images lawsuit says Stability AI misused photos to train AI

By Blake Brittain



Sensitive data considerations

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NEWSLETTERS - CFO DAILY

A major bank has banned ChatGPT—should your company follow suit?

BY SHERYL ESTRADA

February 24, 2023 at 12:00 PM GMT

The right way to think of the models that we create is **a reasoning engine**, not a fact database,"

"They can act as a fact database, but that's not really what's special about them – what we want them to do is something closer to the ability to reason, not to memorize."

Sam Altman, CEO OpenAI

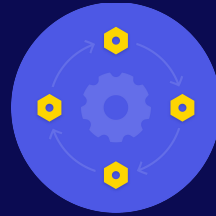


Putting **LLMs** to work

3 essential rules for using LLMs in an enterprise context



Find the right type of
problem



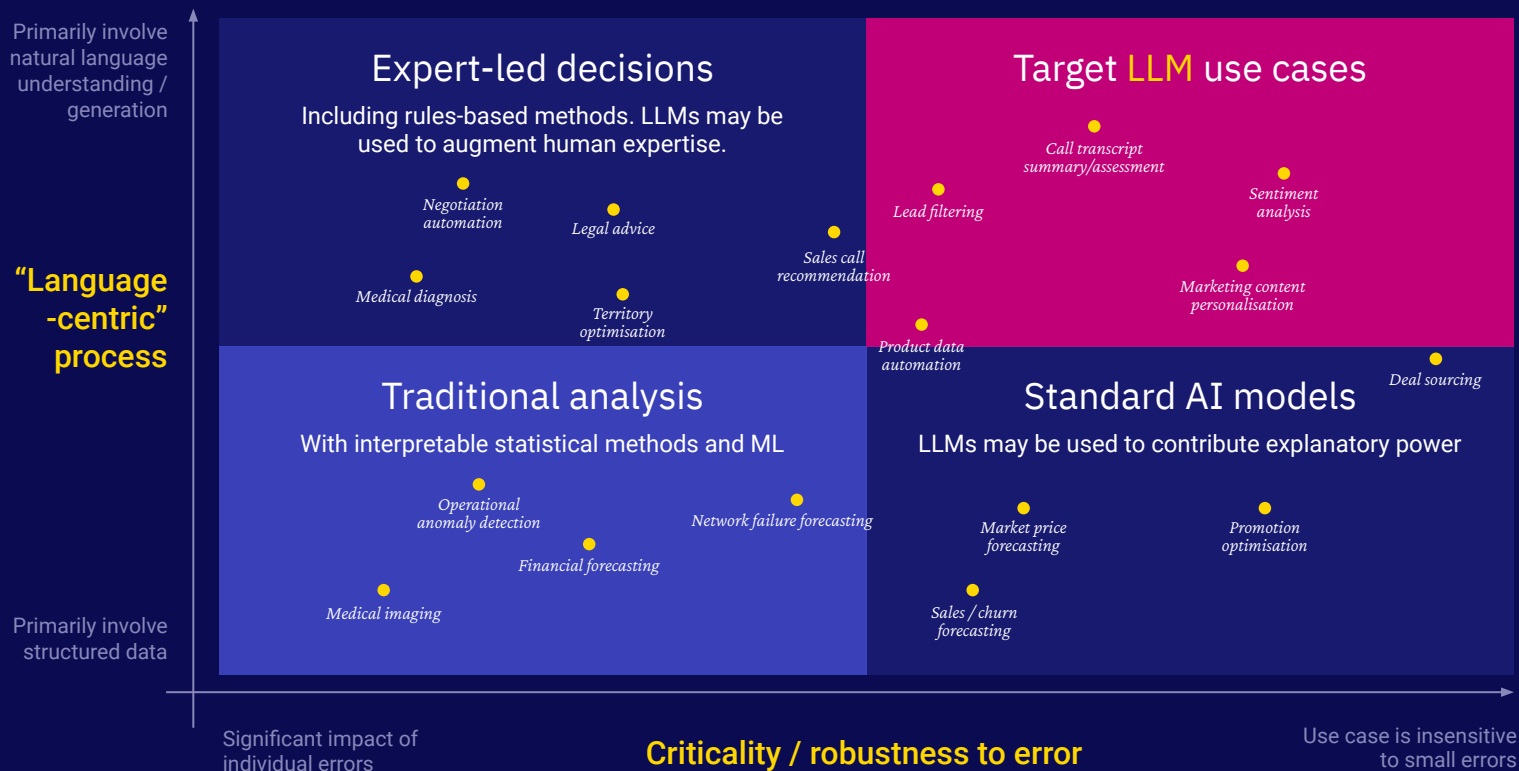
Integrate into an
end-to-end system



Build in safety
from the outset

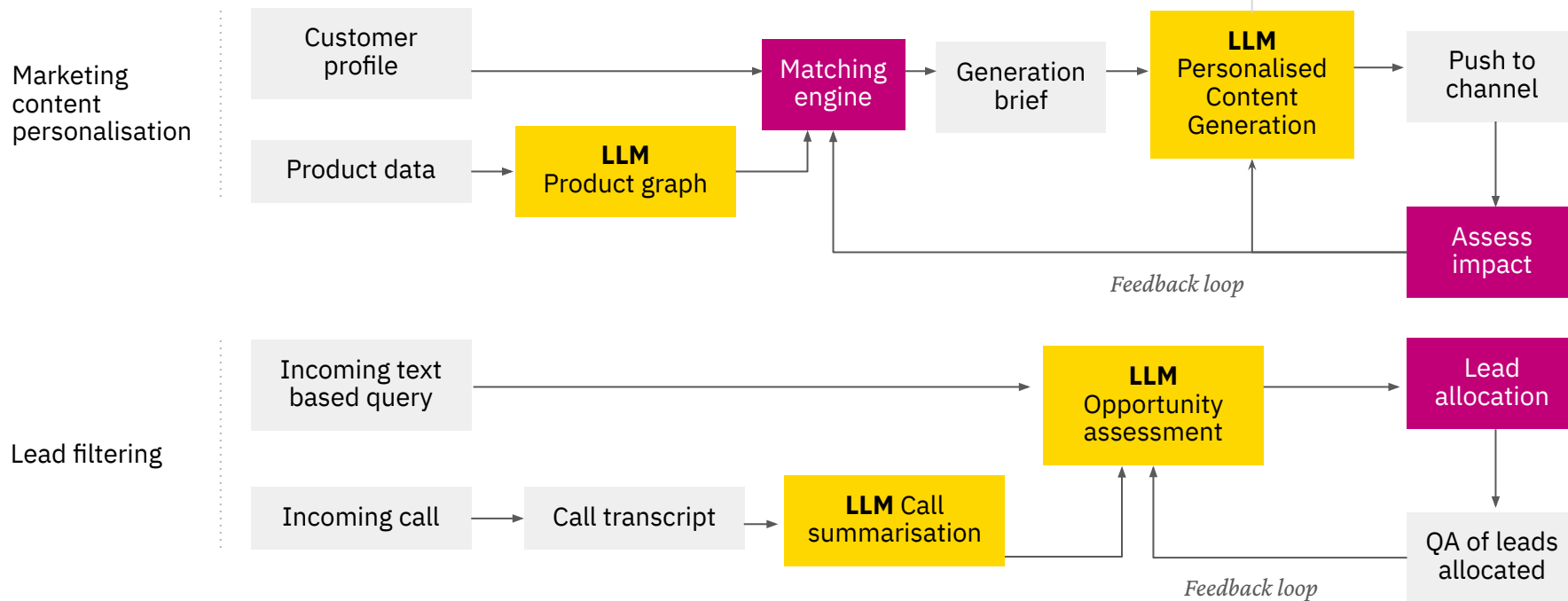
Finding the right type of problem

A framework for Large Language Model use cases (illustrative)



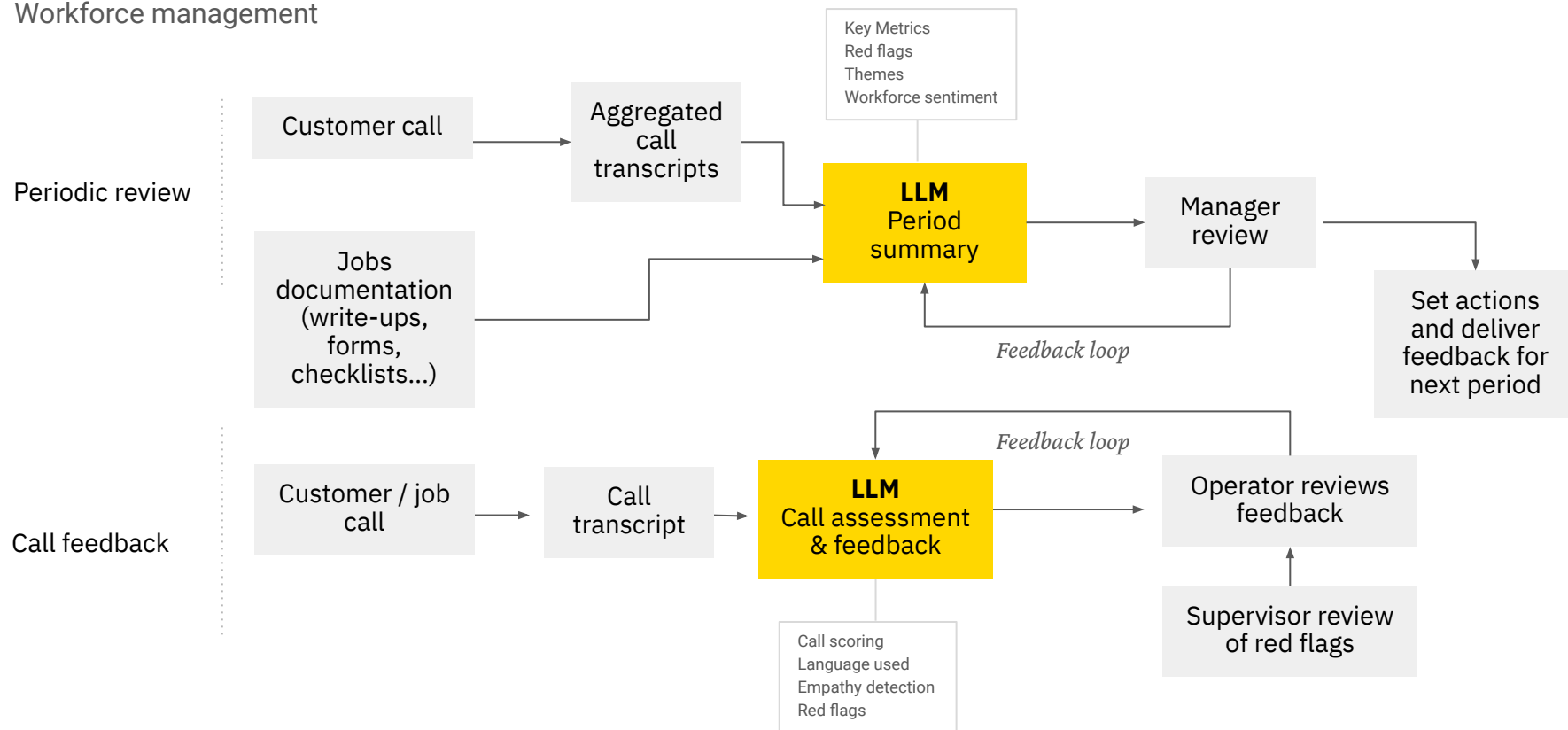
Integrate into an end-to-end system

Customer acquisition



Integrate into an end-to-end system

Workforce management



Build in AI safety from the outset

Faculty Responsible AI Framework



Explainability

How can I understand it?

- Can I trust the output?
- How do I monitor my model over time?
- Who is accountable?
- Is there a QA loop to capture internal feedback?



Fairness

Does it do the right thing?

- Has it been legitimately and statistically validated?
- Is it unfairly biased?



Privacy

Does it preserve privacy?

- Are measures in place to minimise unnecessary exposure?
- Can sensitive information be extracted from the model?



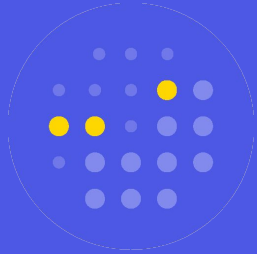
Robustness

Is it robust in the real world?

- Is the impact of errors effectively mitigated within the E2E process?
- Can I estimate uncertainty?
- Does it generalise well?
- Is it robust to attacks?
- Is a layer needed between the model and consumers?

How to get started

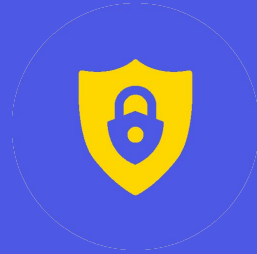
Getting started with LLMs - **key considerations**



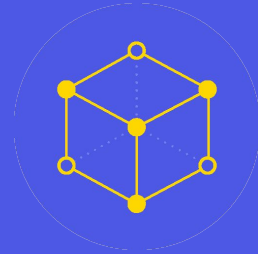
**How you
interact with
them**



**Cost and
commercial
model**



**Privacy
and legal
considerations**



**Internal
technical
architecture**

There are numerous ways for organisations to interact with LLMs - different modes are appropriate for different use cases

Interactive

Users interface directly with the pre-trained models using online chat or web interfaces

Integrated

Generative capabilities integrated into existing tools software vendors

Customised

Models are refined and optimised to organisation - specific use cases / data

Fully-integrated

Models are deeply integrated into a broader decision process and existing ML models

Level of technical/process change

Better understanding LLM cost and commercial models

01

There are three components to LLM costs

"Fine tuning"

"Prompting"

"Completion"

02

They are typically charged on the volume of data input/output

100 "tokens" ~ 75 words

30 min discussion = 6.5k - 9.5k tokens

03

Costs are highly variable across different models (and with time)

GPT-3.5 (Da Vinci)
\$0.02 / 1K tokens

chatGPT
\$0.002 / 1K tokens

GPT-4
\$0.12 / 1K tokens

10X cheaper!

60X more expensive!

Key takeaways

- You won't always need the best performing model for all use cases
- Estimate and optimise your use case up front
- Remain flexible in your deployment approach as things change

The key **legal, security and privacy** considerations



Transfer and storage of
your data



Data that the foundation
models are trained on

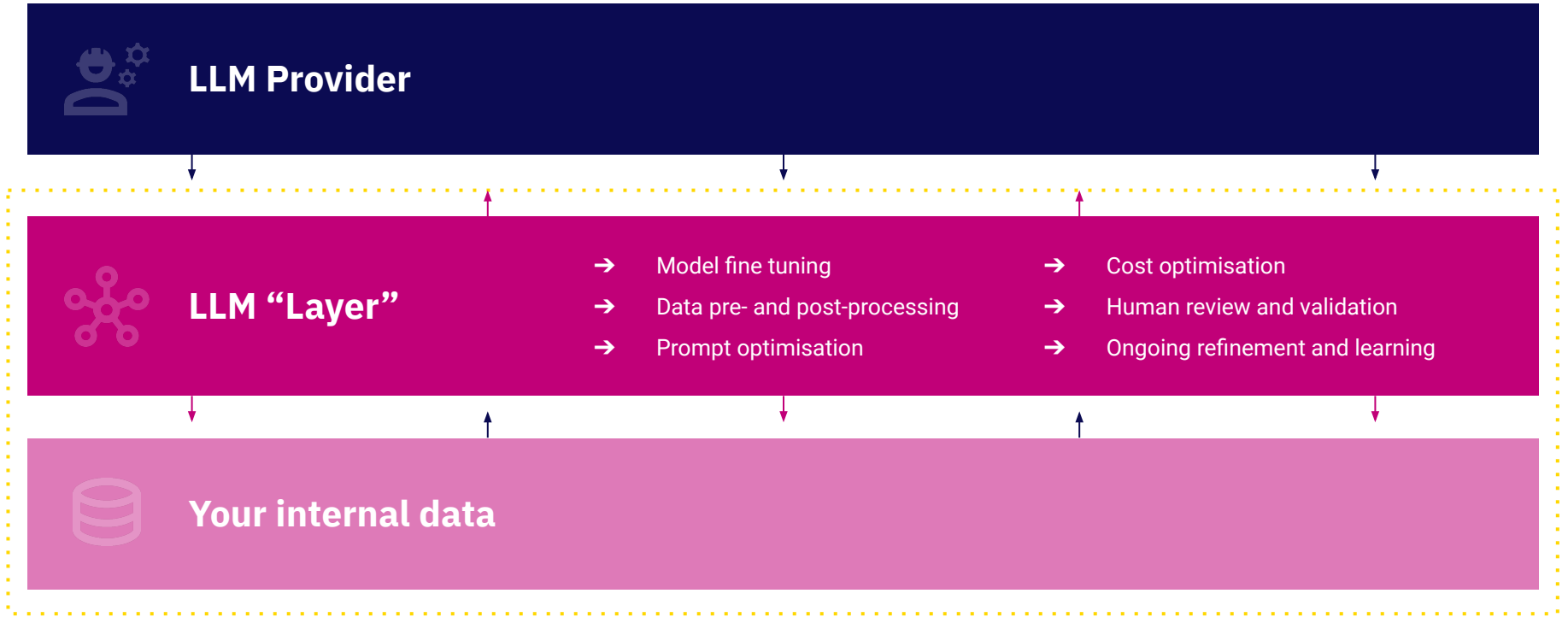


Ownership of prompts and
generated outputs



The impact of hallucination
and accuracy

A new **system design** for using Generative AI in an enterprise context



How we help our customers chart a course with Generative AI

1

Educate and ideate

1-2 workshops (½ day)

- Interactive Generative AI workshops and demos of latest models
- Outside-in perspective of relevant applications
- Develop a customised list of use cases for your business

2

Prioritise and scope

2-3 weeks

- Assess each of use case on feasibility and benefits
- Define the best interaction mode for each use case
- Evaluate cost, safety and performance implications

3

Plan for deployment

1 week

- Define the target technical architecture
- Develop a build plan for the top use case(s)
- Knowledge transfer and handover

Summary / Q&A

Summary

01

Generative AI is here and will be one of the most **profoundly transformative technologies of our time**

02

There are some **immediate opportunities for businesses** to use this technology today

03

Picking the right problems, thinking systematically and starting with a safety-first mindset are key

Q&A session



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Moderator



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Thank you

If you're interested in finding out more about how Faculty can help you leverage OpenAI services, [get in touch with us!](#)

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