

For your preregistration consideration:

CMPU 250 Data and Its Discontents

CMPU 101 Problem-Solving and Abstraction

In this class, we've been building the skills to download data from anywhere, load it into a notebook, analyze it, and make predictions.

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Background: Ethical frameworks

Two ethical frameworks to consider:

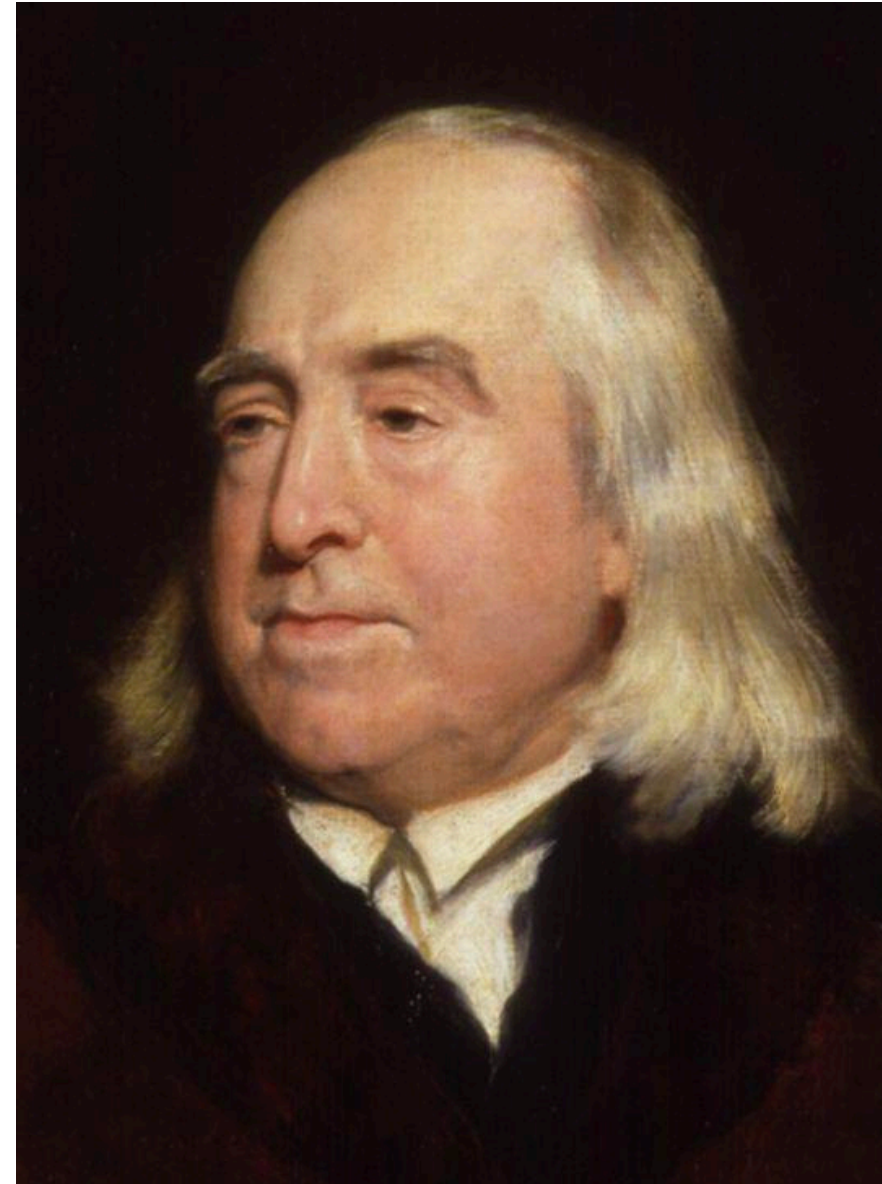
Consequentialism

focus on the ends

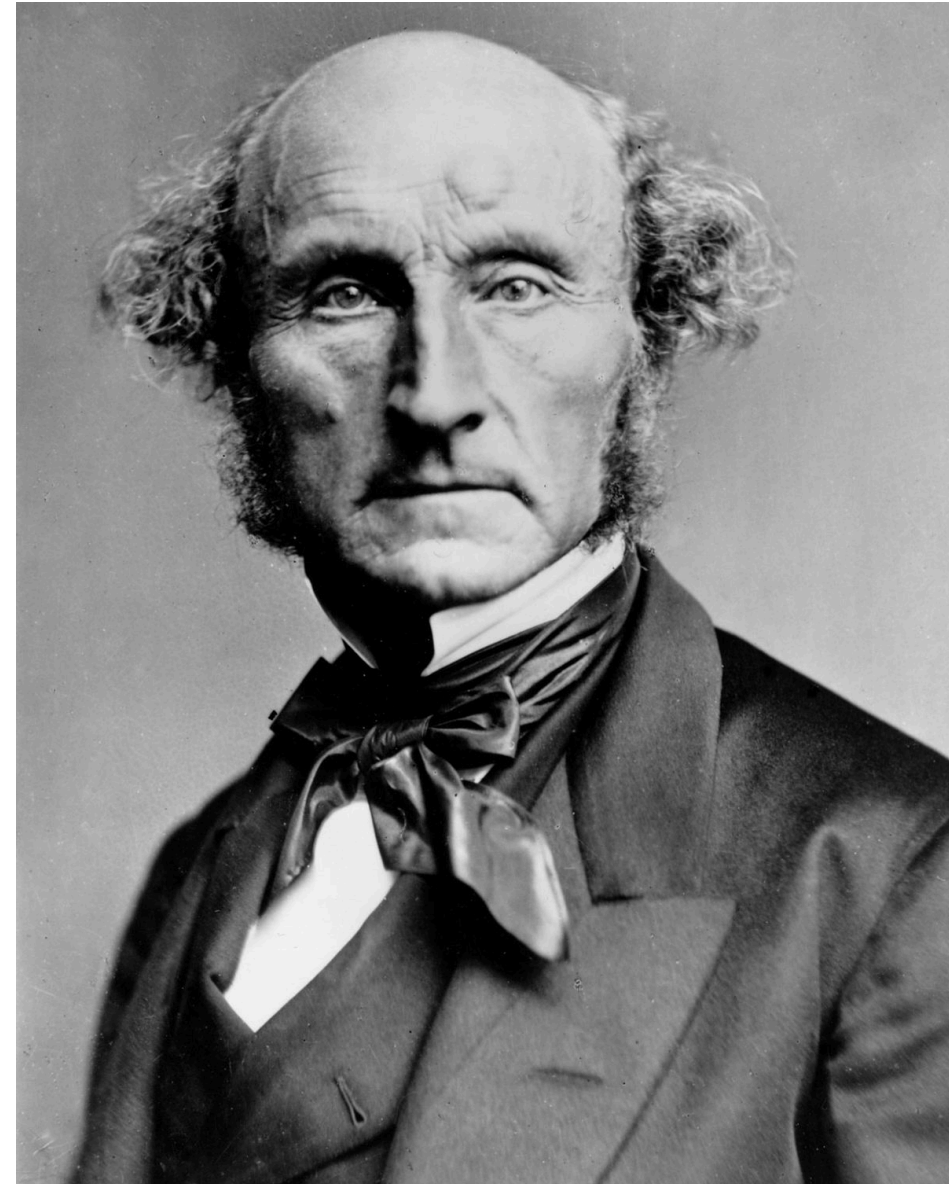
Deontology

focus on the means

Consequentialism



Jeremy Bentham



John Stuart Mill

Balance sheet

<i>Harms</i>	<i>Benefits</i>
...	...
...	...
...	...
...	...

Deontology



Immanuel Kant

Focus on ethical duties
(rules), independent of
their consequences

Example: Informed consent

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Consequentialism

It helps to prevent harm to participants by prohibiting research that does not properly balance risk and anticipated benefit.

In other words, consequentialist thinking would support informed consent because it helps prevent bad outcomes for participants.

Example: Informed consent

Consequentialism

It helps to prevent harm to participants by prohibiting research that does not properly balance risk and anticipated benefit.

In other words, consequentialist thinking would support informed consent because it helps prevent bad outcomes for participants.

Deontology

A researcher has a duty to respect the autonomy of her participants.

A pure consequentialist might be willing to waive the requirement for informed consent in a setting where there was no risk, whereas a pure deontologist might not.

Frameworks taken to the extremes

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Extreme consequentialism

Consequentialist doctor kills one patient and harvests their organs to prolong the lives of four other patients

Frameworks taken to the extremes

Extreme consequentialism

Consequentialist doctor kills one patient and harvests their organs to prolong the lives of four other patients

Extreme deontology

A police officer captures a terrorist who knows the location of a bomb that will kill millions of people, but, being a deontologist, will not lie in order to trick the terrorist into revealing the bomb's location.

Background: Dual-use technology



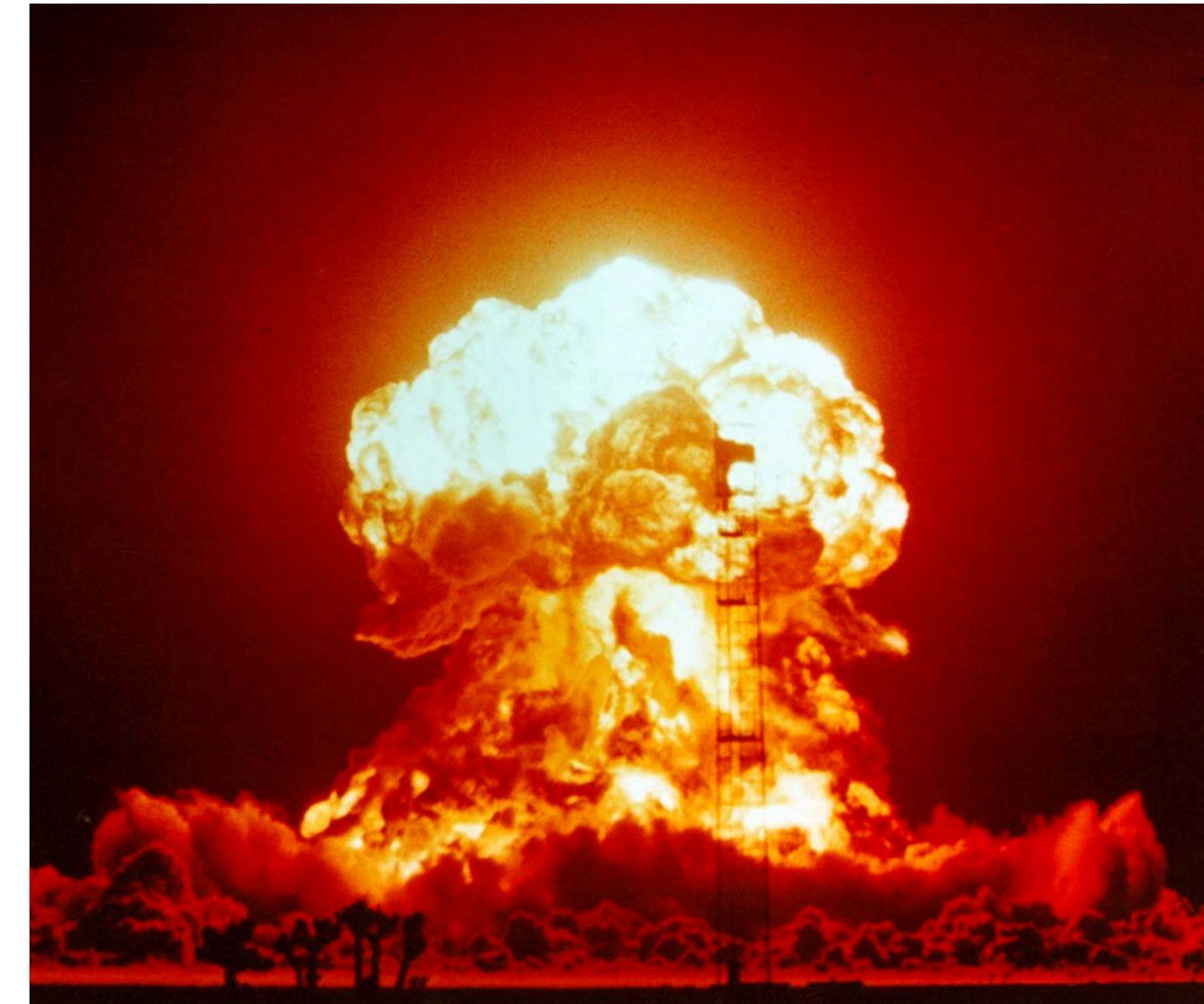
“Your scientists were so preoccupied with whether or not they *could* that they didn’t stop to think if they *should*.”

Dual use: the same technology can be used for societal benefit – or for harm.

Example: Nuclear technology

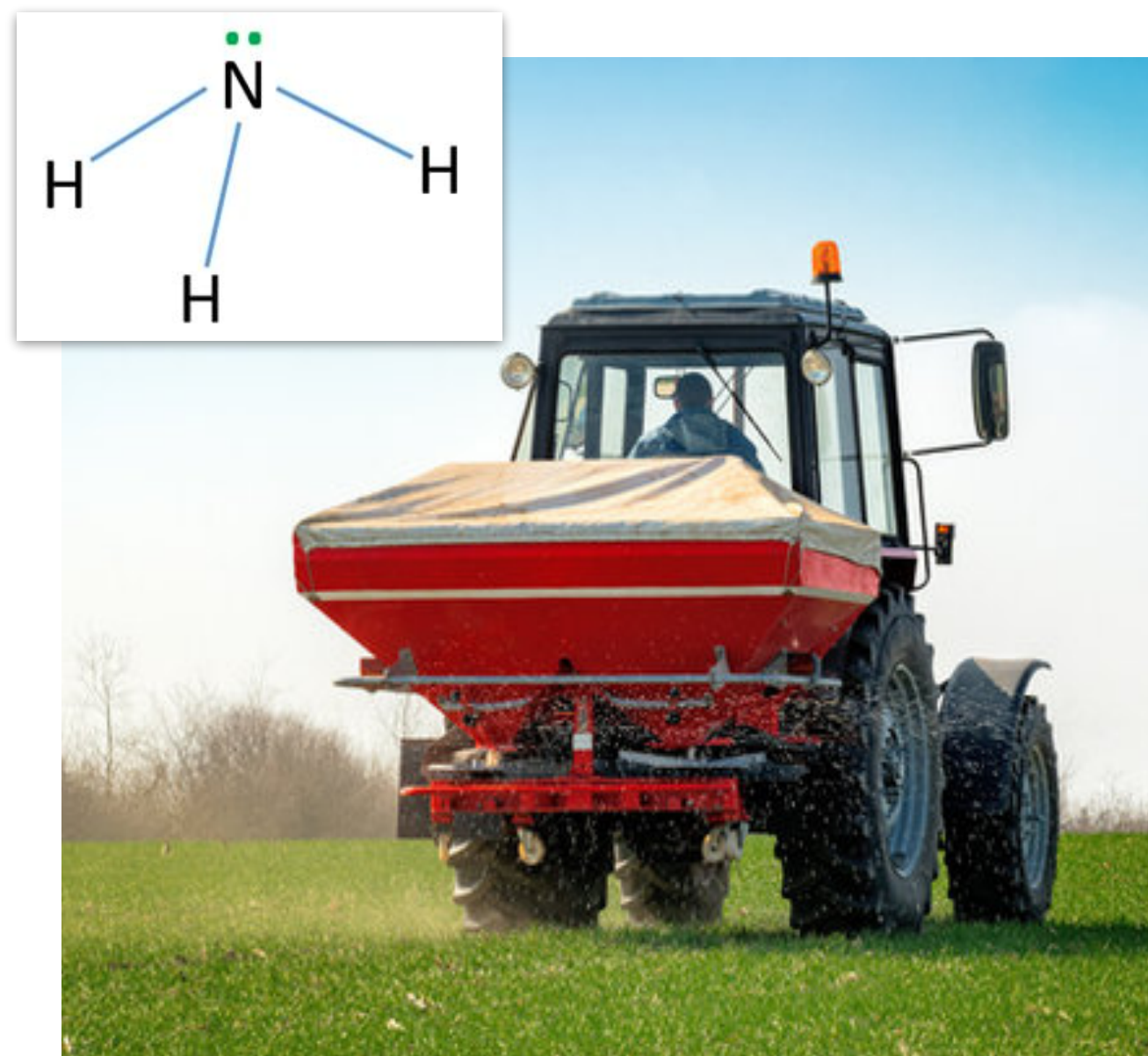


Clean energy

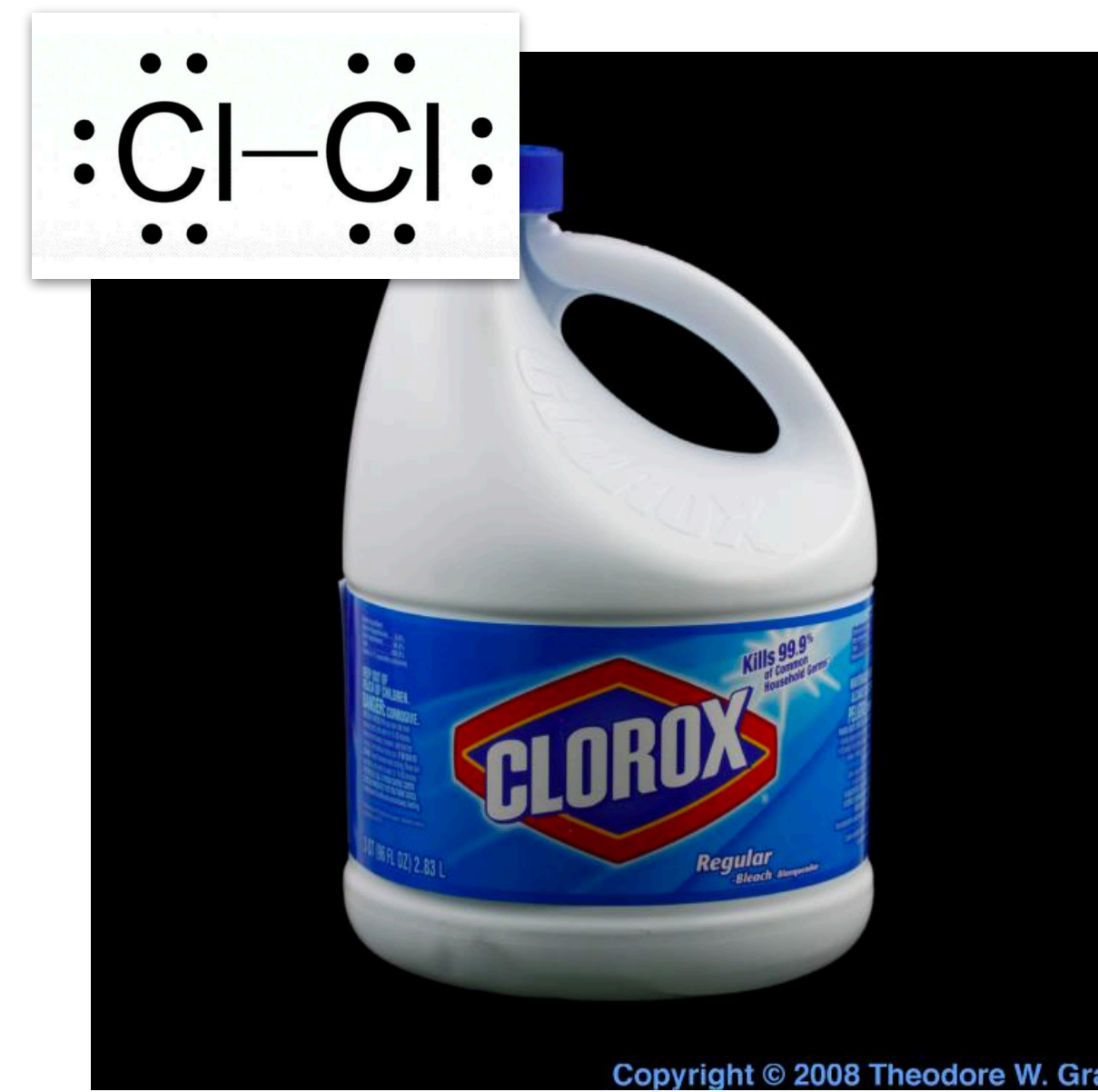


Weapons

Example: Chemical isolation

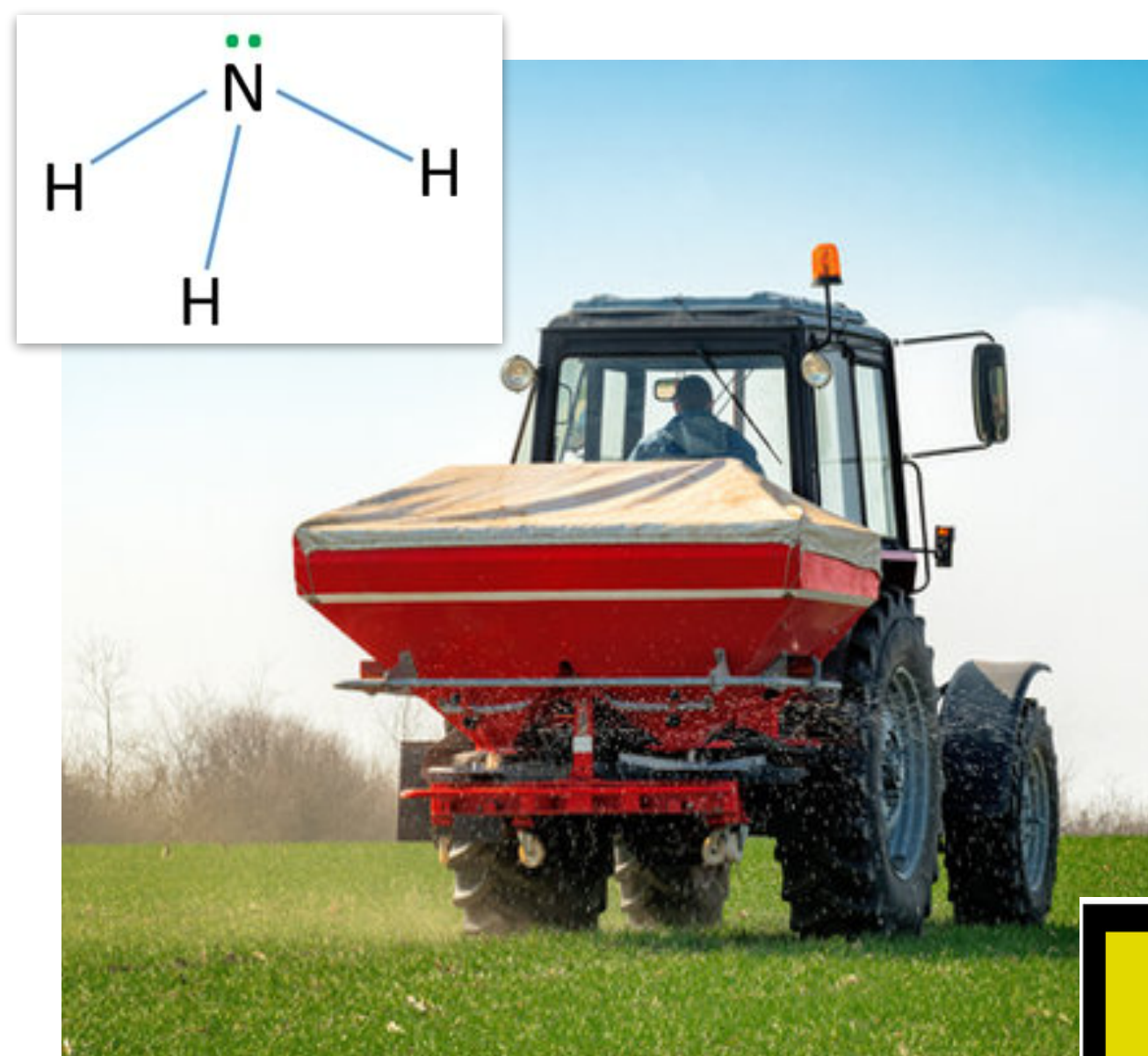


Ammonia

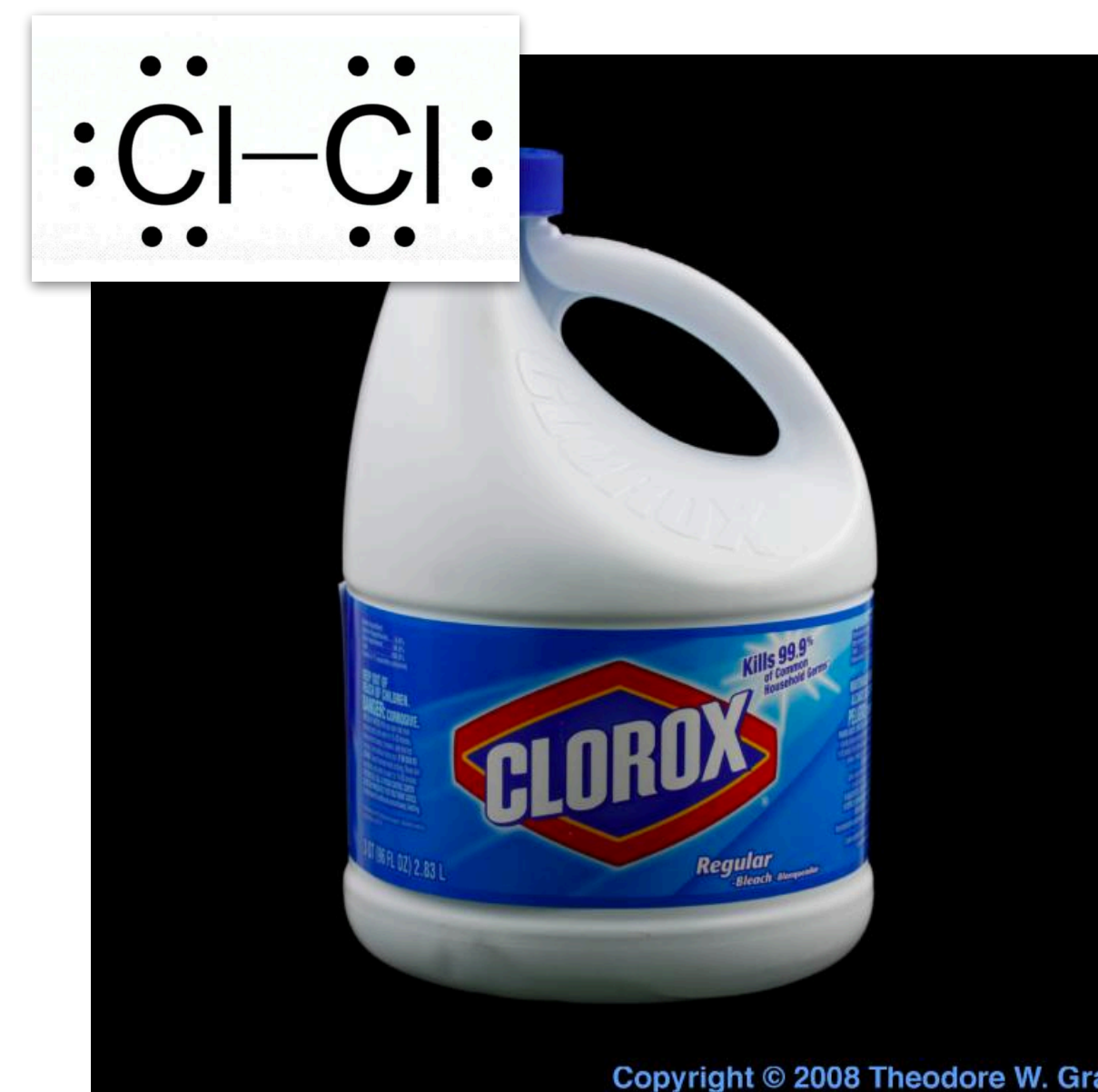


Chlorine

Example: Chemical isolation



Ammonia



Chlorine



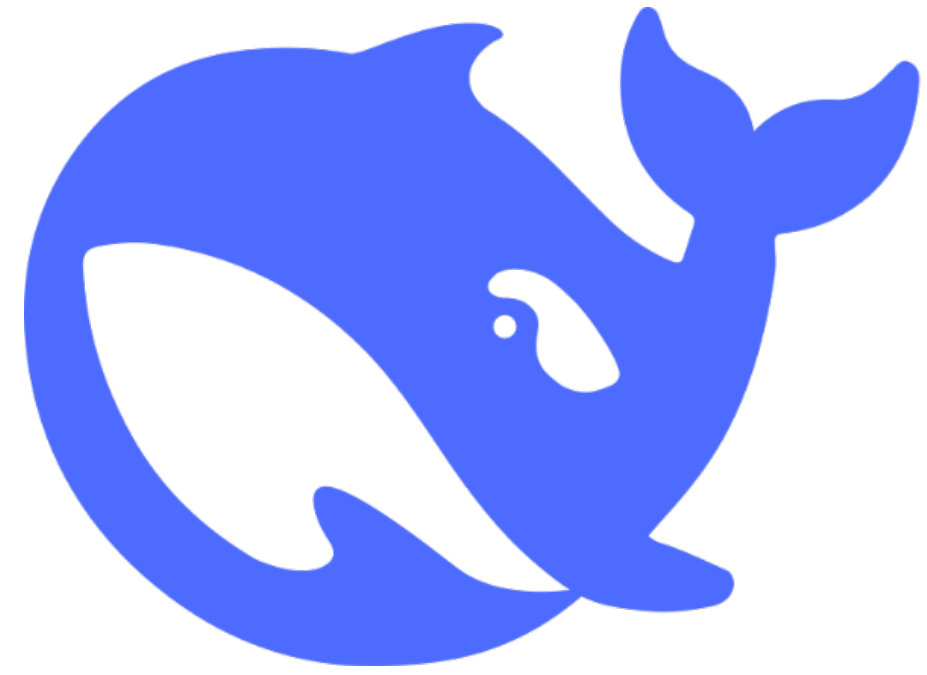
Ethical challenge: The researcher may intend no harm – only good – but they must consider the potential actions of others with the same technology.

Can you think of other concrete examples of research or technology with dual-use concerns?

The path to large language models



Claude



deepseek



Gemini

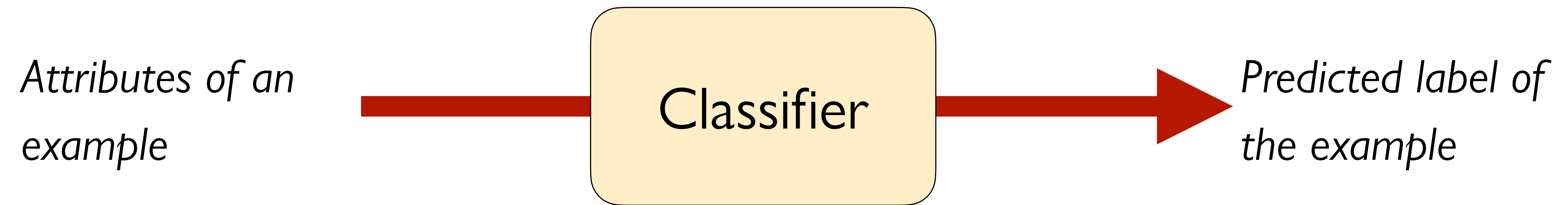


Grok

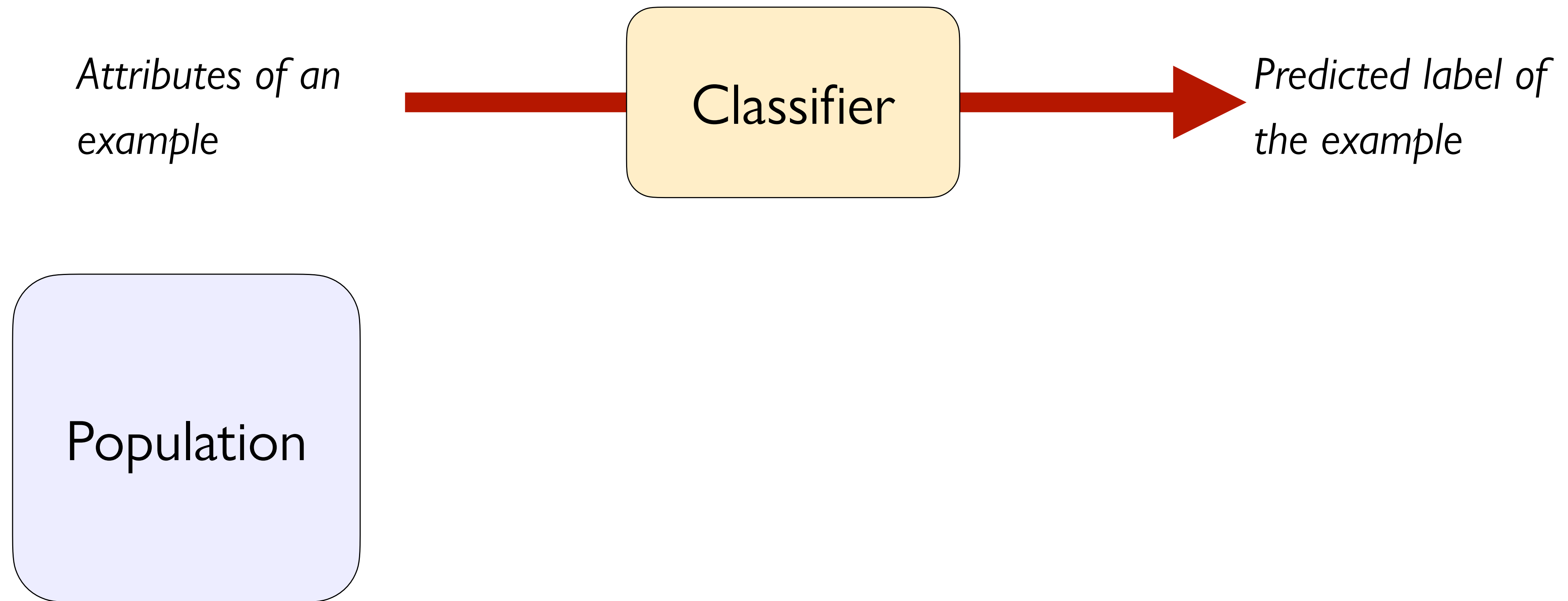
Predicting the next word is a multi-class *classification* problem (i.e., one where you have more than just two labels).

Each word (token) is a label.

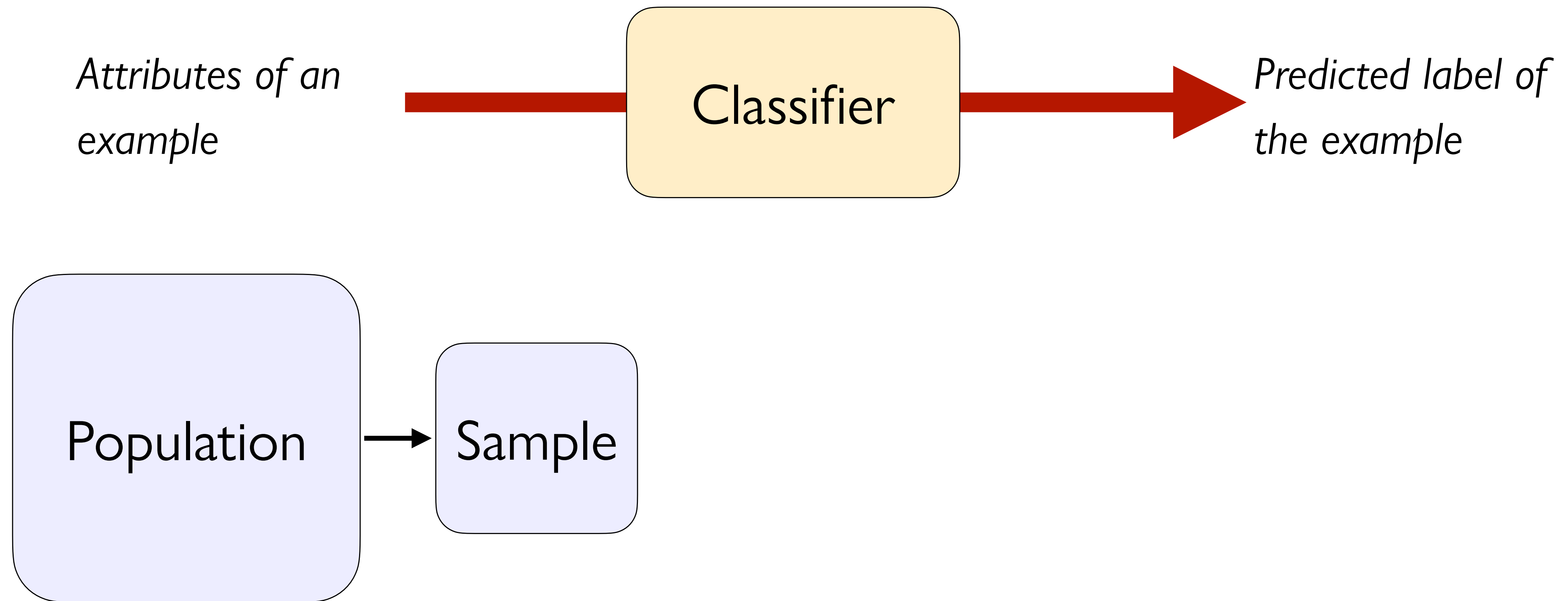
Training a classifier



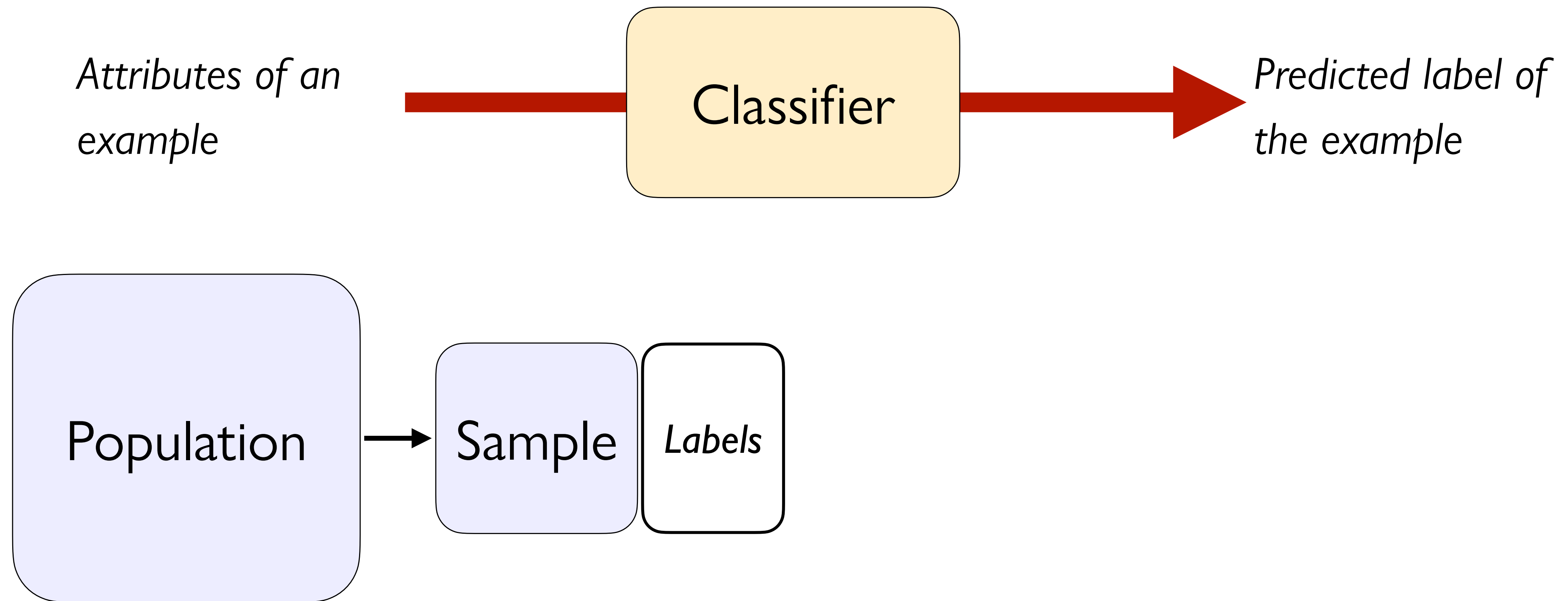
Training a classifier



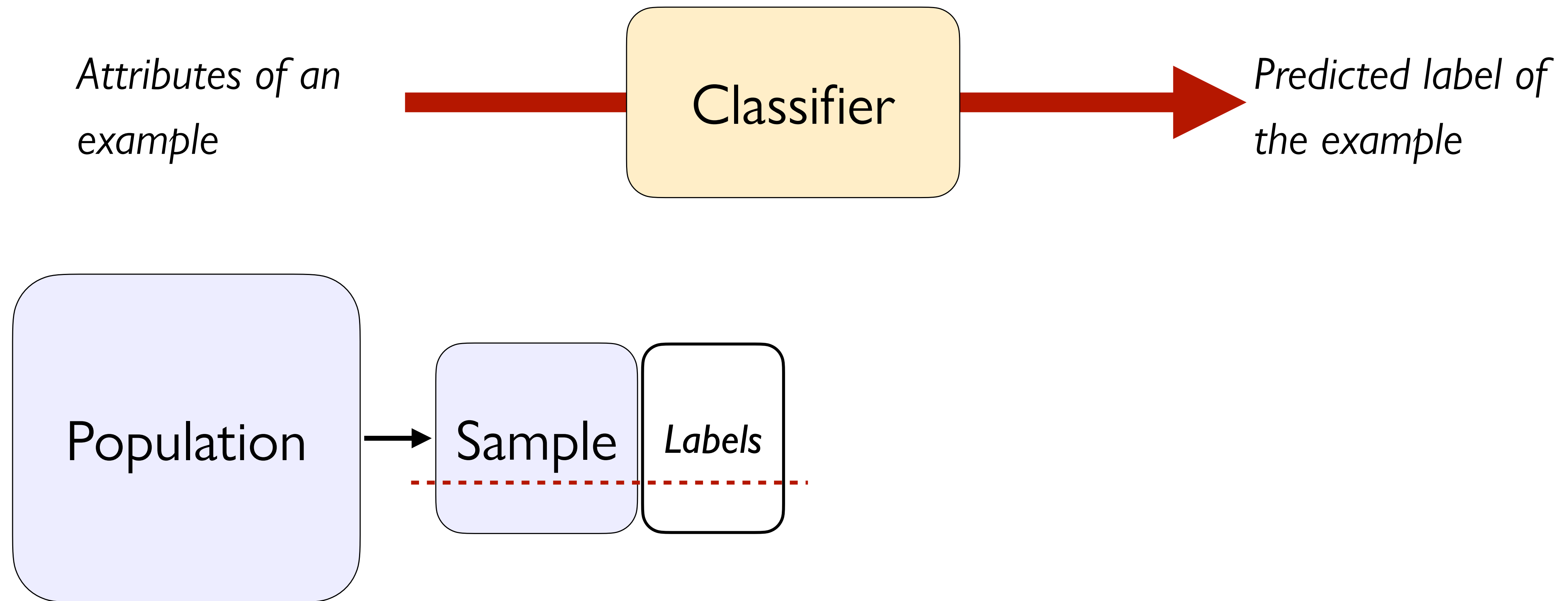
Training a classifier



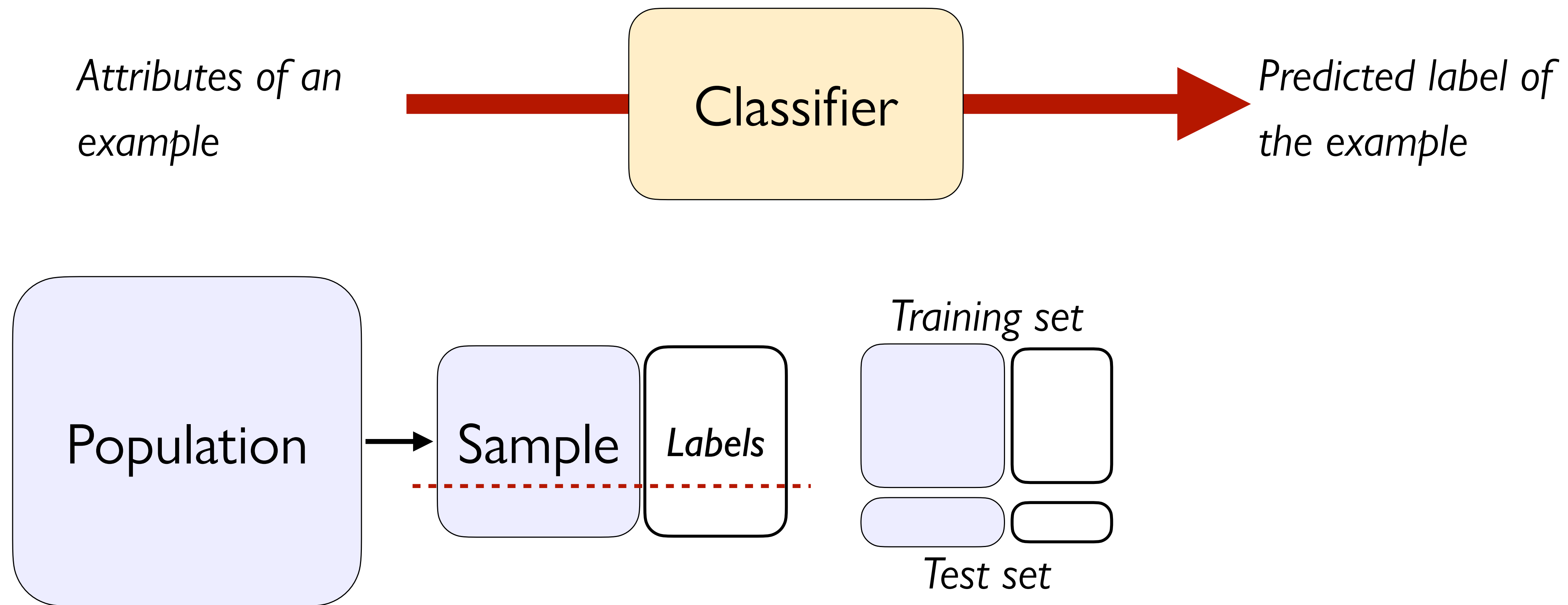
Training a classifier



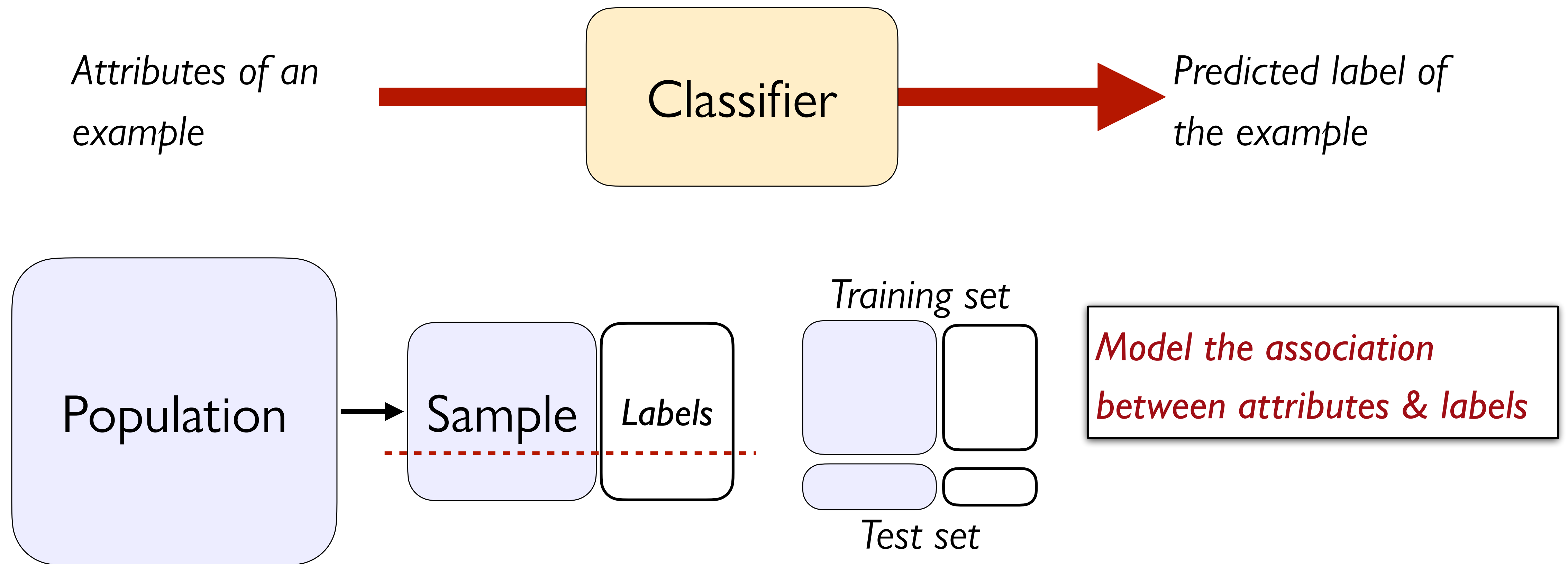
Training a classifier



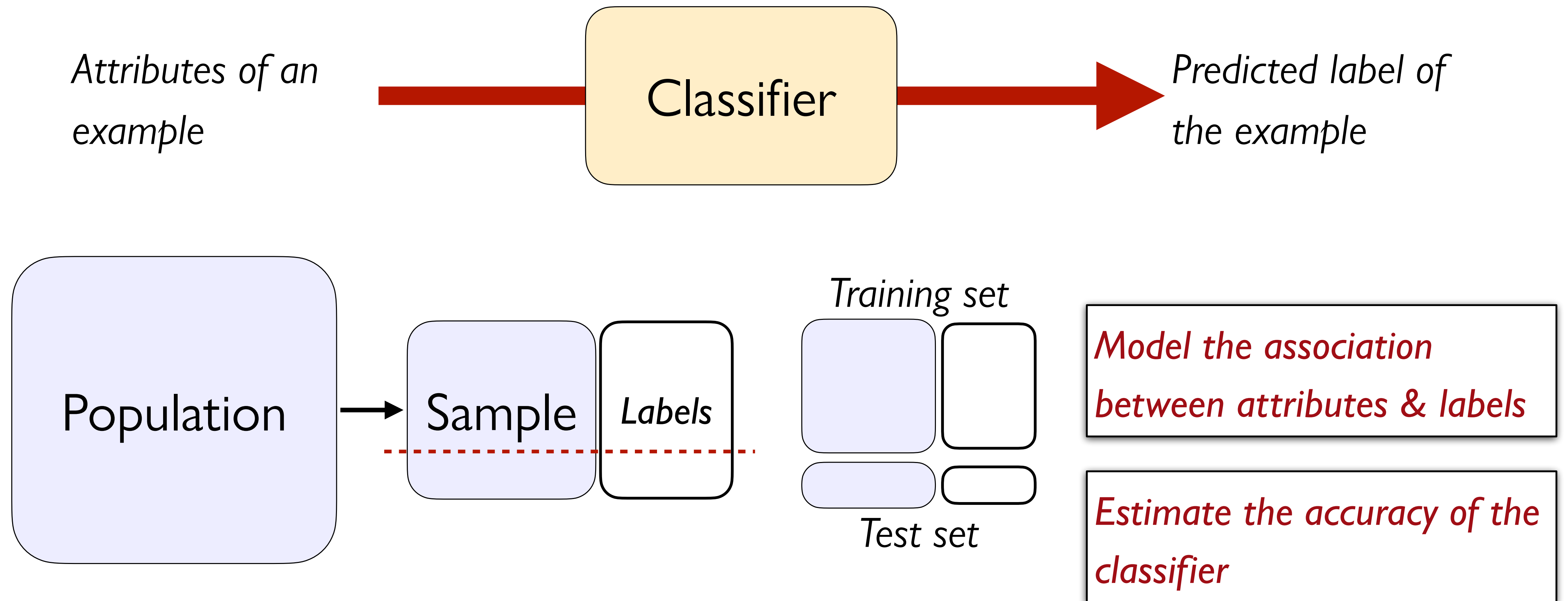
Training a classifier



Training a classifier



Training a classifier



Notebook: *Text generation with simulation* (last class)

Preview: Assignment 9

Case study: Large language models



ChatGPT 5.1 >



Recite Asimov's first law.



5.1



Recite Asimov's first law.

A robot may not injure a human being, or through inaction allow a human being to come to harm.

📄 🔊 👍 🗨️ ↻

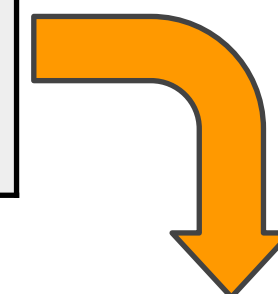
Ask anything

+ 🌐 🗣️ 📄 5.1

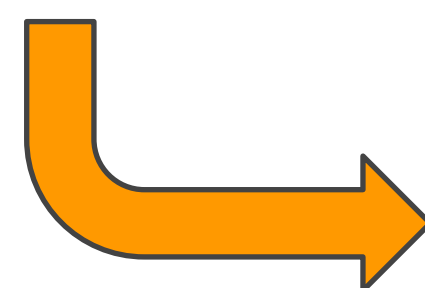
🔴 🔊 🎙️

*User's
Prompt*

Recite	Asimov's	first	law	.
--------	----------	-------	-----	---



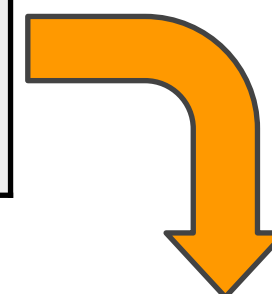
ChatGPT



*Generated
Text*

*User's
Prompt*

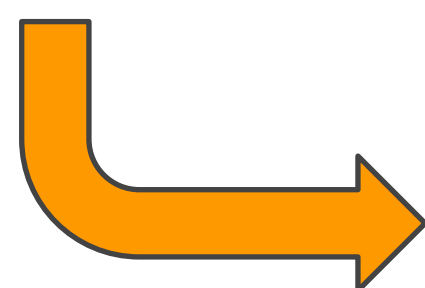
Recite	Asimov's	first	law	.
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ChatGPT

Previous Words

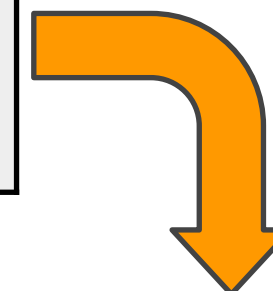
Recite	Asimov's	first	law	.
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*Generated
Text*

User's Prompt

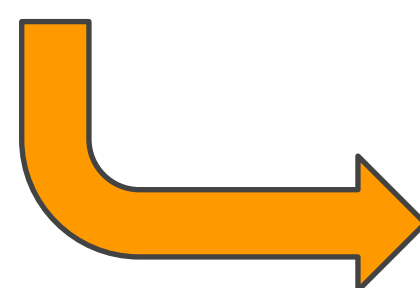
Recite	Asimov's	first	law	.
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ChatGPT

Previous Words

Recite	Asimov's	first	law	.
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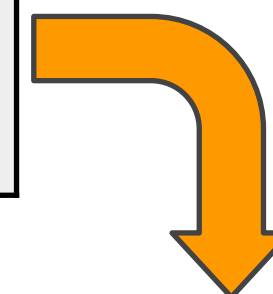


Generated Text

A

User's Prompt

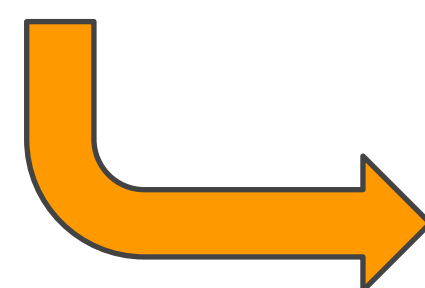
Recite	Asimov's	first	law	.
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ChatGPT

Previous Words

Recite	Asimov's	first	law	.	A
--------	----------	-------	-----	---	---

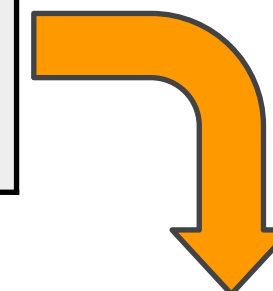


Generated Text

A

User's Prompt

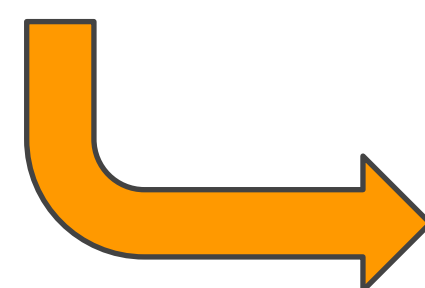
Recite	Asimov's	first	law	.
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ChatGPT

Previous Words

Recite	Asimov's	first	law	.	A
--------	----------	-------	-----	---	---

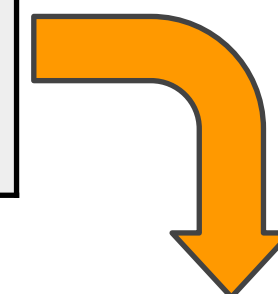


Generated Text

A	robot
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User's Prompt

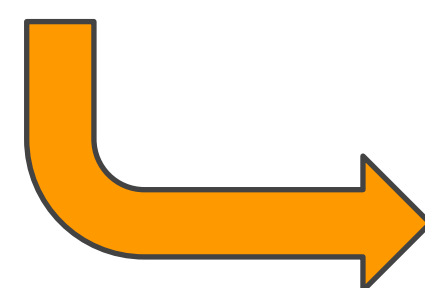
Recite	Asimov's	first	law	.
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ChatGPT

Previous Words

Recite	Asimov's	first	law	.	A	robot
--------	----------	-------	-----	---	---	-------

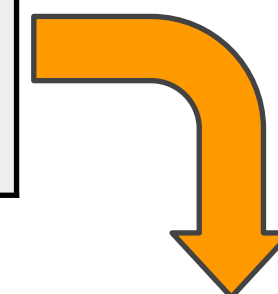


Generated Text

A	robot
---	-------

User's Prompt

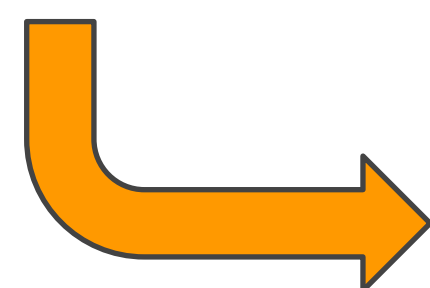
Recite	Asimov's	first	law	.
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ChatGPT

Previous Words

Recite	Asimov's	first	law	.	A	robot
--------	----------	-------	-----	---	---	-------

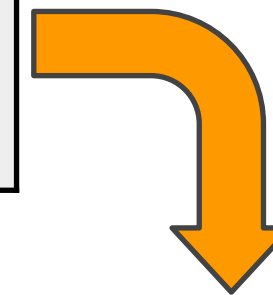


Generated Text

A	robot	must
---	-------	------

User's Prompt

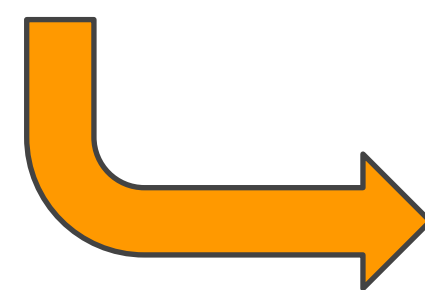
Recite	Asimov's	first	law	.
--------	----------	-------	-----	---



ChatGPT

Previous Words

Recite	Asimov's	first	law	.	A	robot	must
--------	----------	-------	-----	---	---	-------	------

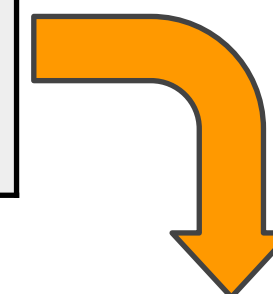


Generated Text

A	robot	must
---	-------	------

User's Prompt

Recite	Asimov's	first	law	.
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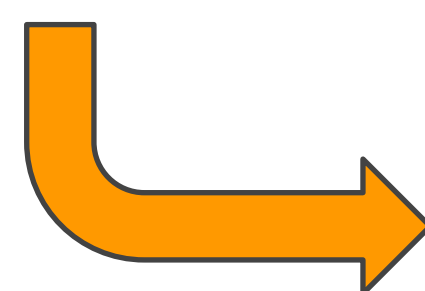


ChatGPT

Previous Words

Recite	Asimov's	first	law	.	A	robot	must
--------	----------	-------	-----	---	---	-------	------

<i>Next</i>	<i>Prediction</i>
not	0.81
fulfill	0.13
adhere	0.02
...	...

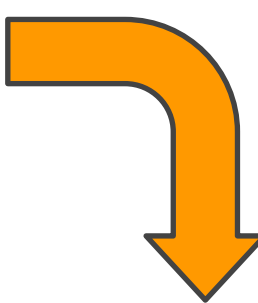


Generated Text

A	robot	must
---	-------	------

User's Prompt

Recite Asimov's first law .



$P(\text{next word} \mid \text{previous words})$
Where does this come from?

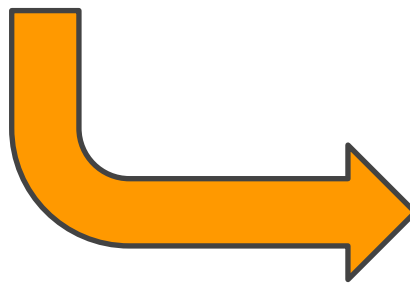


ChatGPT

Previous Words

Recite Asimov's first law . A robot must

Next	Prediction
not	0.81
fulfill	0.13
adhere	0.02
...	...



Generated Text

A robot must not

sample



Data
from the Internet

The New York Times



Google Patents



WIKIPEDIA
The Free Encyclopedia

Data
from the Internet

The New York Times



Google Patents

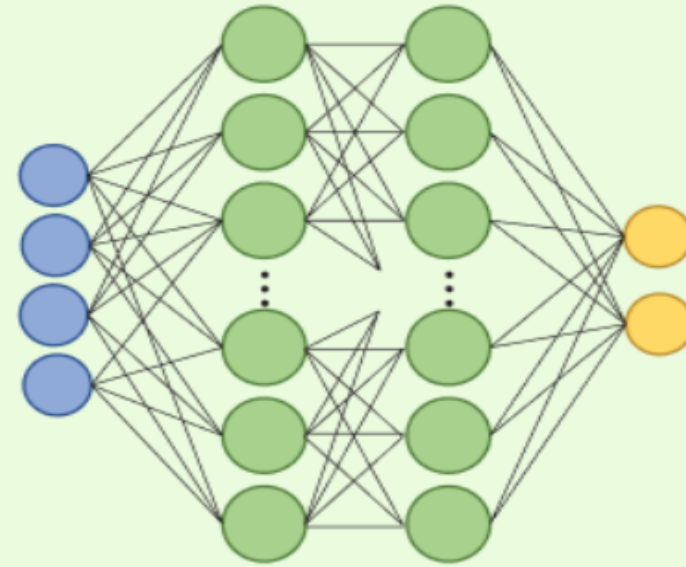


WIKIPEDIA
The Free Encyclopedia



Optimize

$P(\text{next word} \mid \text{previous words})$



*Gradient descent on non-linear
function with billions of parameters*

Data from the Internet

The New York Times



Google Patents

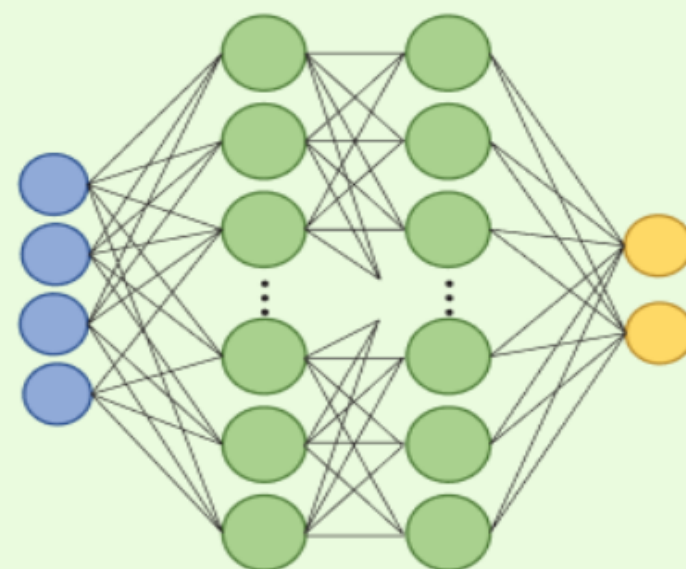


WIKIPEDIA
The Free Encyclopedia



Optimize

$P(\text{next word} \mid \text{previous words})$



Gradient descent on non-linear
function with billions of parameters



Loss function: Increases if incorrect
prediction for a masked word

We use *python* to analyze our
data and make visualizations

The *python* slithered silently
through the jungle underbrush

Sum for billions of masked words

Data
from the Internet

The New York Times



Google Patents

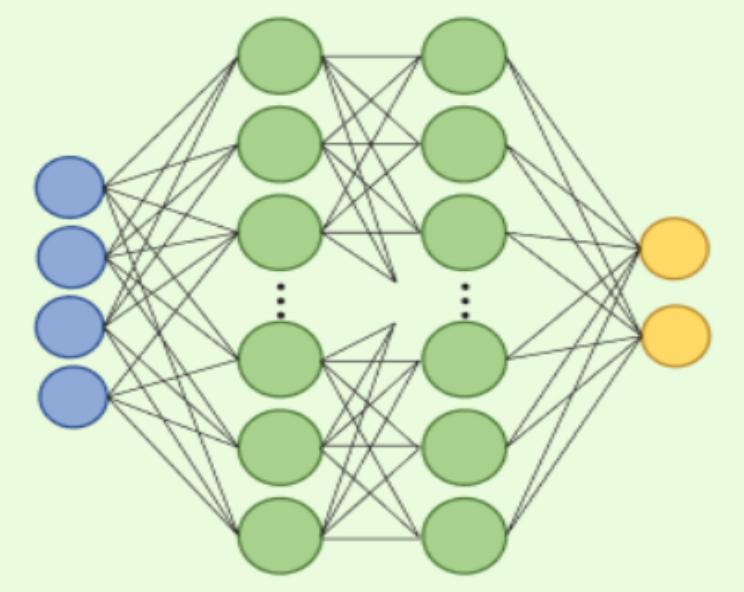


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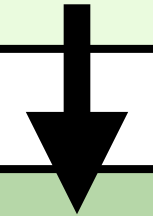


Optimize

$$P(\text{next word} \mid \text{previous words})$$



*Gradient descent on non-linear
function with billions of parameters*



Loss function: *Increases if incorrect
prediction for a masked word*

We use _____ to analyze our
data and make visualizations

The _____ slithered silently
through the jungle underbrush

Sum for billions of masked words

Data from the Internet

The New York Times



Google Patents

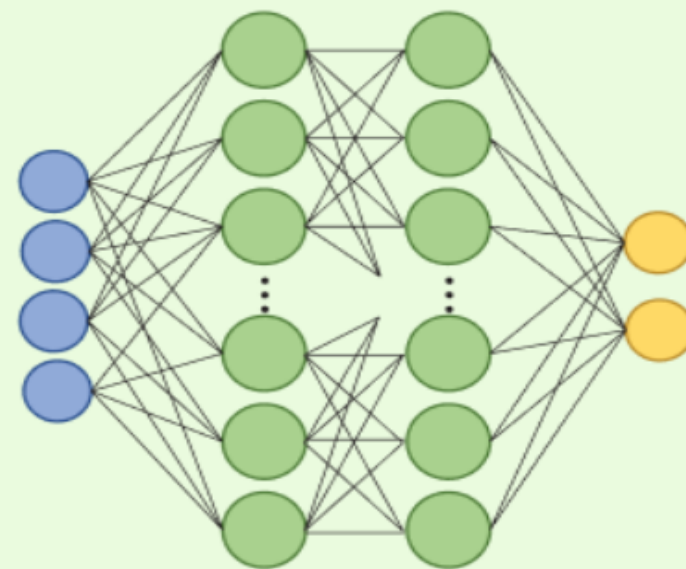


WIKIPEDIA
The Free Encyclopedia



Optimize

$P(\text{next word} \mid \text{previous words})$



Gradient descent on non-linear
function with billions of parameters



Loss function: Increases if incorrect
prediction for a masked word

We use *python* to analyze our
data and make visualizations

The *camels* slithered silently
through the jungle underbrush

Sum for billions of masked words

Data
from the Internet

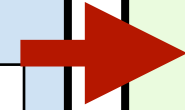
The New York Times



Google Patents

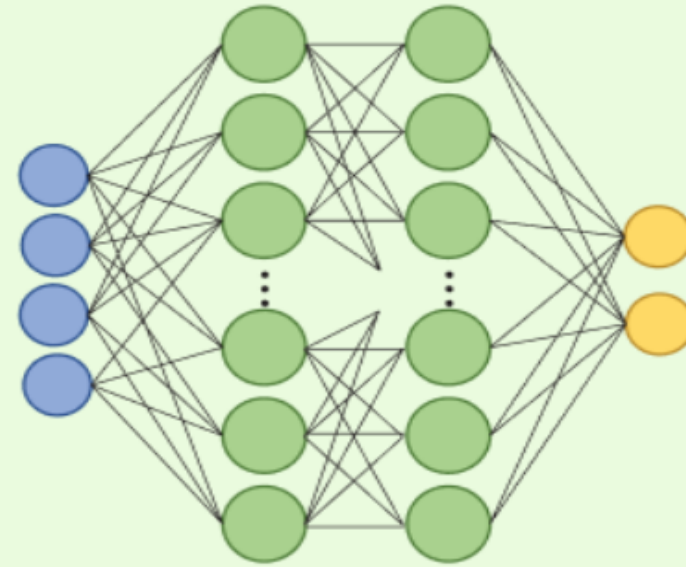


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The Free Encyclopedia

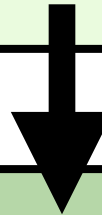


Optimize

$$P(\text{next word} \mid \text{previous words})$$



*Gradient descent on non-linear
function with billions of parameters*



Loss function: *Increases if incorrect
prediction for a masked word*

We use *python* to analyze our
data and make visualizations

The *python* slithered silently
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Sum for billions of masked words

Data
from the Internet

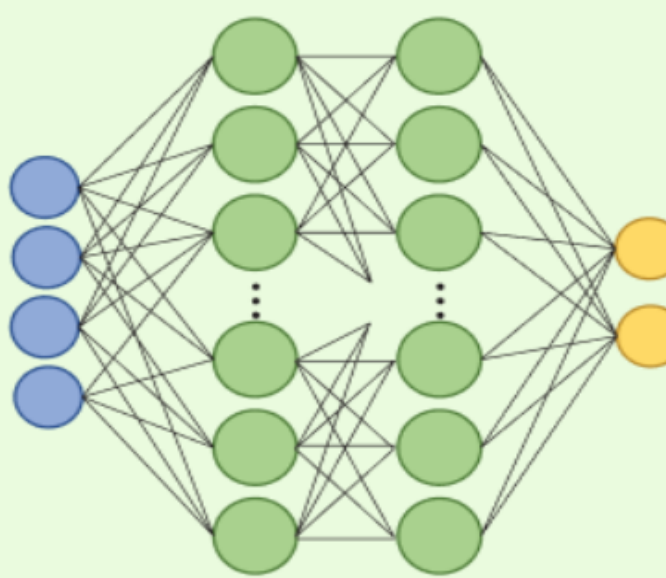
The New York Times

PLOS

Google Patents

WIKIPEDIA
The Free Encyclopedia

Optimize
 $P(\text{next word} \mid \text{previous words})$



Gradient descent on non-linear function with billions of parameters

Data
Humans rank multiple outputs

How do I...?

Version 1

Version 2

2 > 1

Loss function: Increases if incorrect prediction for a masked word

We use *python* to analyze our data and make visualizations

The *python* slithered silently through the jungle underbrush

Sum for billions of masked words

Recite Asimov's first law.

A robot may not injure a human being, or through inaction allow a human being to come to harm.



We train ChatGPT too!

Ask anything

Think–pair–share

<i>Societal Benefits</i>	<i>Societal Harms</i>
Save time on mundane tasks	Replace human jobs with AI
...	...
...	...
...	...

Think–pair–share

<i>Higher Ed. Benefits</i>	<i>Higher Ed. Harms</i>
...	...
...	...
...	...
...	...

Think–pair–share

What are *personal* or *collective actions* you can take to support ethical use of data science and technologies using data?

You can advocate for *regulation* by the government.

Large AI companies must report LLM tests to the federal government and make them public.

Biden Issues Executive Order to Create A.I. Safeguards

The sweeping order is a first step as the Biden administration seeks to put guardrails on a global technology that offers great promise but also carries significant dangers.

 Share full article  



The order is an effort by President Biden to show that the United States, considered the leading power in fast-moving artificial intelligence technology, will also take the lead in its regulation. Doug Mills/The New York Times



By Cecilia Kang and David E. Sanger

Cecilia Kang, who reported from the White House, and David E. Sanger have written extensively on the threats new technologies can pose.

Oct. 30, 2023

President Biden signed a far-reaching executive order on artificial intelligence on Monday, requiring that companies report to the federal government about the risks that their systems could aid countries or terrorists to make weapons of mass destruction. The order also seeks to lessen the dangers of “deep fakes” that could

You can advocate for *regulation* by the government.

EU AI Act: rules for AI transparency, limit copyright violations, and protect public safety.

European Union Unveils Rules for Powerful A.I. Systems

Makers of the most advanced artificial intelligence systems face obligations for transparency, copyright protection and public safety. The rules are not enforceable until next year.

Listen to this article · 5:25 min [Learn more](#)

[Share full article](#)



Henna Virkkunen of the European Commission said the new law would make advanced A.I. models “not only innovative but also safe and transparent.” Olivier Matthys/EPA, via Shutterstock



By **Adam Satariano**
Reporting from London

July 10, 2025

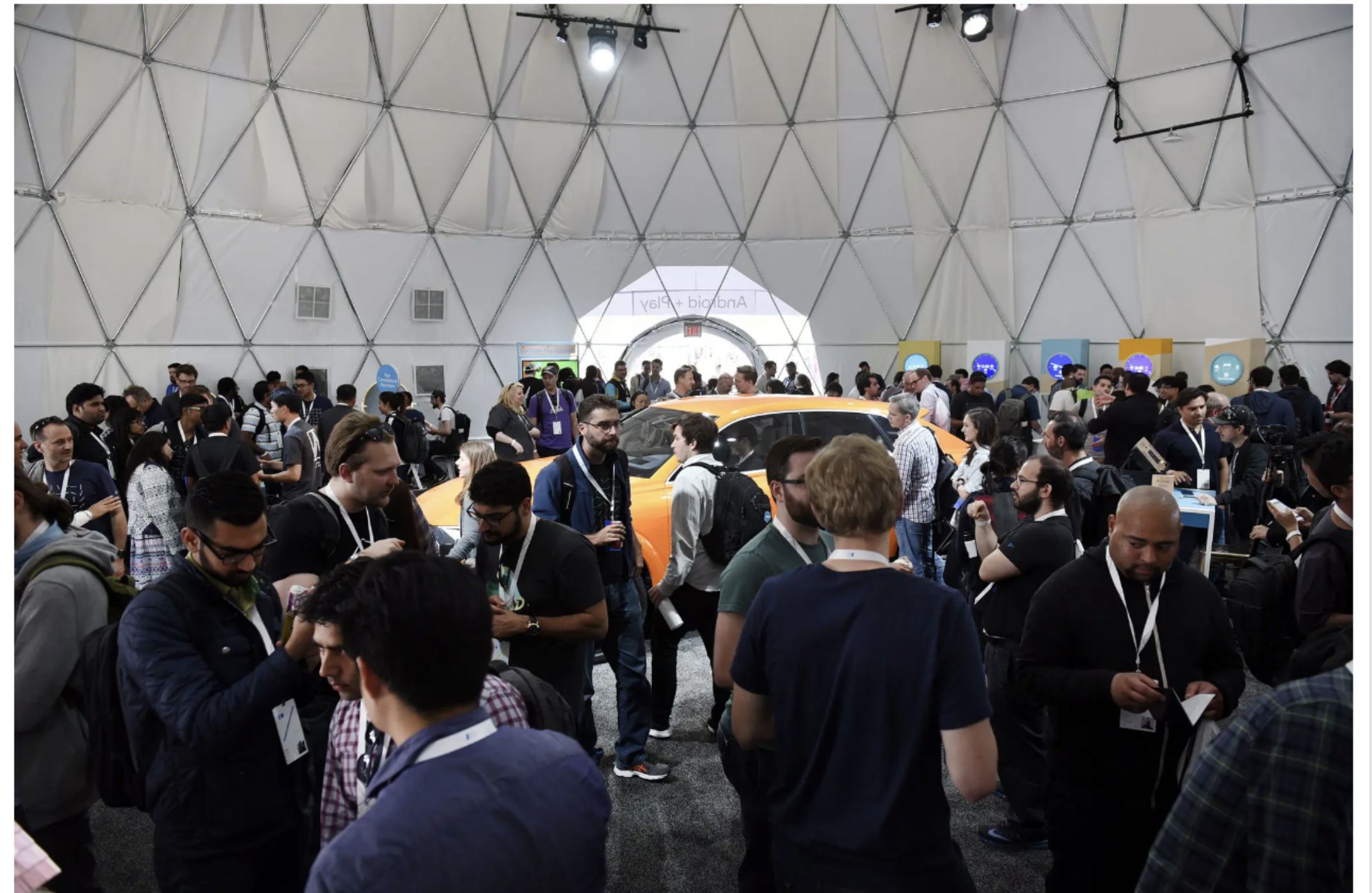
European Union officials unveiled new rules on Thursday to regulate artificial intelligence. Makers of the most powerful A.I. systems will have to improve transparency, limit copyright violations and protect public safety.

Refusal by technologists

About 4,000 Google employees signed a petition demanding “a clear policy stating that neither Google nor its contractors will ever build warfare technology”.

Google Will Not Renew Pentagon Contract That Upset Employees

Give this article    173



After employees protested, a Google executive said Friday that the company will not renew a contract to work on artificial intelligence with the Pentagon after it expires next year. Michael Short/Bloomberg

By **Daisuke Wakabayashi** and **Scott Shane**

June 1, 2018

SAN FRANCISCO — Google, hoping to head off a rebellion by employees upset that the technology they were working on could be used for lethal purposes, will not renew a contract with the Pentagon for artificial intelligence work when a current deal expires next year.

Protests leading to *moratoriums*

Amazon indefinitely extends a moratorium on the police use of its facial recognition software.

The tool has faced scrutiny from lawmakers and some employees inside Amazon who said they were worried that it led to unfair treatment of African-Americans.

 Give this article  



Demonstrators with images of Amazon's Jeff Bezos, during a protest in 2018 at the company's headquarters over its facial recognition technology. Elaine Thompson/Associated Press



By **Karen Weise**

Published May 18, 2021 Updated Aug. 1, 2021

Amazon said Tuesday that it would indefinitely prohibit police departments from using its [facial recognition](#) tool, extending a [moratorium](#) the company announced last year during nationwide protests over racism and biased policing.

Legislation and enforcement

Google pays almost \$400 million to states after they get caught tracking users' location data even after the users turned off location tracking.

Google Agrees to \$392 Million Privacy Settlement With 40 States

Under the agreement, which state attorneys general said was the largest U.S. internet privacy settlement, Google must also make its location-tracking practices clearer to users.

 Give this article  



The attorneys general said Google's practices violated state consumer protection laws that forbid companies to mislead and deceive consumers. Reuters



By Cecilia Kang

Nov. 14, 2022

WASHINGTON — Google agreed to a record \$391.5 million privacy settlement with a 40-state coalition of attorneys general on Monday for charges that it misled users into thinking they had turned off [location tracking](#) in their account settings even as the company continued collecting that information.

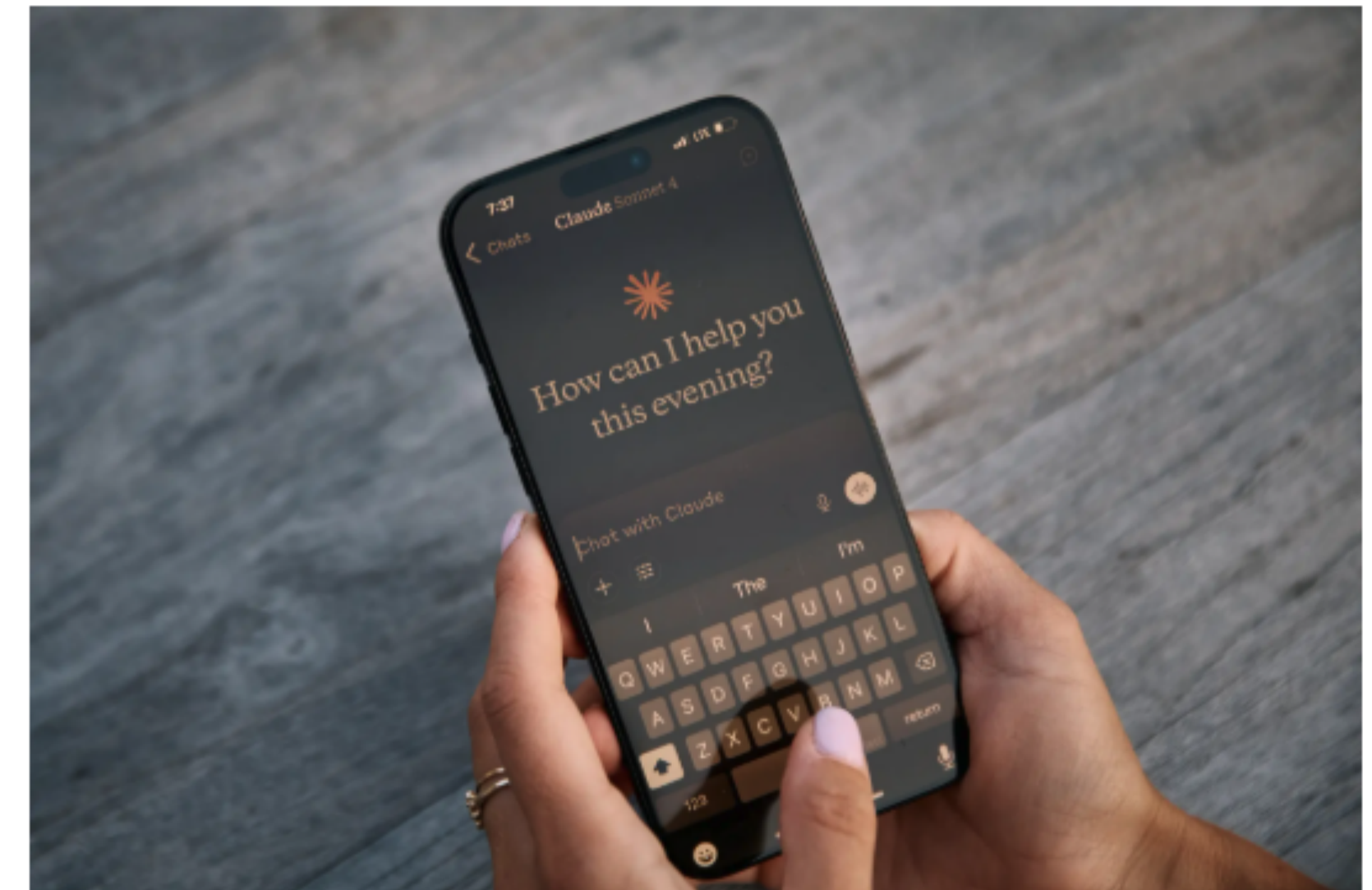
Legislation and enforcement

Anthropic pays \$1.5 billion to compensate copyright holders of training data

Anthropic Agrees to Pay \$1.5 Billion to Settle Lawsuit With Book Authors

The settlement is the largest payout in the history of U.S. copyright cases and could lead more A.I. companies to pay rights holders for use of their works.

▶ Listen to this article · 9:45 min [Learn more](#) [Share full article](#) [81](#)



Anthropic's Claude chatbot has become one of the world's most popular A.I. systems. Andres Kudacki for The New York Times



By Cade Metz
Reporting from San Francisco

Sept. 5, 2025

Educate others and *raise*
awareness



