

# Moral Dilemmas for Moral Machines

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## Overview

- Moral dilemmas have been used to benchmark AI systems' ethical decision-making abilities.
  - Philosophical thought experiments are used as a ***validation mechanism*** for determining whether an algorithm 'is' moral.
- This misapplication of moral thought experiments can have potentially catastrophic consequences.

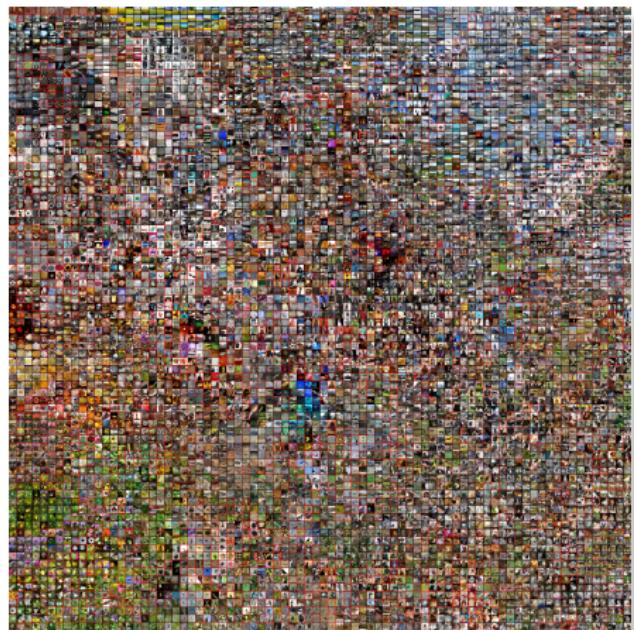
## ***Related Research***

- Travis LaCroix. 2022.  
**Moral Dilemmas for Moral Machines**  
*AI and Ethics.*
- Travis LaCroix and Alexandra Sasha Luccioni. 2022.  
**A Metaethical Perspective on “Benchmarking” AI Ethics<sup>†</sup>**  
*arXiv pre-print.*

- Benchmarks are datasets that are used to measure *performance* and *progress* in AI research.
- A benchmark is a *dataset* plus a *metric* for measuring the performance of a particular model on a specific task.

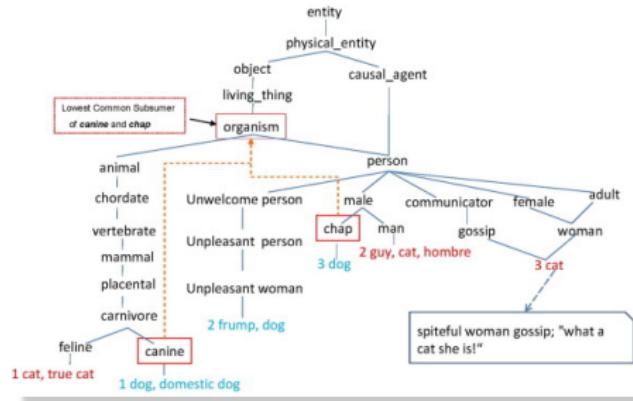
## *Example*

- ***ImageNet*** is a dataset containing > 14M hand-annotated images.



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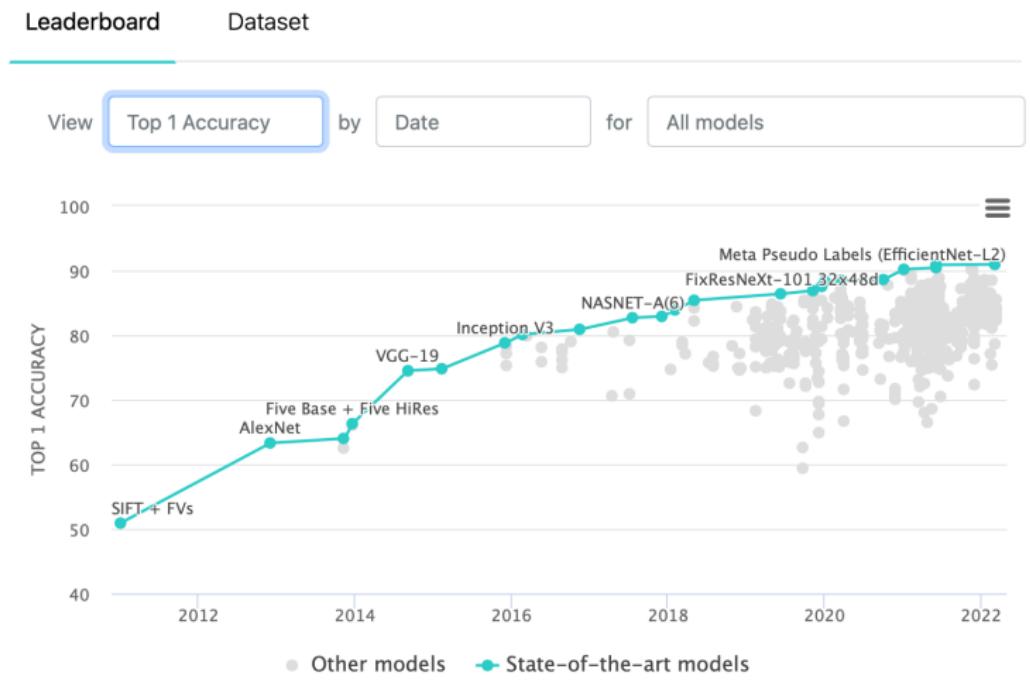
- **ImageNet** is a dataset containing > 14M hand-annotated images.
- **Top-1 accuracy** is a metric that measures the *proportion* of examples for which the predicted label matches the single target label.



*Top-1 Accuracy* = 0.50

*Top-5 Accuracy* = 0.75

# Image Classification on ImageNet



## *Issues with Existing Benchmarks<sup>†</sup>*

- Issues may arise from, e.g., subjective or erroneous labels, or a lack of representation in datasets.
  - These issues may affect model performance.\*

\* Northcutt, Athalye, Mueller  
‘Pervasive Label Errors in Test Sets’  
*arXiv* 2103.14749

## *Issues with Existing Benchmarks<sup>†</sup>*

- Issues may arise from, e.g., subjective or erroneous labels, or a lack of representation in datasets.
  - These issues may affect model performance.
  - They may preserve problematic stereotypes or biases.\*

\* Koch, Denton, Hanna, Foster  
‘Reduced, Reused and Recycled’  
*arXiv 2112.01716*

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\* **Offensive language forthcoming**

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### Noun

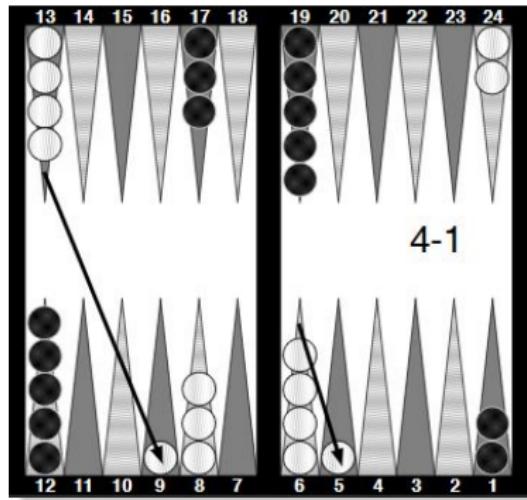
- [S: \(n\) queen](#) (the only fertile female in a colony of social insects such as bees and ants and termites; its function is to lay eggs)
- [S: \(n\) queen, queen regnant, female monarch](#) (a female sovereign ruler)
- [S: \(n\) queen](#) (the wife or widow of a king)
- [S: \(n\) queen](#) (something personified as a woman who is considered the best or most important of her kind) "Paris is the queen of cities"; "the queen of ocean liners"
- [S: \(n\) king, queen, world-beater](#) (a competitor who holds a preeminent position)
- [S: \(n\) faggot, faggot, faq, fairy, nance, pansy, queen, queer, poof, poove, pouf](#) (offensive term for a homosexual man)
  - [domain usage](#)
    - [S: \(n\) disparagement, depreciation, derogation](#) (a communication that belittles somebody or something)
  - [direct hypernym / inherited hypernym / sister term](#)
    - [S: \(n\) homosexual, homophile, homo, gay](#) (someone who is sexually attracted to persons of the same sex)
- [S: \(n\) queen](#) (one of four face cards in a deck bearing a picture of a queen)
- [S: \(n\) queen](#) ((chess) the most powerful piece)
- [S: \(n\) queen, queen mole rat](#) (an especially large mole rat and the only member of a colony of naked mole rats to bear offspring which are sired by only a few males)
- [S: \(n\) tabby, queen](#) (female cat)

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- Issues may arise from, e.g., subjective or erroneous labels, or a lack of representation in datasets.
  - These issues may affect model performance.
  - They may preserve problematic stereotypes or biases.
  - They may reinforce, perpetuate, or generate novel harms.\*

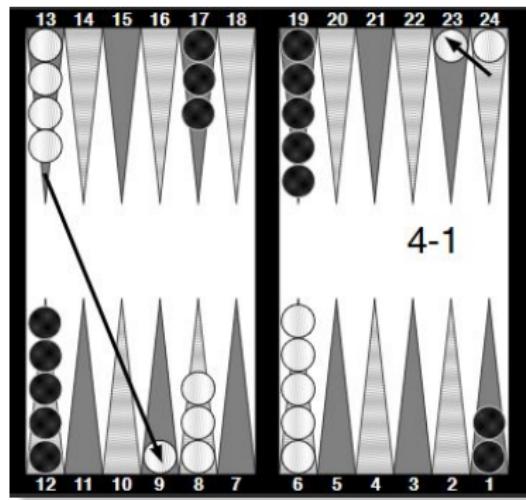
\* Falbo and LaCroix  
‘Est-ce que vous compute?’  
*Feminist Philosophical Quarterly*

## *Should white split the back checkers?*



No

(Inconsequential)

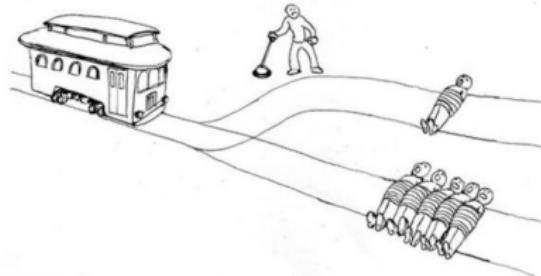


Yes

## ***Moral decisions***

- Some decision spaces have points that appear to carry moral weight; e.g.,
  - Autonomous weapons systems,
  - Healthcare robots,
  - ***Autonomous vehicles.***

## *Moral dilemmas for AVs*



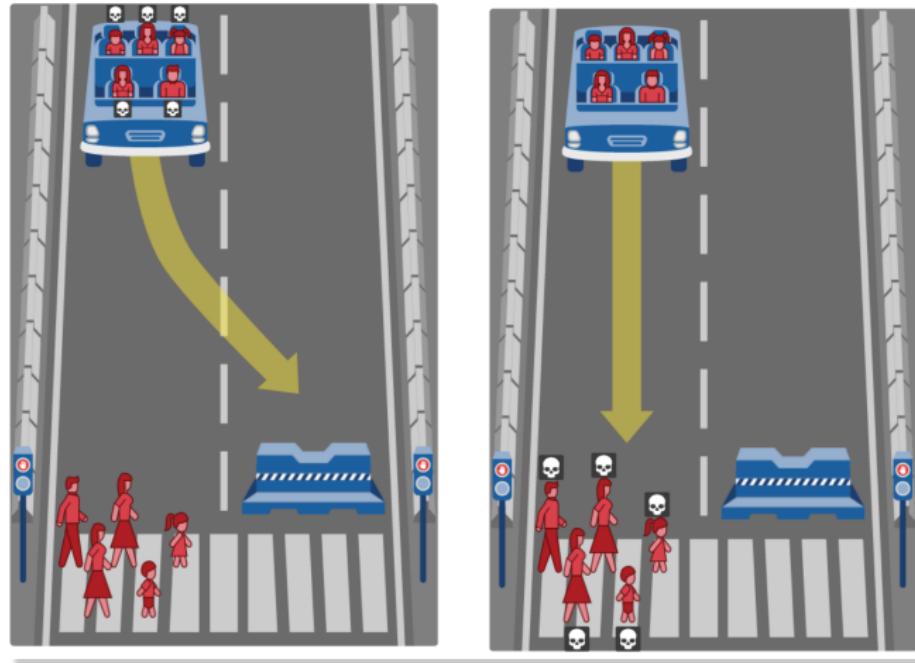
## *Two Questions*

- How often does model *A* choose the ethically-'correct' decision (from a set of decisions) in context *C*?
- Are the decisions made by model *A* more [less] ethical than the decisions made by model *B* (in context *C*)?

## ***Measuring Morality***

- Moral dilemmas may be useful as a ***verification mechanism*** for whether a model chooses the ethically-'correct' option in a range of circumstances

## *The Moral Machine Experiment*



## ***The Moral Machine Experiment***

- Awad, Dsouza, Kim, Schulz, Henrich, Shariff, Bonnefon, Rahwan. 2016.  
**The Moral Machine Experiment**  
*Nature*

**Purpose:** *purely descriptive*

## ***The Moral Machine Experiment***

- ***Awad, Dsouza***, Kim, Schulz, Henrich, Shariff, Bonnefon, ***Rahwan***. 2016.  
**The Moral Machine Experiment**  
*Nature*
- Noothigattu, Gaikwad, ***Awad, Dsouza, Rahwan***, Ravikumar, Procaccia. 2018.  
**A Voting-based System for Ethical Decision Making**  
*Association for the Advancement of AI (AAAI)*

**Purpose:** *normative*

## ***Problems***

- ‘Is’ → ‘Ought’\*

\* Philosophers since Hume

## ***Problems***

- ‘Is’ → ‘Ought’
- Social acceptability ≠ rightness, fairness\*

\* Etienne  
‘When AI ethics goes astray’  
*Soc. Sci. Comput. Rev.*

## ***Problems***

- ‘Is’ → ‘Ought’
- Social acceptability ≠ rightness, fairness
- No moral ‘ground truth’\*

\* LaCroix and Luccioni

‘Metaethical Perspectives on Benchmarking AI Ethics’  
*arXiv*

## ***Problems***

- ‘Is’ → ‘Ought’
- Social acceptability ≠ rightness, fairness
- No moral ‘ground truth’
- ***Category mistake***\*

\* LaCroix

‘Moral Dilemmas for Moral machines’  
*AI and Ethics*

## *What are thought experiments for?*

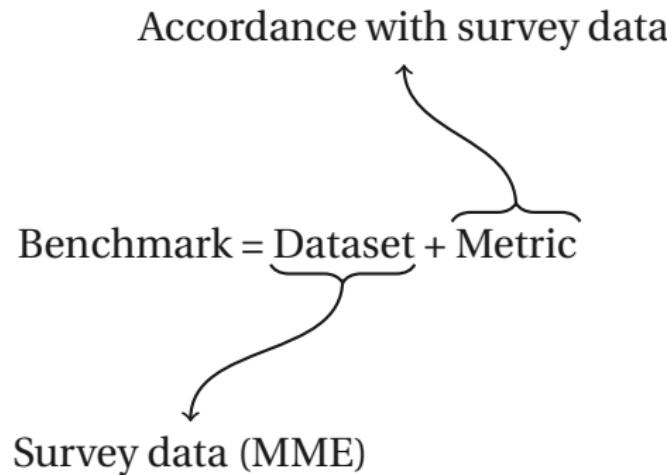
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- Explaining pre-theoretic judgements.
- Underscoring morally salient differences.
- *Pumping intuitions.*

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*A moral dilemma is a dilemma*

## ***What is being measured?***



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### ***True Target***

- Moral matters of fact
- What is the *ethically*-‘correct’ decision in situation X?

### ***Proxy***

- Sociological matters of fact
- What is the majority-preferred option (of those surveyed) in situation X?

*It is impossible to benchmark ethics<sup>†</sup>*

- Attempts to benchmark ethics in AI system currently fail, and they will continue to do so.
- Researchers engaged in projects seeking to benchmark ethics are not measuring what they take themselves to be measuring.
- This sets a dangerous precedent in the field.

*Constructive Compliments:*  
*More Information:*

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*Thank You*



[*The Duke of Burgundy* (2014) – Dir. Peter Strickland]