



L-Università
ta' Malta

What is AI?

And how your bias becomes AI's bias

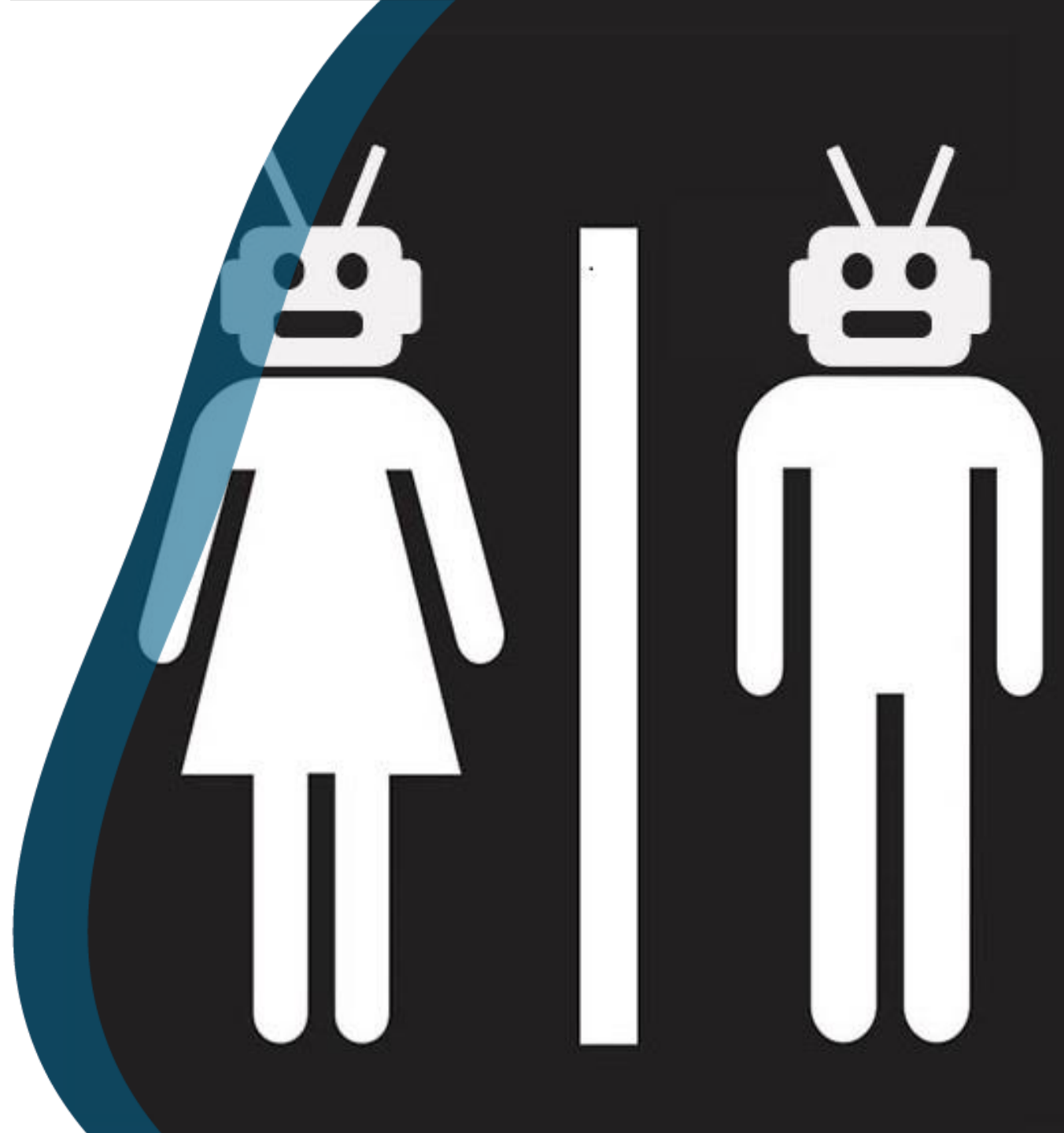
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What is Artificial Intelligence?

- any device that **perceives** its environment ...
and takes **actions** ...
that maximize its chance of successfully
achieving its **goals**

Our Perception of AI



A woman with long dark hair is shown in profile on the left, looking towards the right. On the right, a futuristic, metallic robot head is visible, featuring a glowing blue circular sensor on its face. The background is dark with vertical columns of blue binary code (0s and 1s). A large, semi-transparent blue circle is overlaid in the center, containing the text.

**When is the last
time you
interacted with
Artificial
Intelligence
?**



3 stages of AI



Narrow AI

Dedicated to assist with or take over specific tasks



General AI

Takes knowledge from one domain, transfers to other domain



Super AI

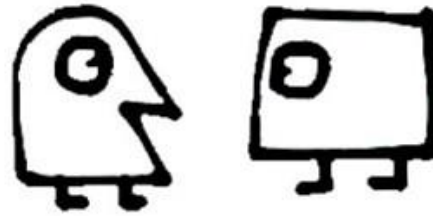
Machines that are an order of magnitude smarter than humans

3 stages of AI



Narrow AI

Dedicated to assist with or take over specific tasks



General AI

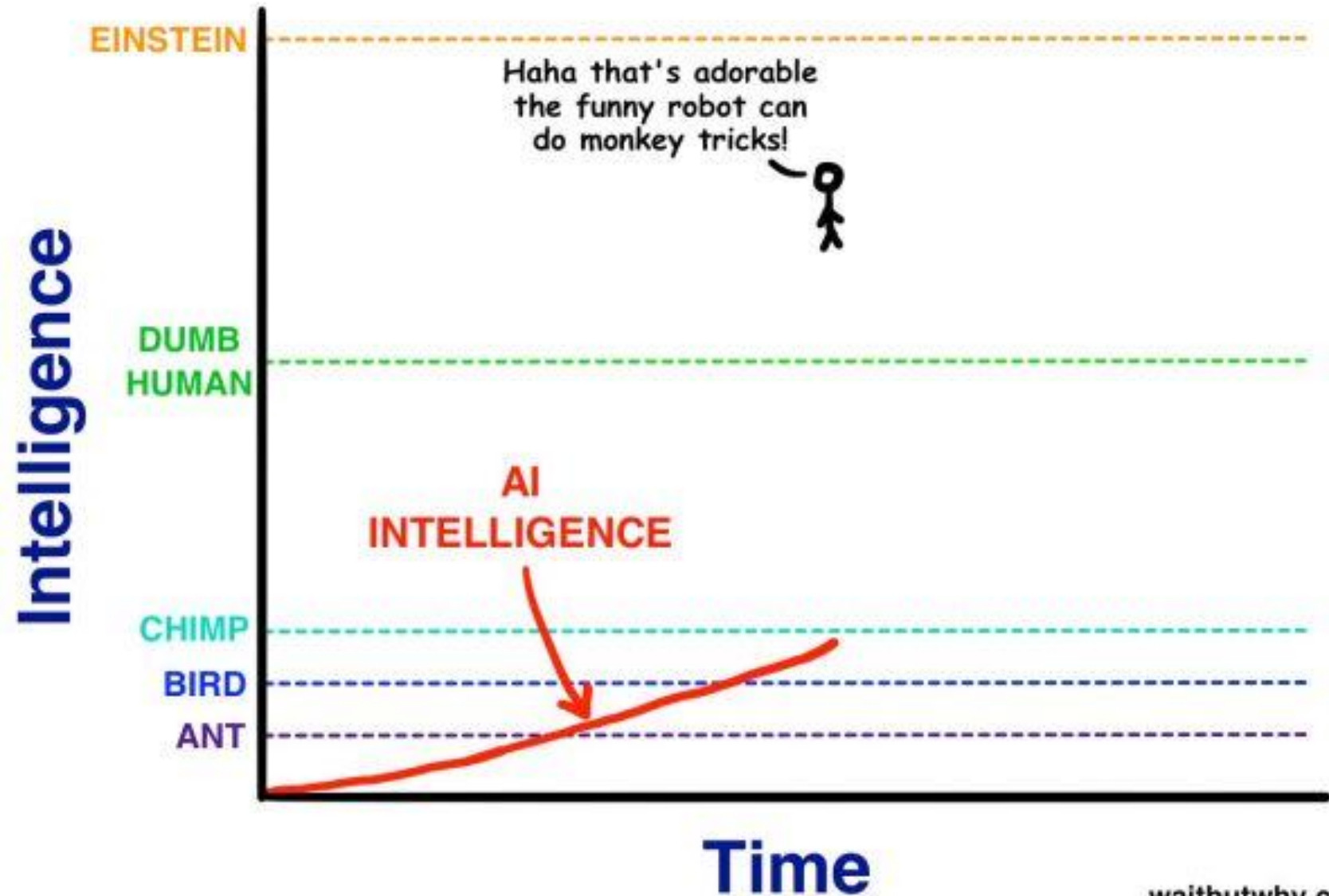
Takes knowledge from one domain, transfers to other domain

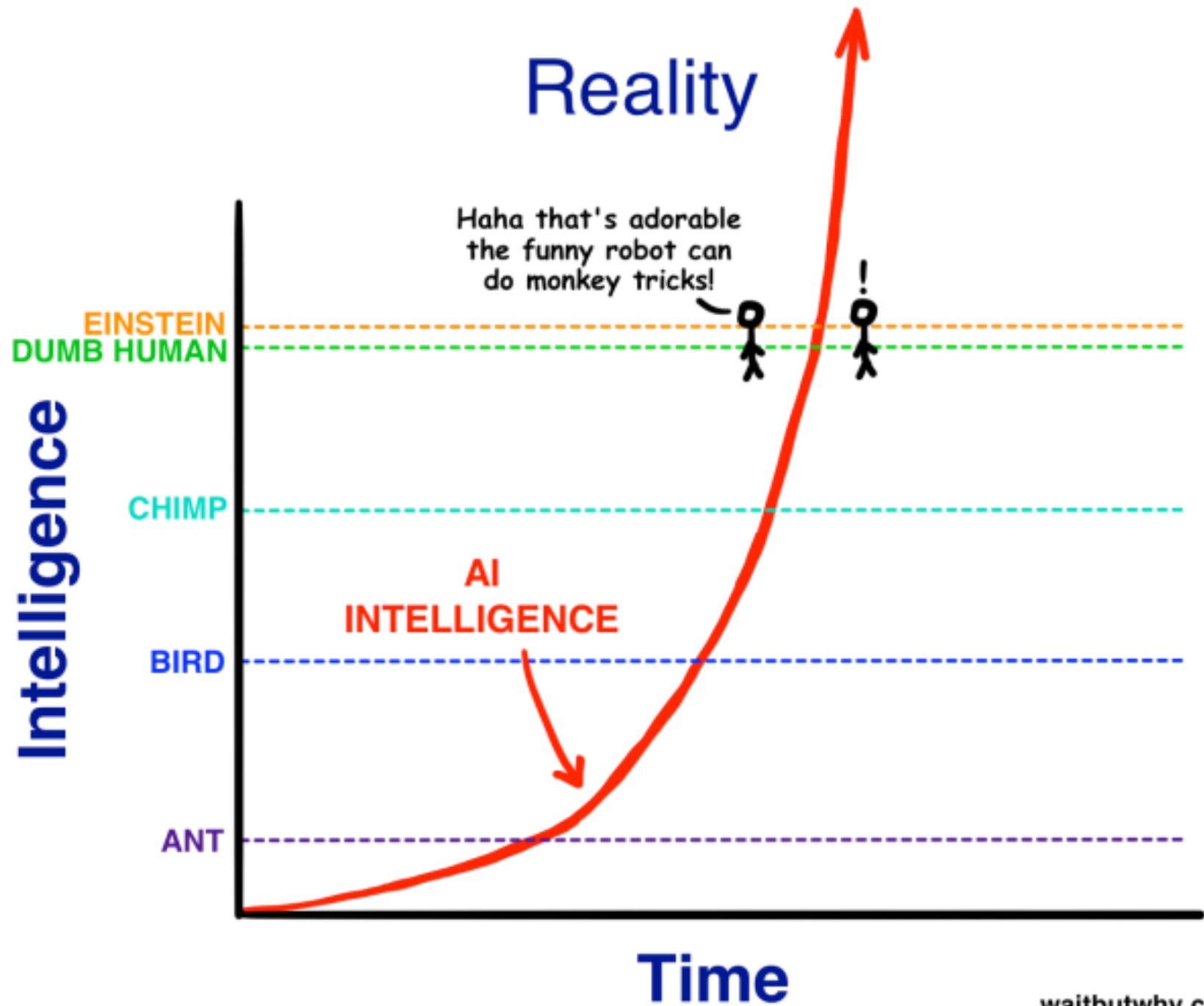


Super AI

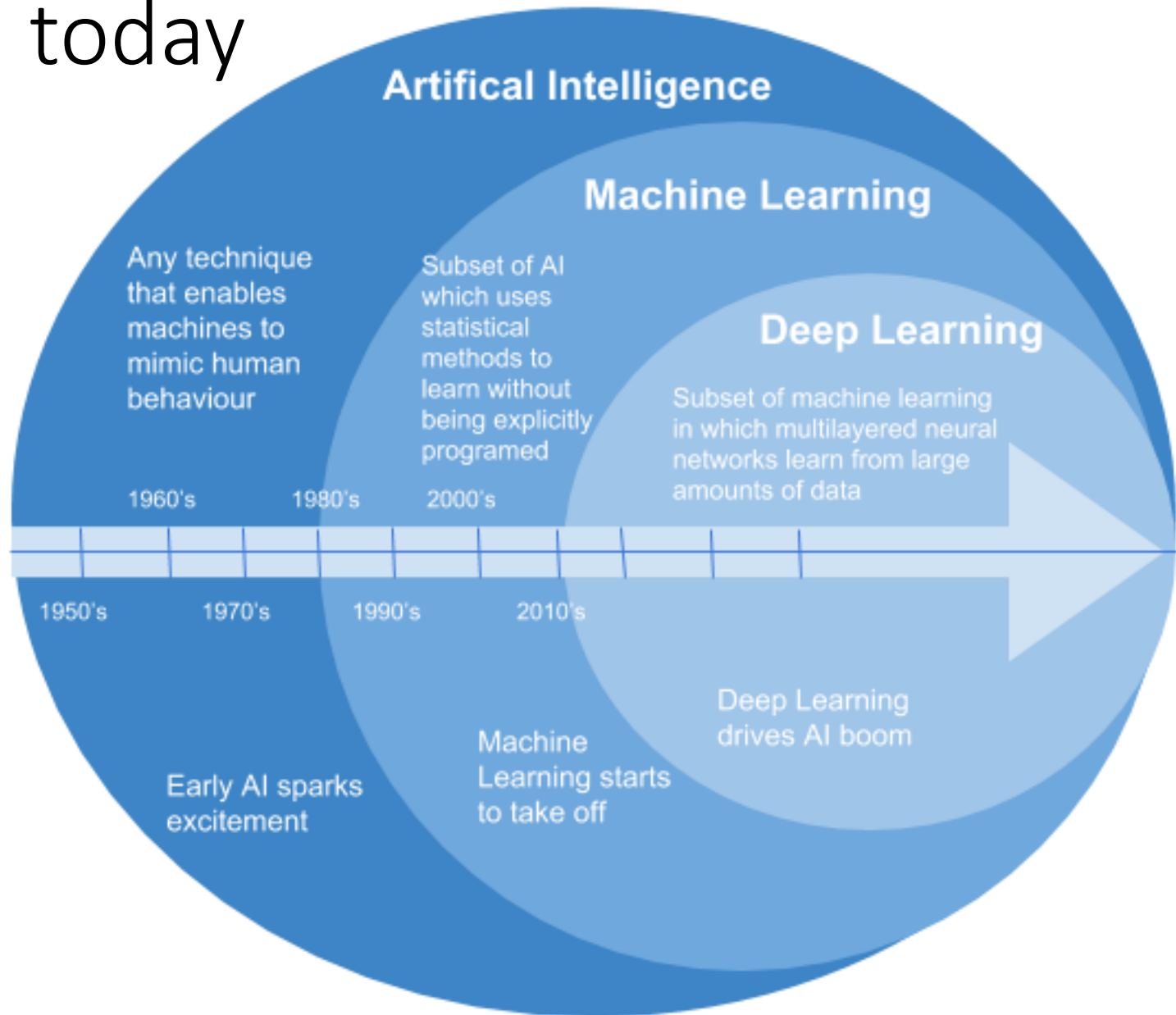
Machines that are an order of magnitude smarter than humans

Our Distorted View of Intelligence





AI...history and today



Machine Learning



Training Data

Machine Learning

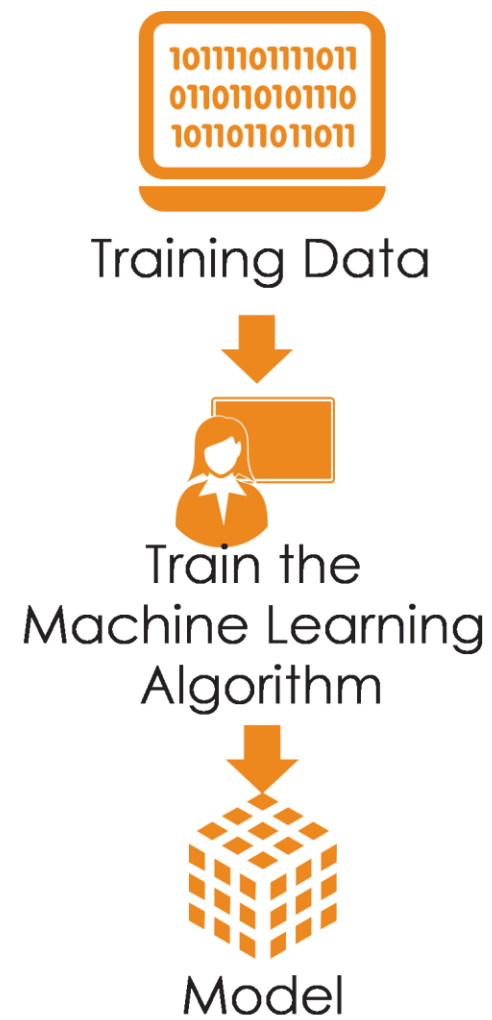


Training Data

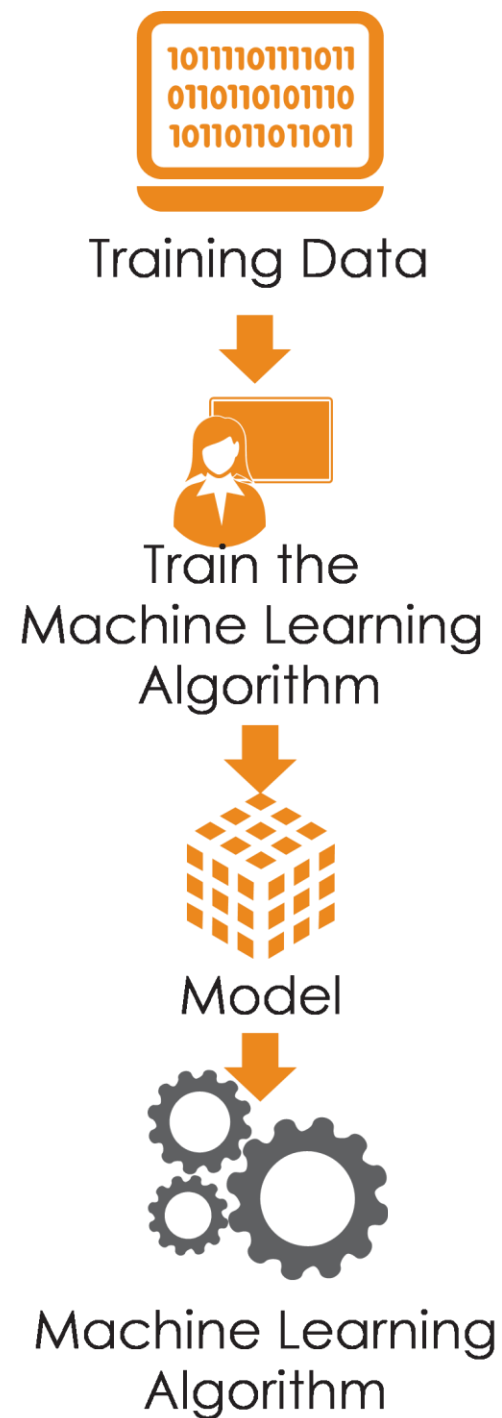


Train the
Machine Learning
Algorithm

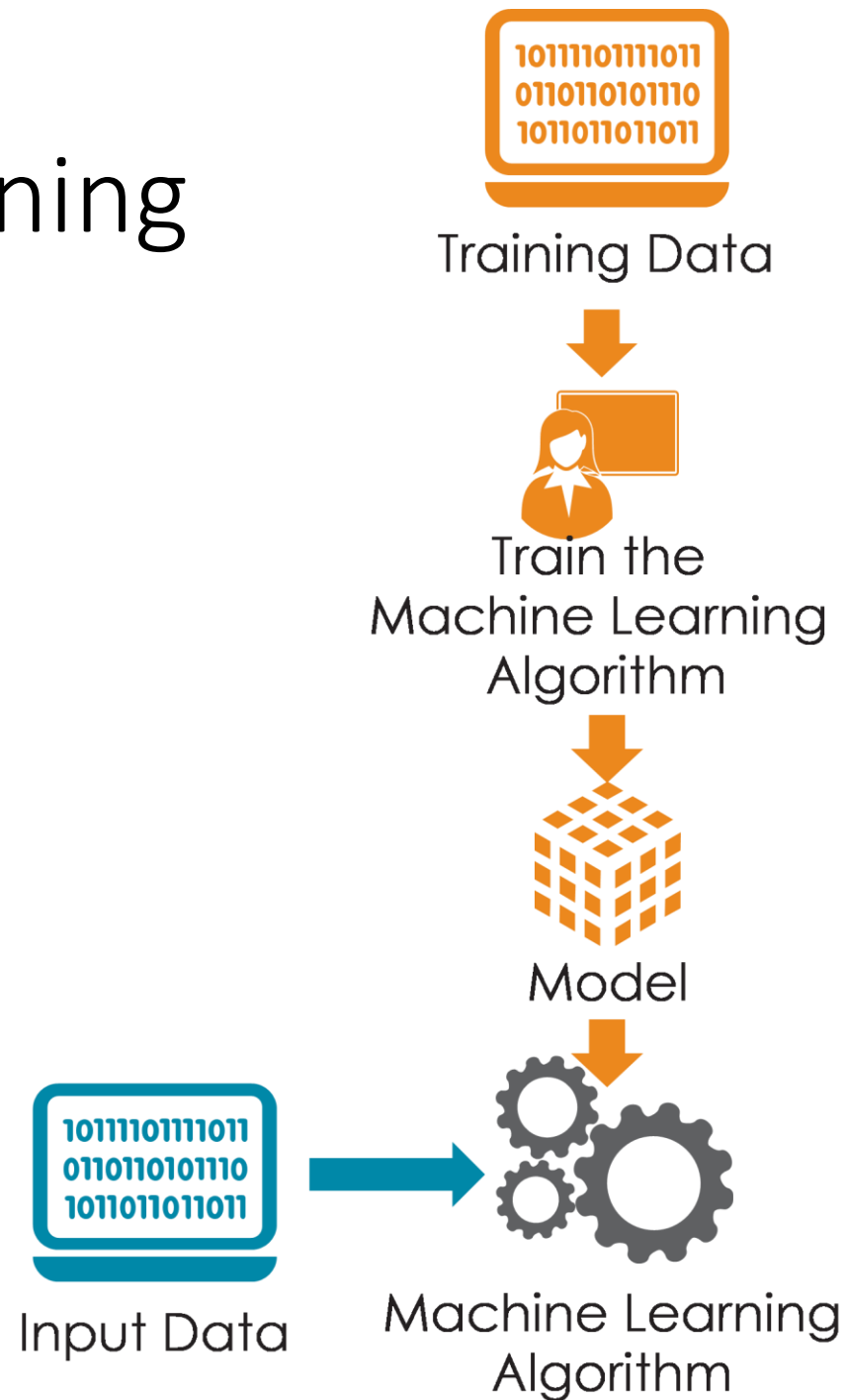
Machine Learning



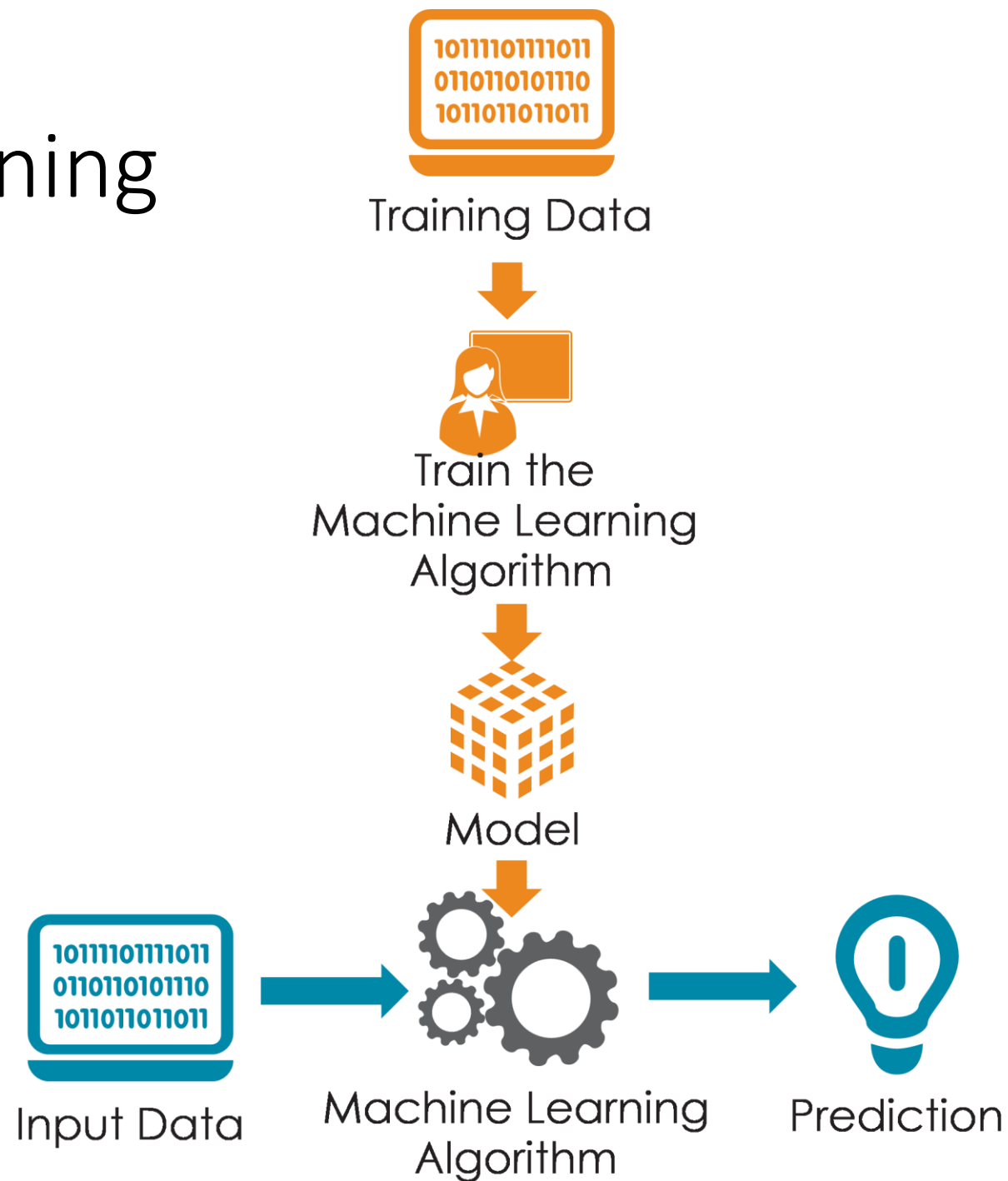
Machine Learning



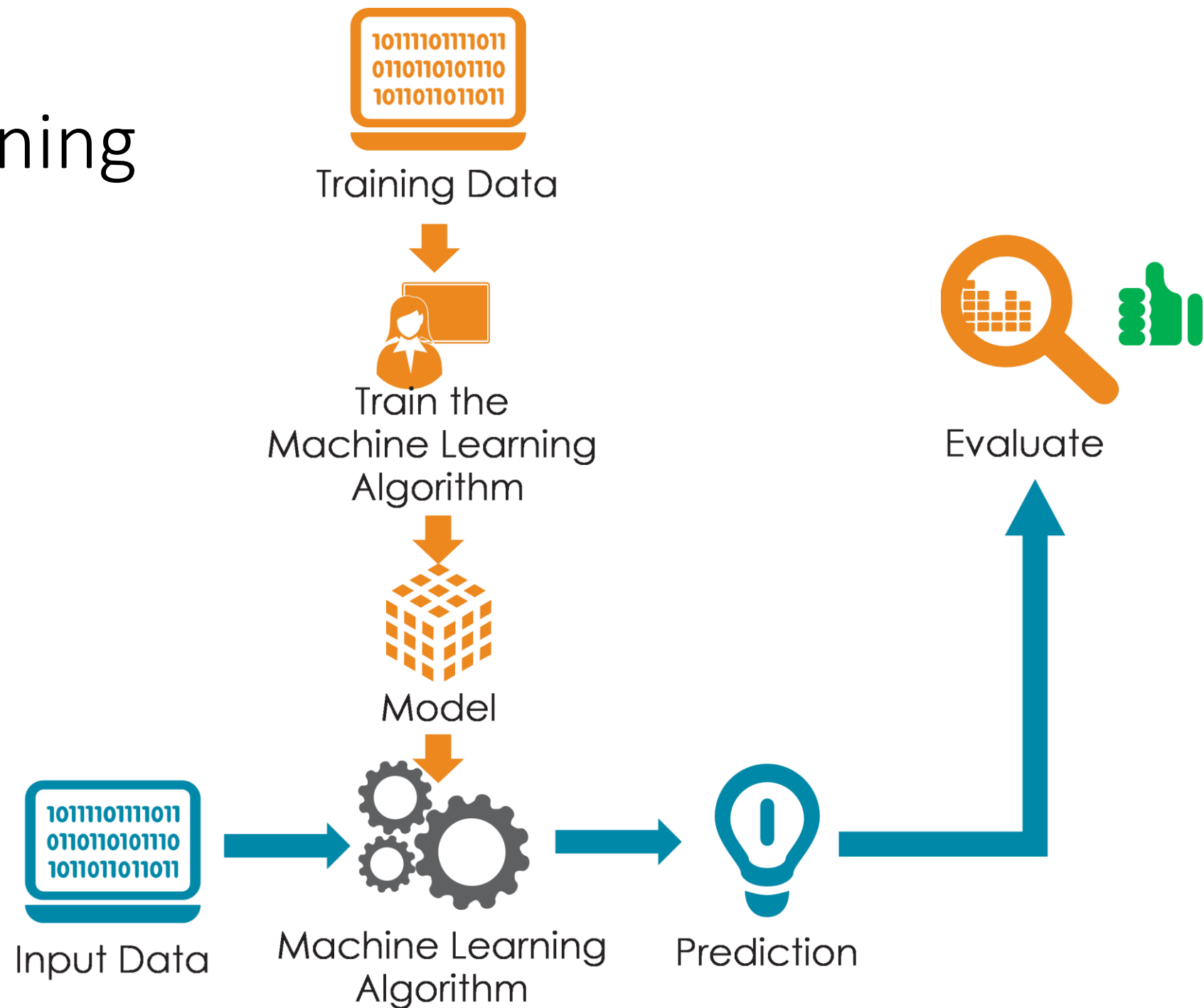
Machine Learning



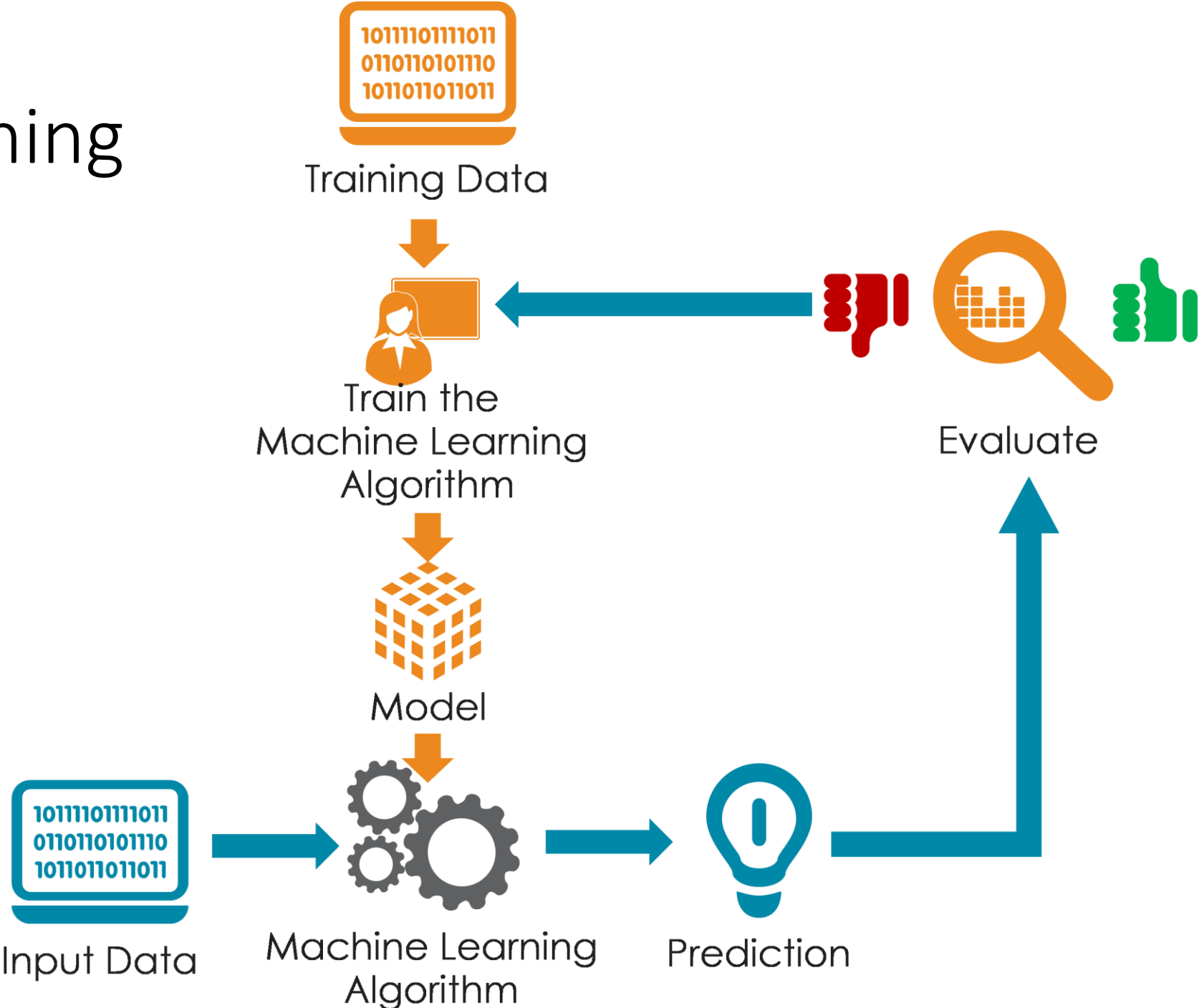
Machine Learning



Machine Learning



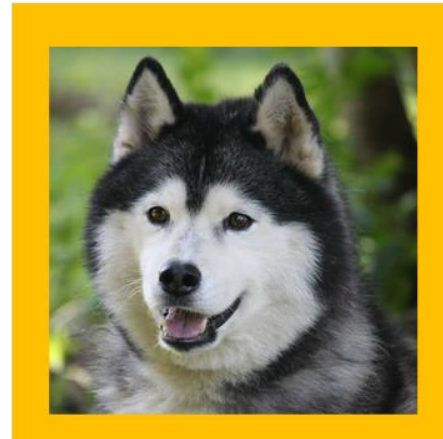
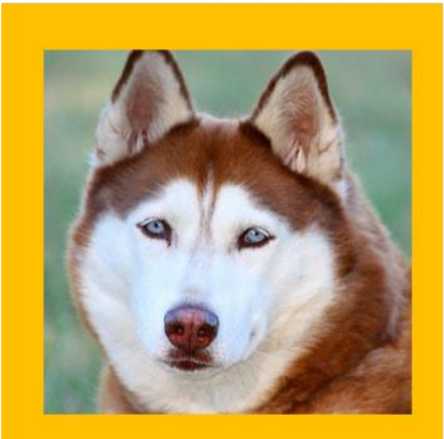
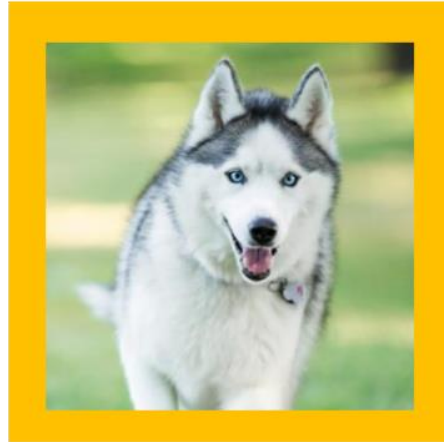
Machine Learning



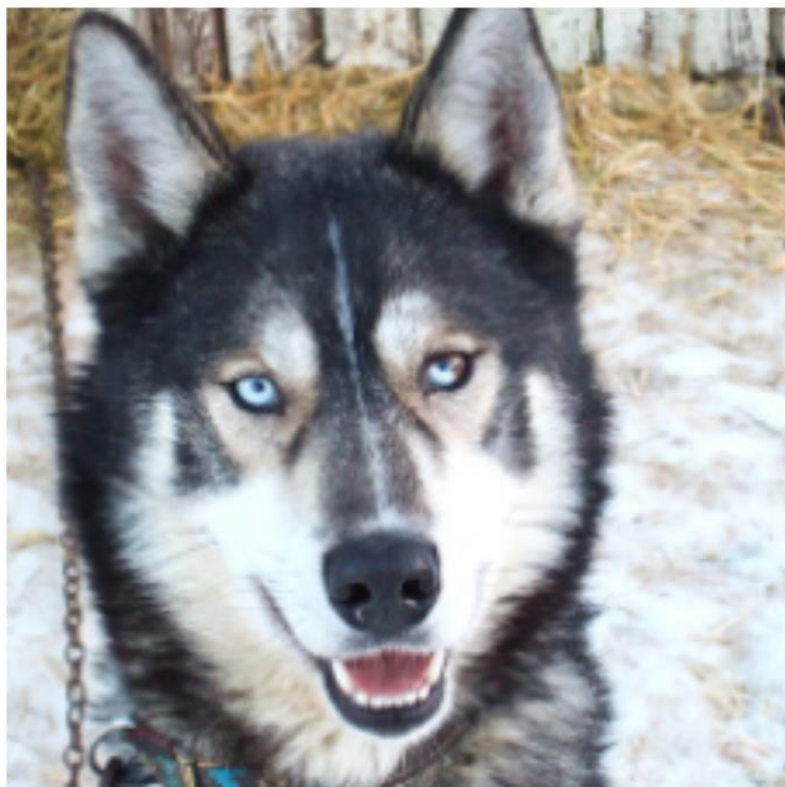
Husky or wolf?



Husky or wolf?

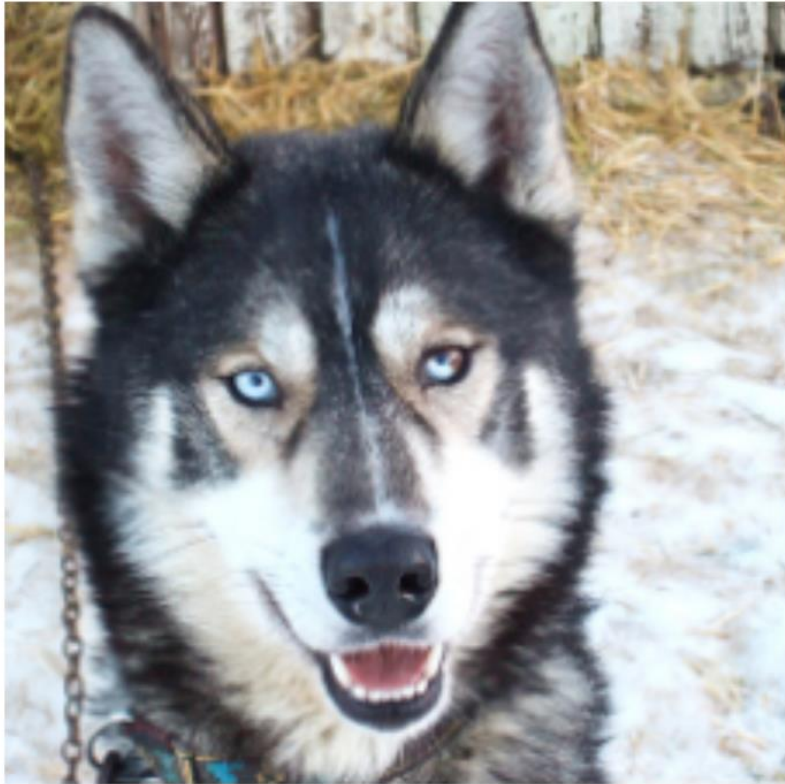


Husky or wolf?

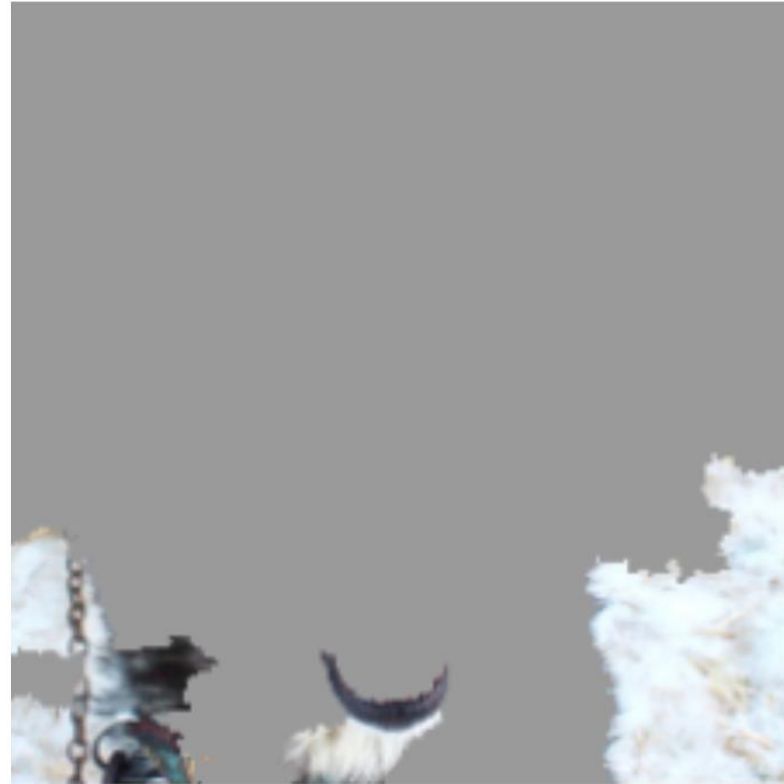


(a) Husky classified as wolf

~~Husky or wolf?~~ Snow!

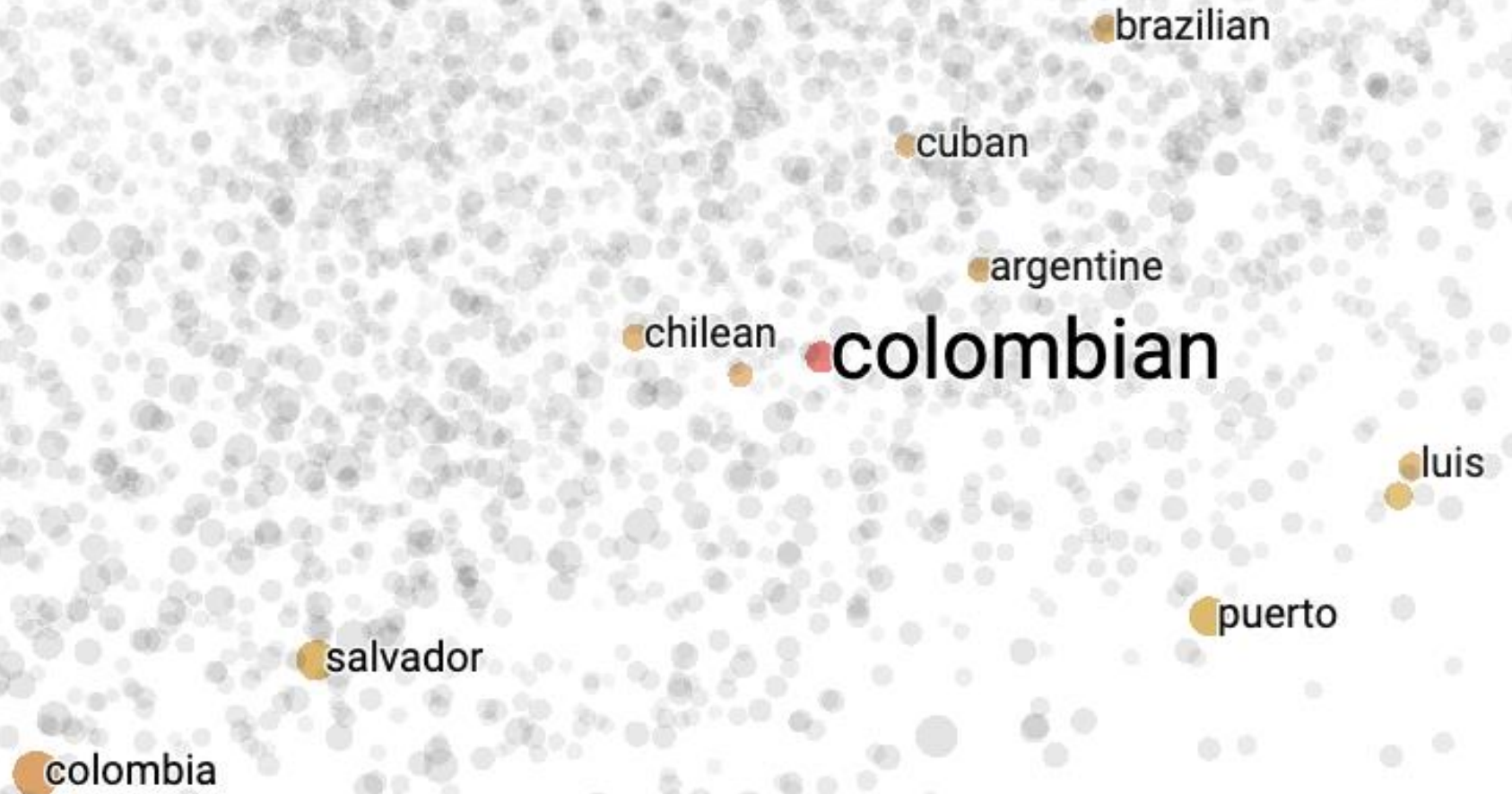


(a) Husky classified as wolf



(b) Explanation

Word Representations



Word Representations reflect cultural bias

- Ask “Paris : France :: Tokyo : x”
 - x = Japan
- Ask “father : doctor :: mother : x”
 - x = nurse
- Ask “man : computer programmer :: woman : x”
 - x = homemaker

Bolukbasi, Tolga, Kai-Wei Chang, James Y. Zou, Venkatesh Saligrama, and Adam T. Kalai. "Man is to computer programmer as woman is to homemaker? debiasing word embeddings." In *Advances in Neural Information Processing Systems*, pp. 4349-4357. 2016.

Word Representations reflect cultural bias

- Psychological findings on US participants:
- African-American names are associated with unpleasant words (more than European-American names)
- Male names associated more with math, female names with arts
- Old people's names with unpleasant words, young people with pleasant words.

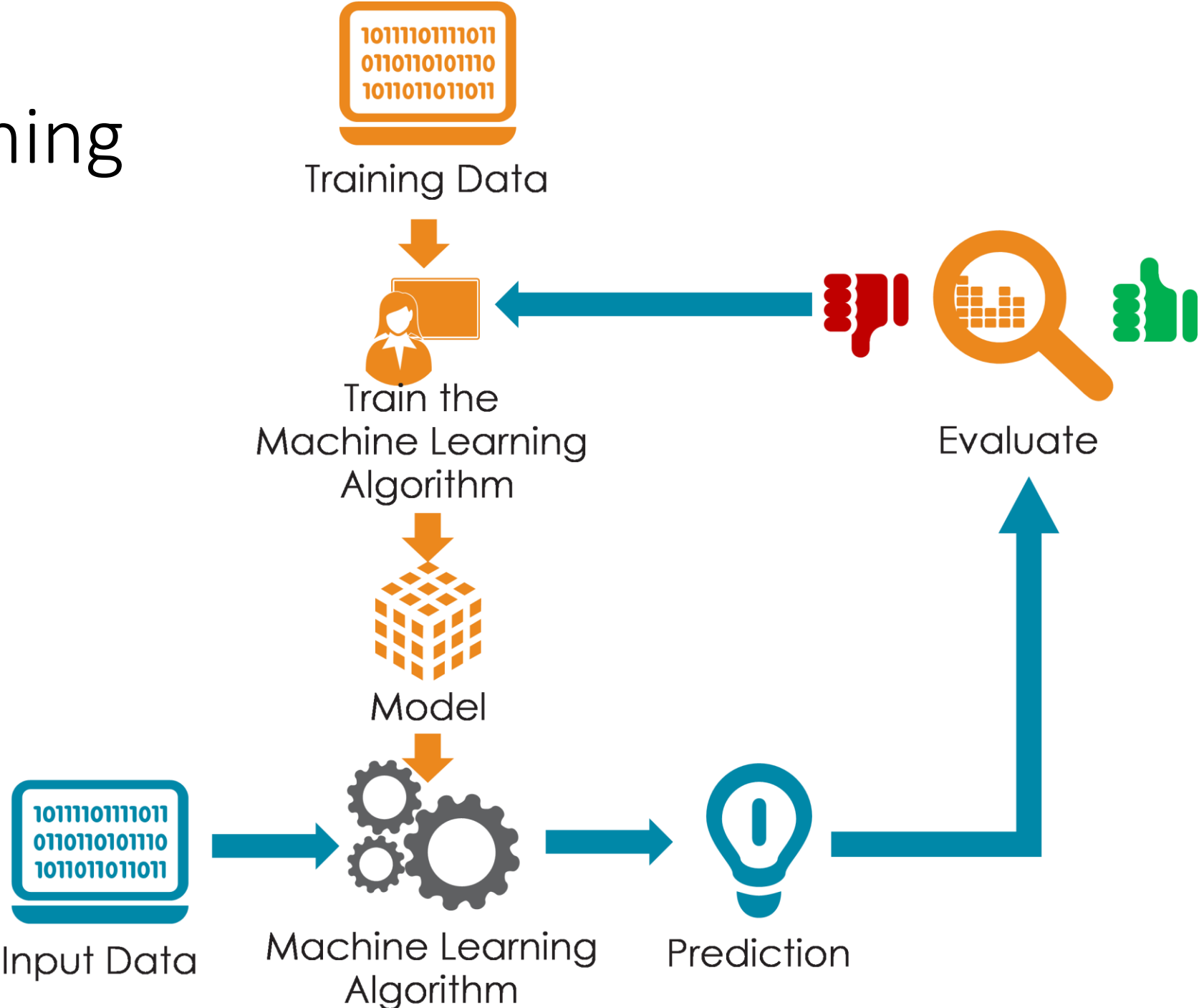
Caliskan, Aylin, Joanna J. Brusson and Arvind Narayanan. 2017. Semantics derived automatically from language corpora contain human-like biases. *Science* 356:6334, 183-186.

History of biased framings of women

- Embeddings for competence adjectives are biased toward men
 - *Smart, wise, brilliant, intelligent, resourceful, thoughtful, logical, etc.*
- This bias is slowly decreasing

Garg, Nikhil, Schiebinger, Londa, Jurafsky, Dan, and Zou, James (2018). Word embeddings quantify 100 years of gender and ethnic stereotypes. *Proceedings of the National Academy of Sciences*, 115(16), E3635–E3644

Machine Learning



We are the data!



Training Data

Ethical Concerns



Hello,
I am a bot.

Hope I can
trust you...



Trust

- What is needed for us to trust the decisions that AI systems make?

Trust

- What is needed for us to trust the decisions that AI systems make?
- AI must Explain itself
- We tend to trust AI systems because they are working for us...

Trust

- What is needed for us to trust the decisions that AI systems make?
- AI must Explain itself
- We tend to trust AI systems because they are working for us...
- Or for the company that created that system?

TOP REASONS BANKS USE ARTIFICIAL INTELLIGENCE



**DATA ANALYSIS
& INSIGHT**

60%



**INCREASED
PRODUCTIVITY**

59%





**COST BENEFITS
/SAVINGS**

54%

Thank you for your attention.

If you have any questions, now is the right time to ask!
Contact me on the details below for further info:

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