# A History of Adversarial Attacks

Prof. Stephen Roberts<sup>1</sup>; Benjamin Etheridge<sup>1</sup> Al Security Reading Group, October 2024

<sup>1</sup>Machine Learning Research Group Department of Engineering Science

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Adversarial Examples

BNNs, GPs, Bayesian Opt

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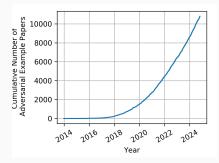
Adversarial Examples

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# Intro - Why should we care?

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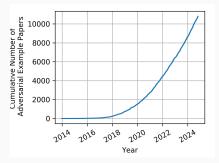
Extremely active field



https://nicholas.carlini.com/writing/2019/all-adversarial-example-papers.html

# Intro - Why should we care?

Extremely active field

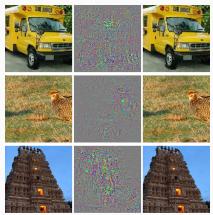


https://nicholas.carlini.com/writing/2019/all-adversarial-example-papers.html

Threat model has changed - no longer purely an academic concern.

Szegedy et al. - ICLR 2014 - arXiv:1312.6199

• Imperceptible perturbations can result in significant changes in output



Szegedy et al. - ICLR 2014 - arXiv:1312.6199

- Box constrained L-BFGS Computation, minimising  $||L||_2$  of perturbation  $\eta$  s.t:
  - 1.  $f(x + \eta) = I$  (misclassification to label I)
  - 2.  $x + \eta \in [0, 1]^m$  (?)

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- Second Order Optimisation Inefficient
- ICLR 2024 Test Of Time Runner Up

# **Explaining and Harnessing Adversarial Examples**

Goodfellow et al. - ICLR 2015 - arXiv:arXiv:1412.657

• Introduces Fast Gradient Sign Method (FGSM)

AUTHOR1 et al. YEAR - arXiv:REF

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## Sample frame title

In this slide, some important text will be highlighted because it's important. Please, don't abuse it.

#### Remark

Sample text

#### Important theorem

Sample text in red box

#### **Examples**

Sample text in green box. The title of the block is "Examples".

#### Two-column slide

This is a text in first column.

$$E = mc^2$$

- First item
- Second item

This text will be in the second column and on a second tought this is a nice looking layout in some cases.