



# AI Principles and Responsible AI

Introduction to Responsible AI in Practice

# In this module, you learn to ...

- 01 Identify the need for Responsible AI
- 02 Recognize that **decisions** made at **all stages of a project** have an impact on Responsible AI
- 03 Understand Google's AI Principles
- 04 Explore Responsible AI practices



# Topics

- |    |                          |
|----|--------------------------|
| 01 | AI & Responsibility      |
| 02 | Google's AI Principles   |
| 03 | Responsible AI Practices |

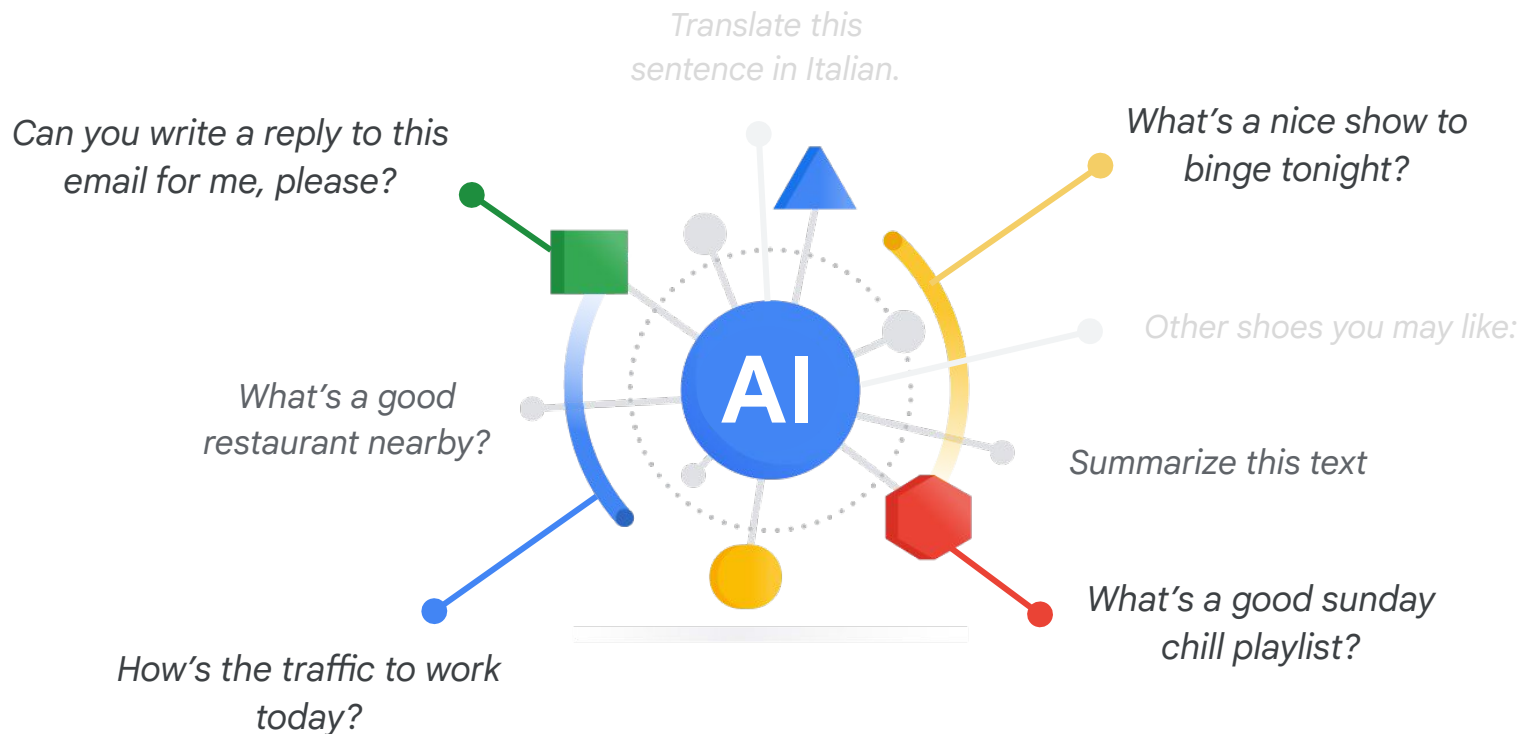


# Topics

- |    |                          |
|----|--------------------------|
| 01 | AI & Responsibility      |
| 02 | Google's AI Principles   |
| 03 | Responsible AI Practices |



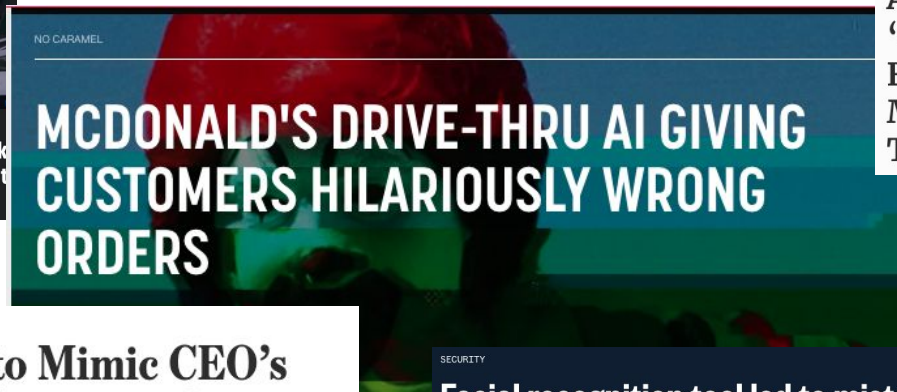
# AI is part of our daily lives



# AI is not infallible



**Zillow AI Goes Crazy. Causes \$8 Billion Drop in Market Cap, a \$304 Million Operating Loss, and 2,000+ Jobs**



**AI-Generated 'Seinfeld' Banned From Twitch After Making Transphobic Jokes**

PRO CYBER NEWS

## Fraudsters Used AI to Mimic CEO's Voice in Unusual Cybercrime Case

Scams using artificial intelligence are a new challenge for companies

SECURITY

## Facial recognition tool led to mistaken arrest, lawyer says

Facial recognition systems have faced criticism because of their mass surveillance capabilities and because some studies have shown that the technology is far more likely to misidentify Black and other people of color than white people.

# AI is built by people



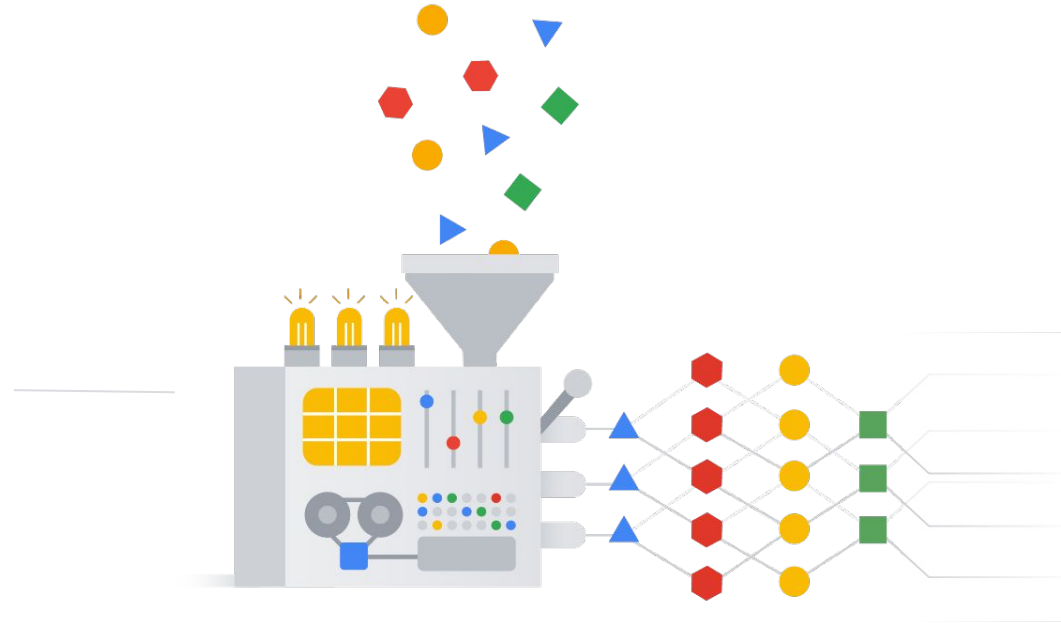
Collect data

Design

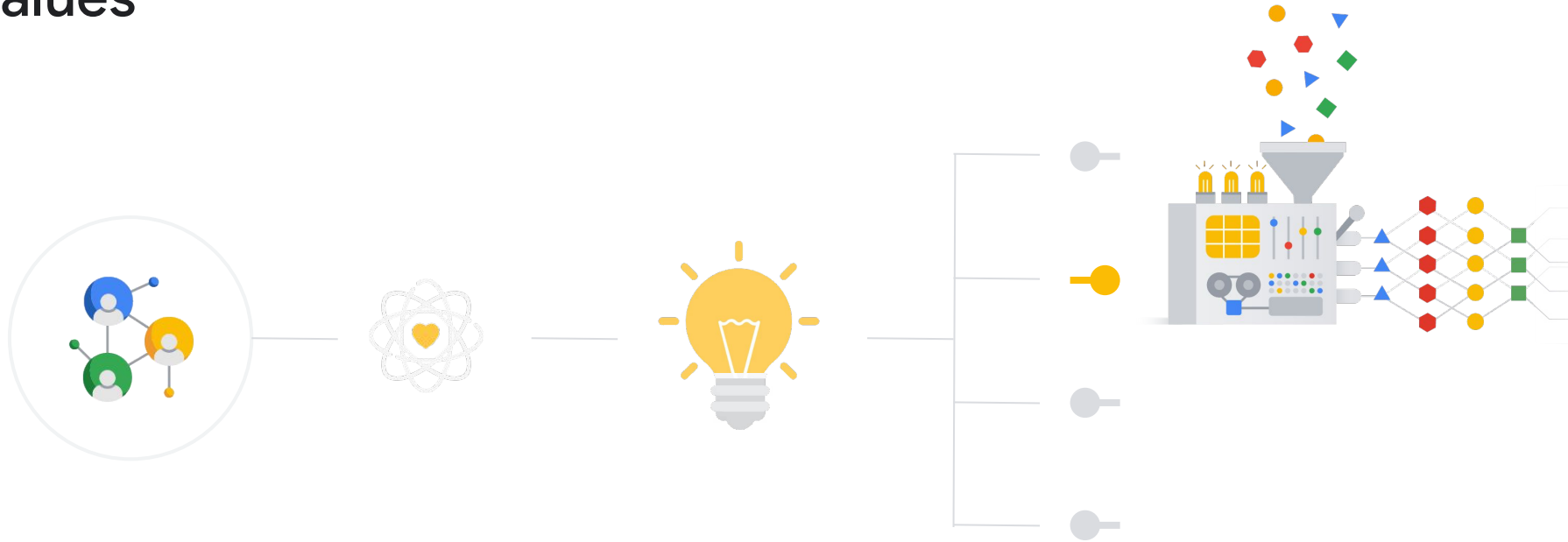
Build

Deploy

Apply



# People make decisions on their own values





# That's why you need Responsible AI

Every decision point requires **consideration** and **evaluation** to ensure that choices have been made **responsibly**

# What is **ethics** for AI?

Ethics  $\neq$  Law

Ethics  $\neq$  Policy

# What is **ethics** for AI?



What we **ought** to do

What others can **rightly** blame us for not doing

What sustains our flourishing **together** in human society.

# Focus on the outcomes, not intentions...



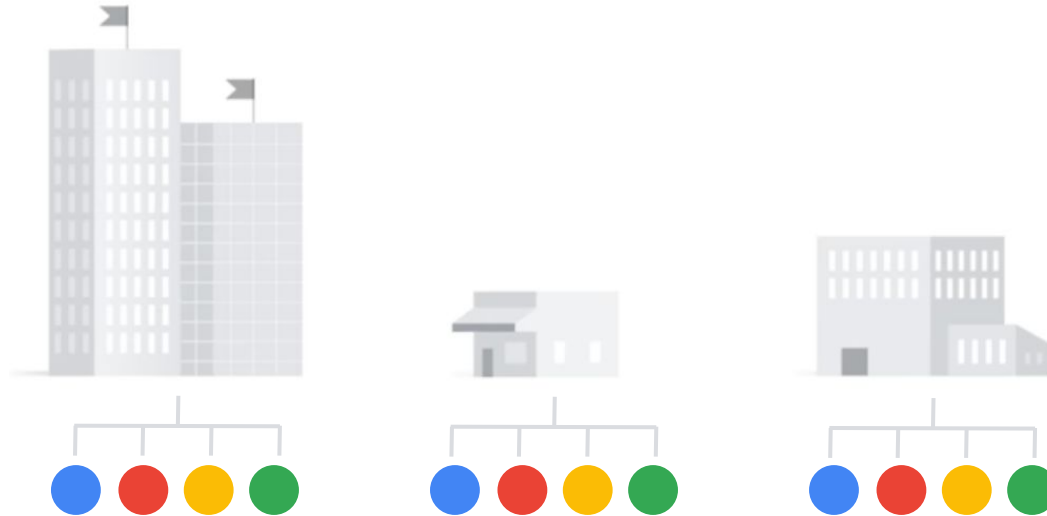
...to understand what Responsible AI is

**Responsible AI** is important because it's the right thing to do and it can guide AI design to be more beneficial for people's lives.

# Responsible AI is....?

**Responsible AI** requires an understanding of the possible issues, limitations, or unintended consequences.

# Organizations are developing their own AI principles



# Organizations are developing their own AI principles





# Values-based AI is good for your business

## Safer and more accountable products

---

Advanced technologies are most successful when everyone can benefit from them.

## Earn and keep your customers' trust

---

Irresponsible AI loses customers' trust, then customers. Responsible AI delights customers.

## A culture of responsible innovation

---

Ethics forms the foundation as you explore new, innovative ways to drive your mission forward.

# Topics

- |    |                          |
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| 01 | AI & Responsibility      |
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| 03 | Responsible AI Practices |



# Google commits that its AI applications are:

- ✓ Built for everyone
- ✓ Accountable and safe
- ✓ Respect privacy
- ✓ Driven by scientific excellence

# Google's AI Principles

7

objectives to follow

4

areas **not** to pursue

# Google's AI Principles



1. Be socially beneficial



2. Avoid creating or reinforcing unfair bias



3. Be built and tested for safety



4. Be accountable to people



5. Incorporate privacy design principles



6. Uphold high standards of scientific excellence



7. Be made available for uses that accord with these principles

# Google's AI Principles

1



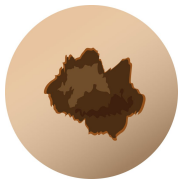
AI should:

**Be socially beneficial**

# Google's AI Principles

1

## Be socially beneficial



AI/ML models designed to **predict future development of melanomas** in patients



A recommendation engine to **suggest online skills training** for employees



A drone guidance system for **emergency aid airdrops** to disaster sites

# Google's AI Principles



2



AI should:

**Avoid creating or reinforcing unfair bias**



# Google's AI Principles

2

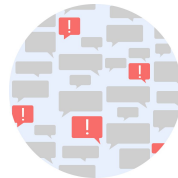
## Avoid creating or reinforcing unfair bias



Tech that makes or assists in  
**criminal justice decisions**



A hiring algorithm **ranks**  
**candidate application**  
relevance for recruiters



A machine learning-driven AI  
designed to **flag abusive,**  
**offensive, or hate speech**

# Google's AI Principles



3



AI should:

**Be built and tested for safety**

# Google's AI Principles

3

## Be built and tested for safety



An ML Model that explores new **strategies and efficiencies in city power grid**



An AI agent that routes calls in an **emergency dispatch system**



A new ML model that **predicts jet engine failure**

# Google's AI Principles



4



AI should:

**Be accountable to people**

# Google's AI Principles

4

## Be accountable to people



A recommendation system that makes fully automated decisions without consent, explanation, and right of appeal, such as **credit** and **insurance decisions**



An AI bot that **convincingly imitates a human agent**



A biometric ID system that is introduced **without a user's notice, consent, and ability to opt-out**

# Google's AI Principles



5



AI should:

**Incorporate privacy design principles**

# Google's AI Principles

5



## Incorporate privacy design principles



A 'smart' refrigerator that  
**learns user purchasing  
habits**



A geolocation app that  
**predicts local foot traffic  
patterns**



A therapy app that  
**processes records of  
psychological issues**

# Google's AI Principles

6



AI should:

**Uphold high standards of scientific excellence**



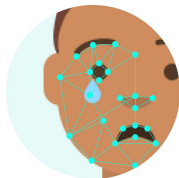
# Google's AI Principles

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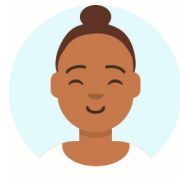
## Uphold high standards of scientific excellence



An AI/ML app for **emotion detection**



An AI/ML app that **detects signs of clinical depression**



An AI/ML tool that **advances deepfake detection**

# Google's AI Principles

7



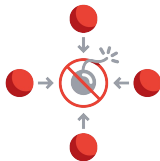
AI should:

**Be made available for uses that accord with  
these principles**

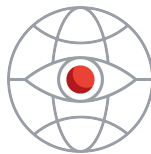
# Applications we will **not** pursue



likely to cause  
overall harm



technologies  
primarily intended  
to cause injury



surveillance  
violating  
internationally  
accepted norms



purpose  
contravenes  
international law  
and human rights

# Google's AI Principles



We will **not** pursue:

Technologies likely to cause overall harm

# Google's AI Principles



We will **not** pursue:

**Weapons or technologies primarily intended to  
cause or facilitate injury**

# Google's AI Principles



We will **not** pursue:

Surveillance technology that violates  
internationally accepted norms

# Google's AI Principles



We will **not** pursue:

Technologies whose purpose contravenes  
international law and human rights

# Google's AI Principles

## AI should:

- 1 Be socially beneficial
- 2 Avoid creating or reinforcing unfair bias
- 3 Be built and tested for safety
- 4 Be accountable to people
- 5 Incorporate privacy design principles
- 6 Uphold high standards of scientific excellence
- 7 Be made available for uses that accord with these principles

## We will not pursue:

- 1 Technologies likely to cause overall harm
- 2 Weapons or technologies primarily intended to cause or facilitate injury
- 3 Surveillance technology that violates internationally accepted norms
- 4 Technologies whose purpose contravenes international law and human rights



# Topics

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Responsible AI draws general best practices  
from **software and quality engineering**

# 6

ML-specific practices

# Responsible AI Practices



When you develop AI, you should:

**Use a human-centered design approach**

# Responsible AI Practices



## Use a human-centered design approach

---

Design features  
with appropriate  
disclosures built-in

---

Consider  
augmentation and  
assistance

---

Model potential  
adverse feedback  
early throughout

---

Engage with a  
diverse set of users  
and use-case  
scenarios

# Responsible AI Practices



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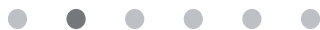
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# Responsible AI Practices



When you develop AI, you should:

**Identify multiple metrics to assess training  
and monitoring**

# Responsible AI Practices



## Identify multiple metrics to assess training and monitoring

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**Define metrics from user feedback, system performance, short-term and long-term product health, and performance across data slices**

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**Ensure that your metrics are appropriate for the context and goals of your system**

# Responsible AI Practices



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# Responsible AI Practices



When you develop AI, you should:

**Directly examine your raw data**

# Responsible AI Practices



3



## Directly examine your raw data

---

Data should  
be accurate

---

Data and  
data samples  
should be  
representative

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Training-  
serving skew  
shouldn't  
happen

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Data and  
model should  
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Features  
should be  
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Data should  
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# Responsible AI Practices



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# Responsible AI Practices



When you develop AI, you should:

**Understand the limitations of your  
dataset and model**

# Responsible AI Practices



## Understand the limitations of your dataset and model

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**Don't mistake correlation for causation**

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**Communicate the scope and coverage of the training set**

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**Communicate limitations to users where possible**

# Responsible AI Practices



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4



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# Responsible AI Practices



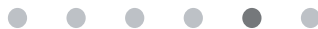
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Don't mistake correlation for causation

Communicate the scope and coverage of the training set

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# Responsible AI Practices



When you develop AI, you should:

**Test, Test, Test**

# Responsible AI Practices



## Test, Test, Test

**Conduct  
rigorous unit  
tests**

**Conduct  
integration  
tests**

**Detect input  
drift**

**Use a gold  
standard  
dataset**

**Conduct  
iterative  
user testing**

**Apply the  
quality  
engineering  
principle of  
poka-yoke**

# Responsible AI Practices

5



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*\* A poka-yoke (Japanese, "mistake-proofing" or "error prevention") is any mechanism in a process that helps an equipment operator avoid (yokeru) mistakes (poka) and defects by preventing, correcting, or drawing attention to human errors as they occur.*

# Responsible AI Practices



When you develop AI, you should:

**Continue to monitor and update the  
system after deployment**

# Responsible AI Practices



## Continue to monitor and update the system after deployment

---

**Be ready for issues to occur**

---

**Consider both short- and long-term solutions to issues**

---

**Analyze the candidate model before deployment**

# Responsible AI Practices



## Continue to monitor and update the system after deployment

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**Analyze the candidate model before deployment**

# Responsible AI Practices

## When you develop AI, you should:

- 1 Use a human-centered design approach
- 2 Identify multiple metrics to assess training and monitoring
- 3 When possible, directly examine your raw data
- 4 Understand the limitations of your dataset and model
- 5 Test, Test, Test
- 6 Continue to monitor and update the system after deployment

Let's recap...





# In this module, you learned to ...

01

Responsible AI is the **right to do**, and it can guide AI to be more **beneficial** for people's lives

02

Google AI Principles strive towards AI that is **built for everyone**, **accountable and safe**, **respects privacy**, and is **driven by scientific excellence**

03

Responsible AI practices are applied **throughout the lifecycle**, and as early as possible

04

Responsible AI requires **governance processes**, a culture of **transparency** and **support**, and **continuous conversations**



## Quiz question (1/4)

Which of the below is one of Google's 7 AI principles?

**A:** AI should create unfair bias.

**B:** AI should uphold high standards of operational excellence.

**C:** AI should uphold high standards of scientific excellence.

**D:** AI should gather or use information for surveillance.

## Quiz question (1/4)

Which of the below is one of Google's 7 AI principles?

**A:** AI should create unfair bias.

**B:** AI should uphold high standards of operational excellence.

**C:** AI should uphold high standards of scientific excellence.

**D:** AI should gather or use information for surveillance.

## Quiz question (2/4)

Which of these is correct with regard to applying responsible AI practices?

- A:** Decisions made at all stages in a project make an impact on responsible AI.
- B:** Decisions made at an early stage in a project do not make an impact on responsible AI.
- C:** Decisions made at a late stage in a project do not make an impact on responsible AI.
- D:** Only decisions made by the project owner at any stage in a project make an impact on responsible AI.

## Quiz question (2/4)

Which of these is correct with regard to applying responsible AI practices?

**A:** Decisions made at all stages in a project make an impact on responsible AI.

**B:** Decisions made at an early stage in a project do not make an impact on responsible AI.

**C:** Decisions made at a late stage in a project do not make an impact on responsible AI.

**D:** Only decisions made by the project owner at any stage in a project make an impact on responsible AI.

## Quiz question (3/4)

Organizations are developing their own AI principles that reflect their mission and values. What are the common themes among these principles?

- A:** A consistent set of ideas about transparency, fairness, and equity.
- B:** A consistent set of ideas about transparency, fairness, accountability, and privacy.
- C:** A consistent set of ideas about transparency, fairness, and diversity.
- D:** A consistent set of ideas about fairness, accountability, and inclusion.

## Quiz question (3/4)

Organizations are developing their own AI principles that reflect their mission and values. What are the common themes among these principles?

**A:** A consistent set of ideas about transparency, fairness, and equity.

**B:** A consistent set of ideas about transparency, fairness, accountability, and privacy.

**C:** A consistent set of ideas about transparency, fairness, and diversity.

**D:** A consistent set of ideas about fairness, accountability, and inclusion.

## Quiz question (4/4)

Why is responsible AI practice important to an organization?

- A:** Responsible AI practice can help drive revenue.
- B:** Responsible AI practice can help improve operational efficiency.
- C:** Responsible AI practice can help build trust with customers and stakeholders.
- D:** Responsible AI practice can improve communication efficiency.



## Quiz question (4/4)

Why is responsible AI practice important to an organization?

**A:** Responsible AI practice can help drive revenue.

**B:** Responsible AI practice can help improve operational efficiency.

**C:** Responsible AI practice can help build trust with customers and stakeholders.

**D:** Responsible AI practice can improve communication efficiency.



# Appendix

# In this module, you learn to ...

- 01 Identify the need for Responsible AI
- 02 Recognize that decisions made at all stages of a project have an impact on Responsible AI
- 03 Understand Google's AI Principles
- 04 Explore Responsible AI practices
- 05 Discover hands-on pro tips for Responsible AI

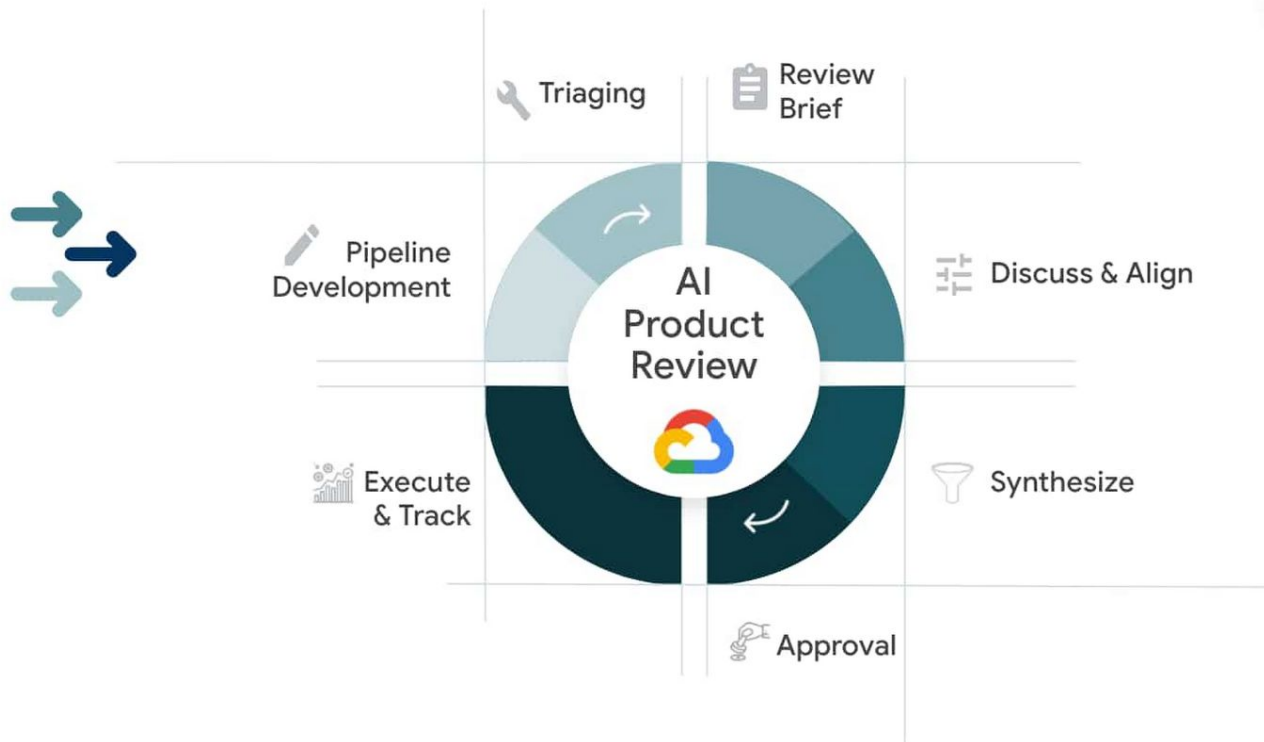


# Topics

01	AI & Responsibility
02	Google's AI Principles
03	Responsible AI Practices
04	Responsible AI Pro Tips

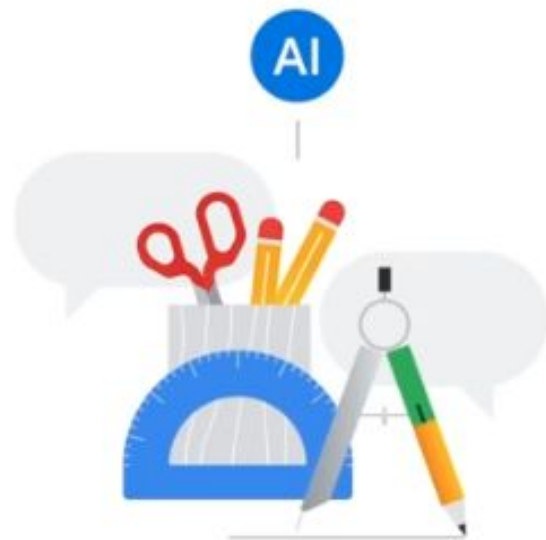


# Decisions around AI are made through a series of assessments and reviews



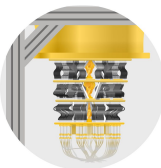
# When assessing an application or a product, factors to consider are:

- Primary purpose and use
- Nature and Uniqueness
- Scale
- Nature of involvement
- ...and more!



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- Primary purpose and use
- Nature and Uniqueness
- Scale
- Nature of involvement
- ...and more!



A **quantum computing breakthrough that accelerates AI** may require special evaluation because of its scale and its nature and uniqueness.



A custom ML model built for a **government customer** might require special evaluation because of the nature of Google's involvement and the technology's primary purpose and use.



**Federated learning** that advances privacy



## After assessing an application or a product, mitigation strategies may be:

- Narrow the scope of the product
- Create educational materials
- Define and release best practices
- Implement policy or terms of service
- Don't move forward with the product
- ...and more!



## Early in the development process, two diverse bodies provide their review



The review processes instill **rigor** and **consistency** in our approach across product areas and geographies.

# Reviews succeed in an environment of free discussion and psychological safety



Not everyone will agree with every decision made on how products should be designed responsibly.



AI Principles rarely give us direct answers to our questions on how to build our products.

# What should you keep in mind when developing Responsible AI practices?

Pro Tip #1:

No ethics checklist.



# What should you keep in mind when developing Responsible AI practices?

Pro Tip #2:

Responsibility by design.



# What should you keep in mind when developing Responsible AI practices?

Pro Tip #3:

Diversity of input.



# What should you keep in mind when developing Responsible AI practices?

Pro Tip #4:

A culture of support.



# What should you keep in mind when developing Responsible AI practices?

Pro Tip #5:

Transparency.





# What should you keep in mind when developing Responsible AI practices?

Pro Tip #6:

A humble approach.



# What should you keep in mind when developing Responsible AI practices?

## Pro Tip #7:

The work is not (easily) measurable.



# Responsible AI Pro Tips

## When you apply Responsible AI, remember:

- #1 No ethics checklist.
- #2 Responsibility by design.
- #3 Diversity of input.
- #4 A culture of support.
- #5 Transparency.
- #6 A humble approach.
- #7 The work is not (easily) measurable.