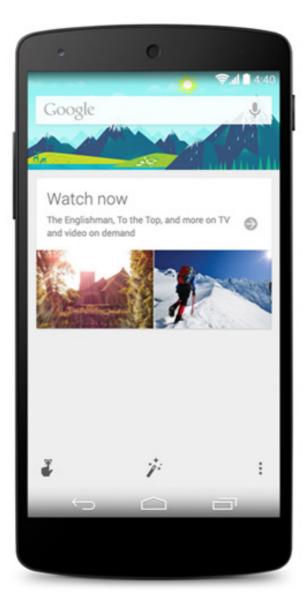
# Lecture 1: Introduction to ML Course: ES 654

Nipun Batra Jan 6, 2020

#### Apple Siri



#### Google Now



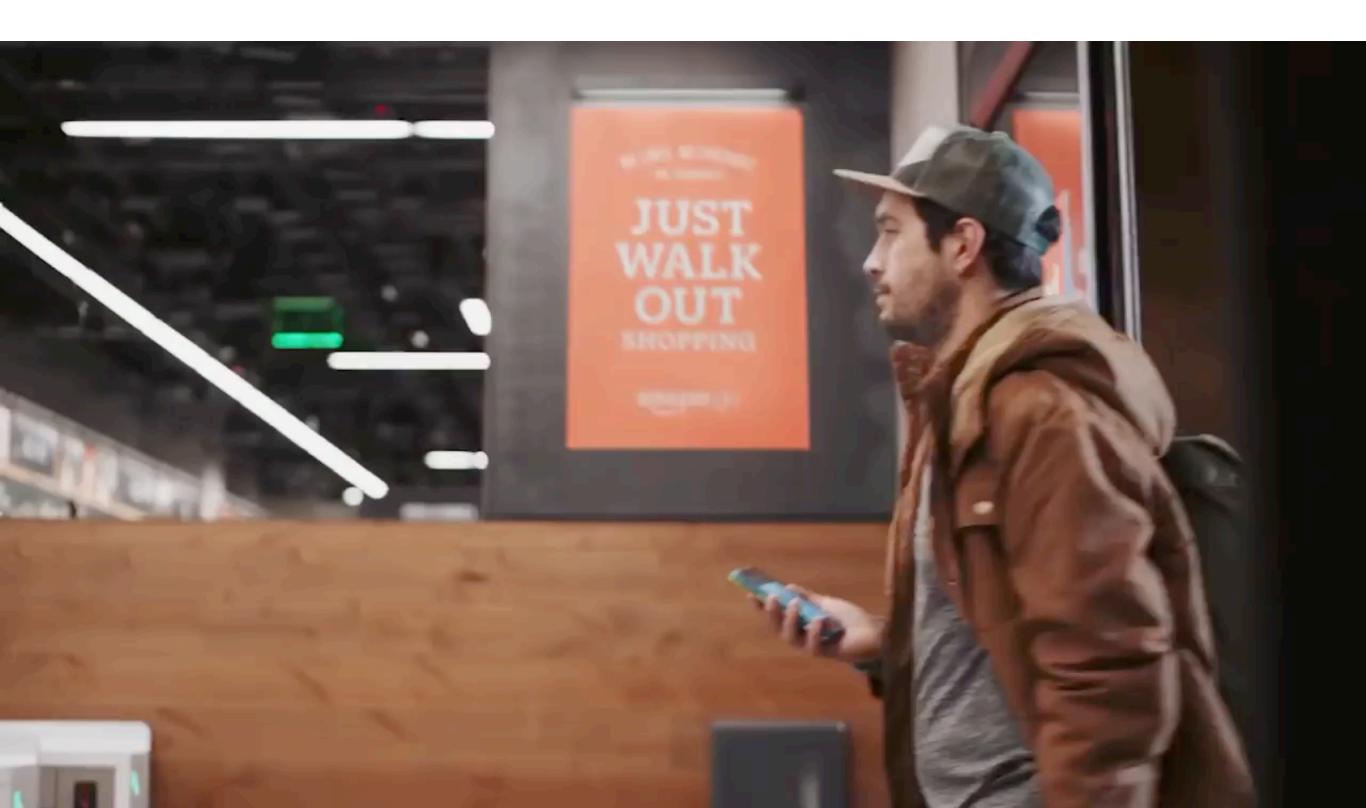
#### Windows Cortana

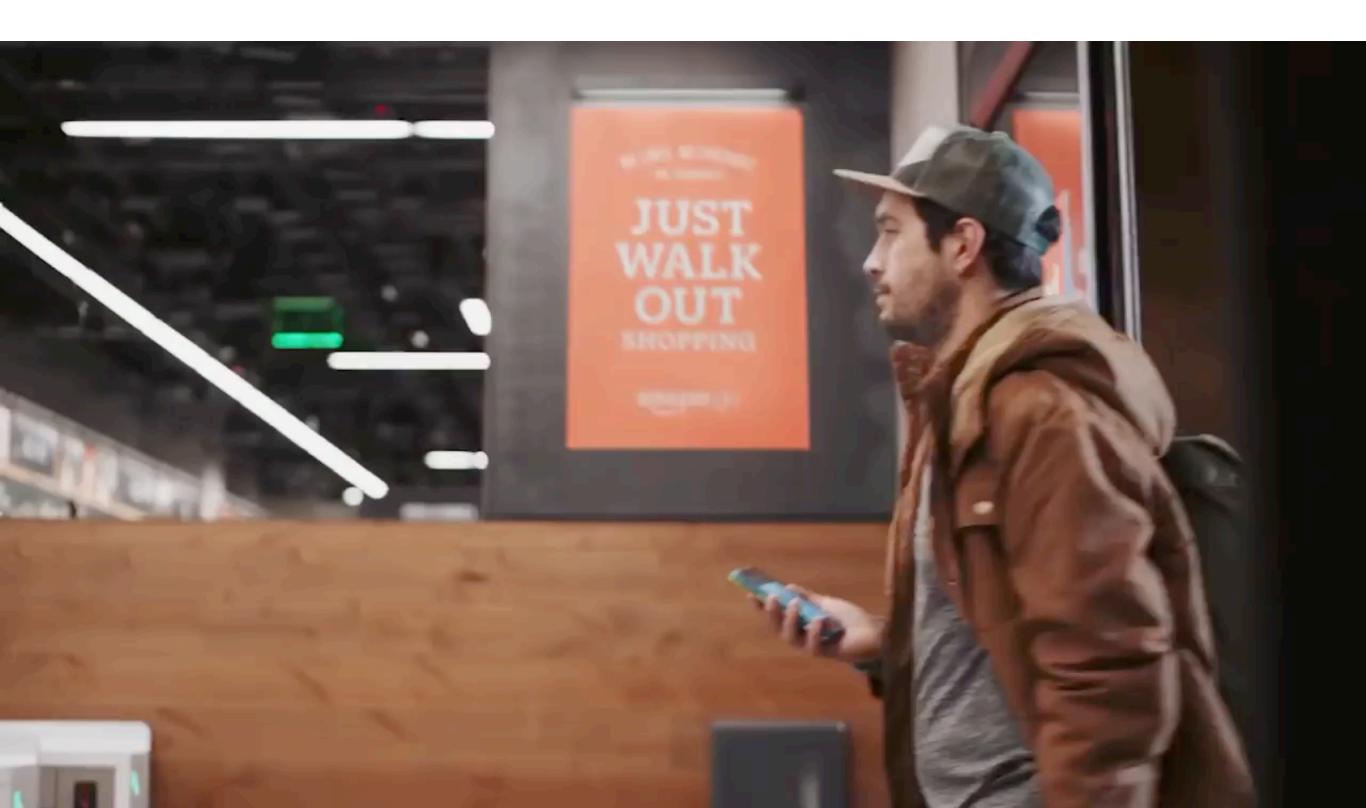


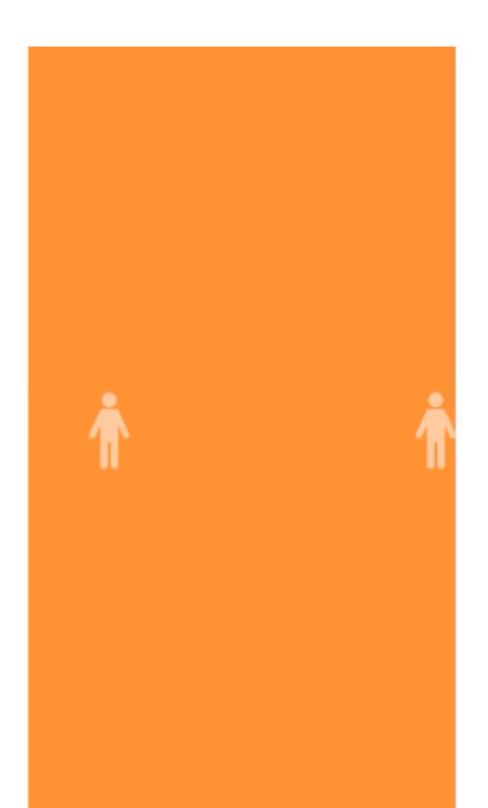


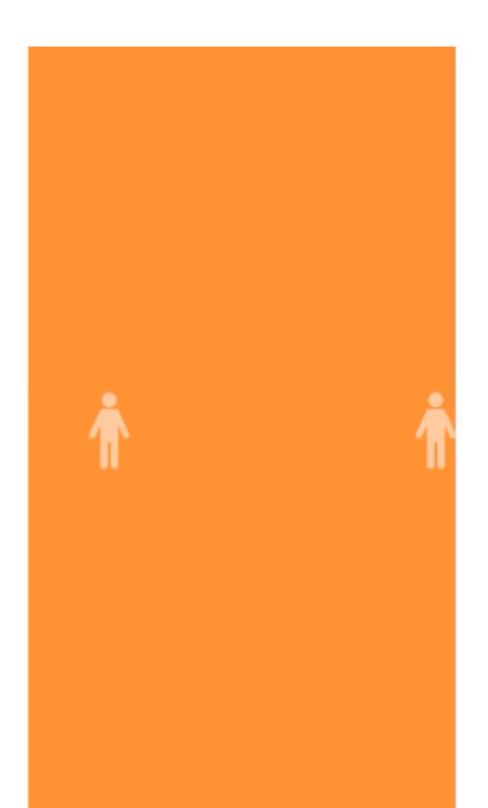
# The Long Wait ...



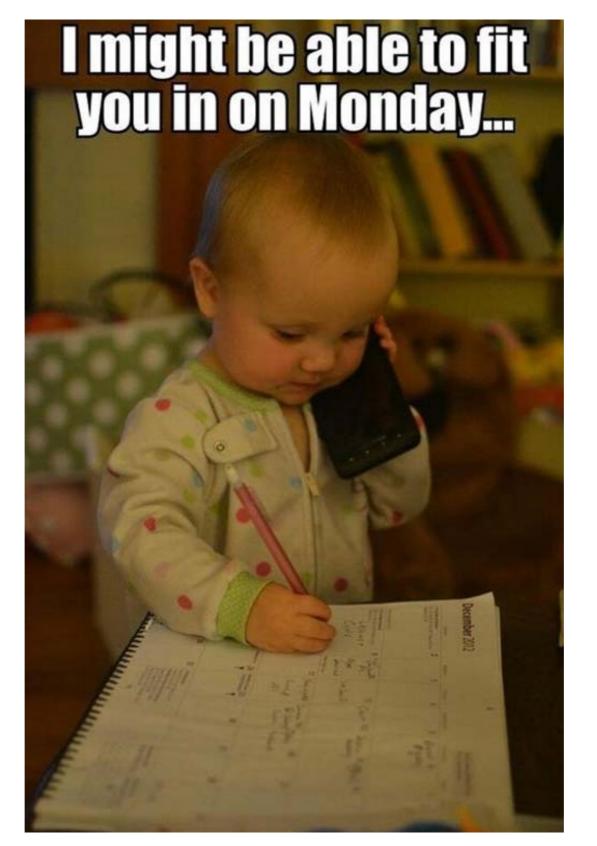




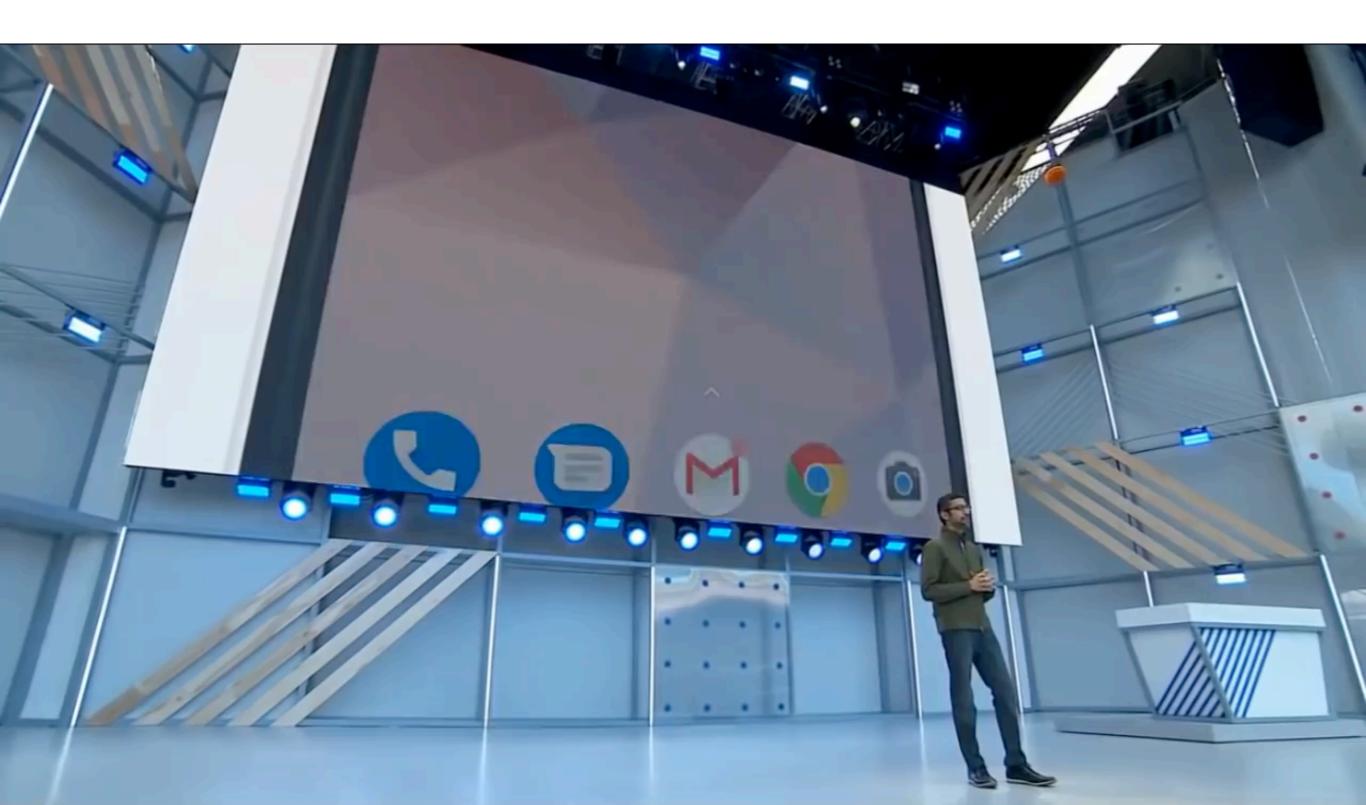




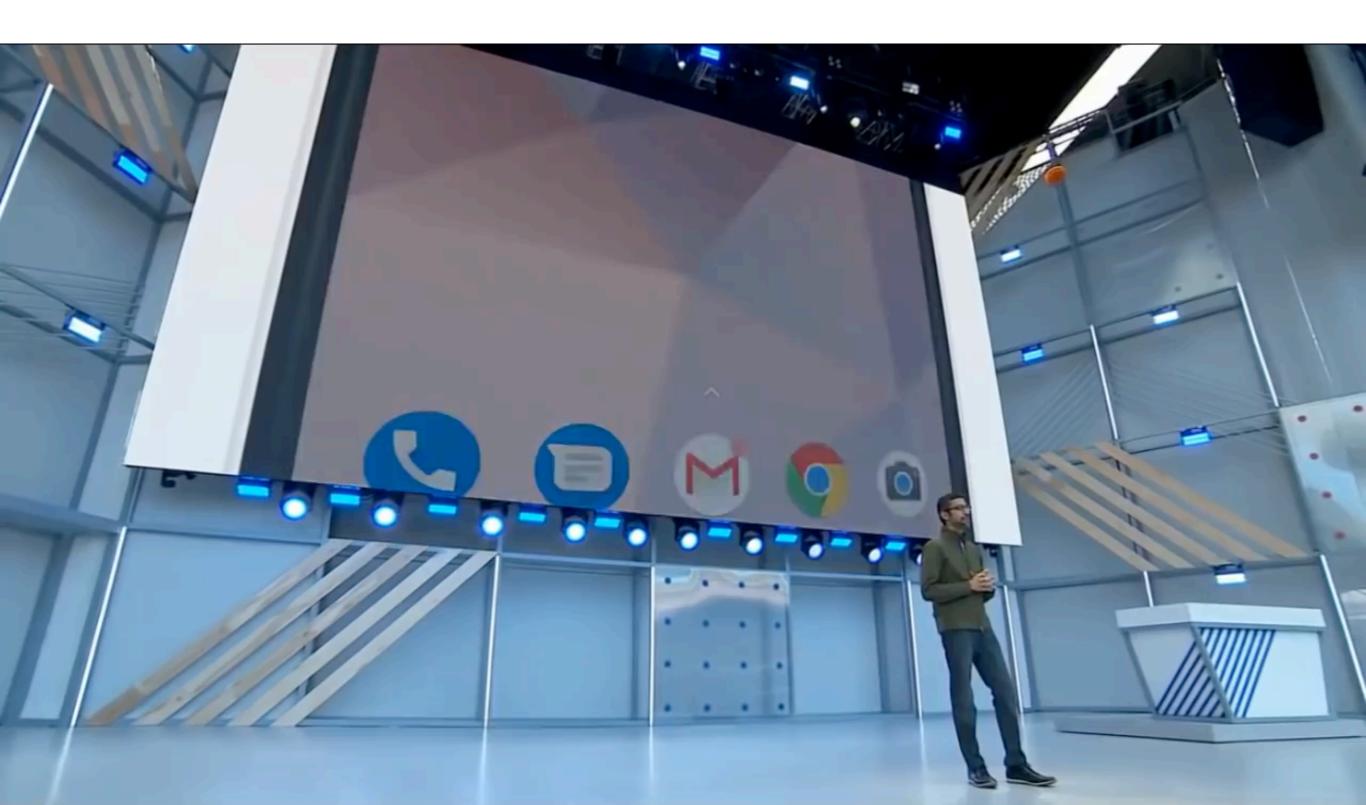
#### Never Liked To Call People!



# Google Duplex!



# Google Duplex!



#### Saving The Planet - One Watt A time



#### Saving The Planet - One Watt A time



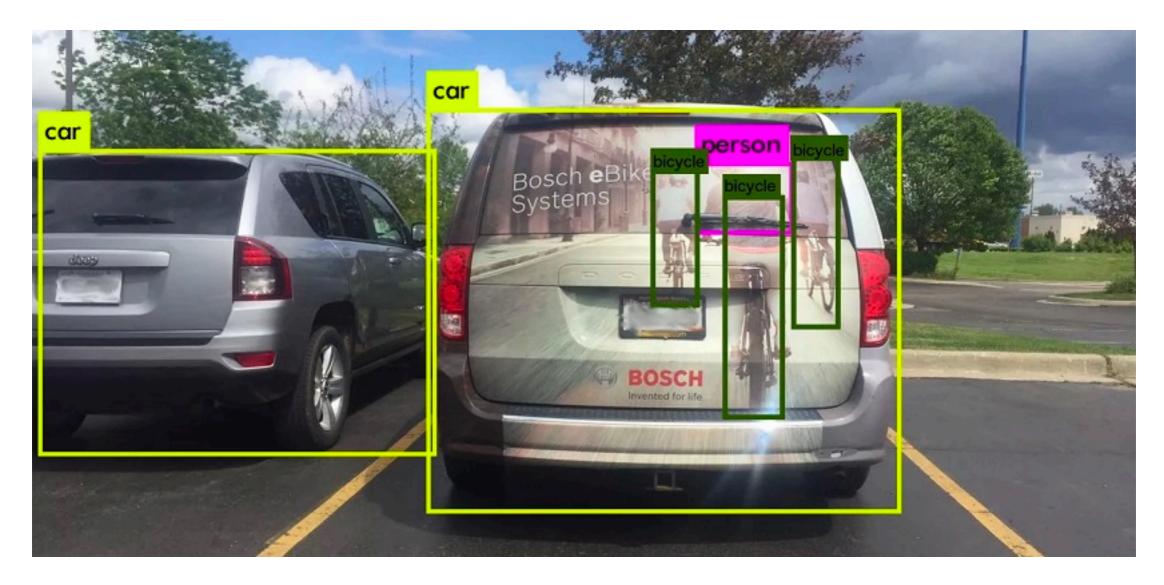
# Self Driving Car



# Self Driving Car



## Self Driving Car



#### Courtesy: Cognata

# ML for Farm



# ML for Farm



#### ML for Healthcare

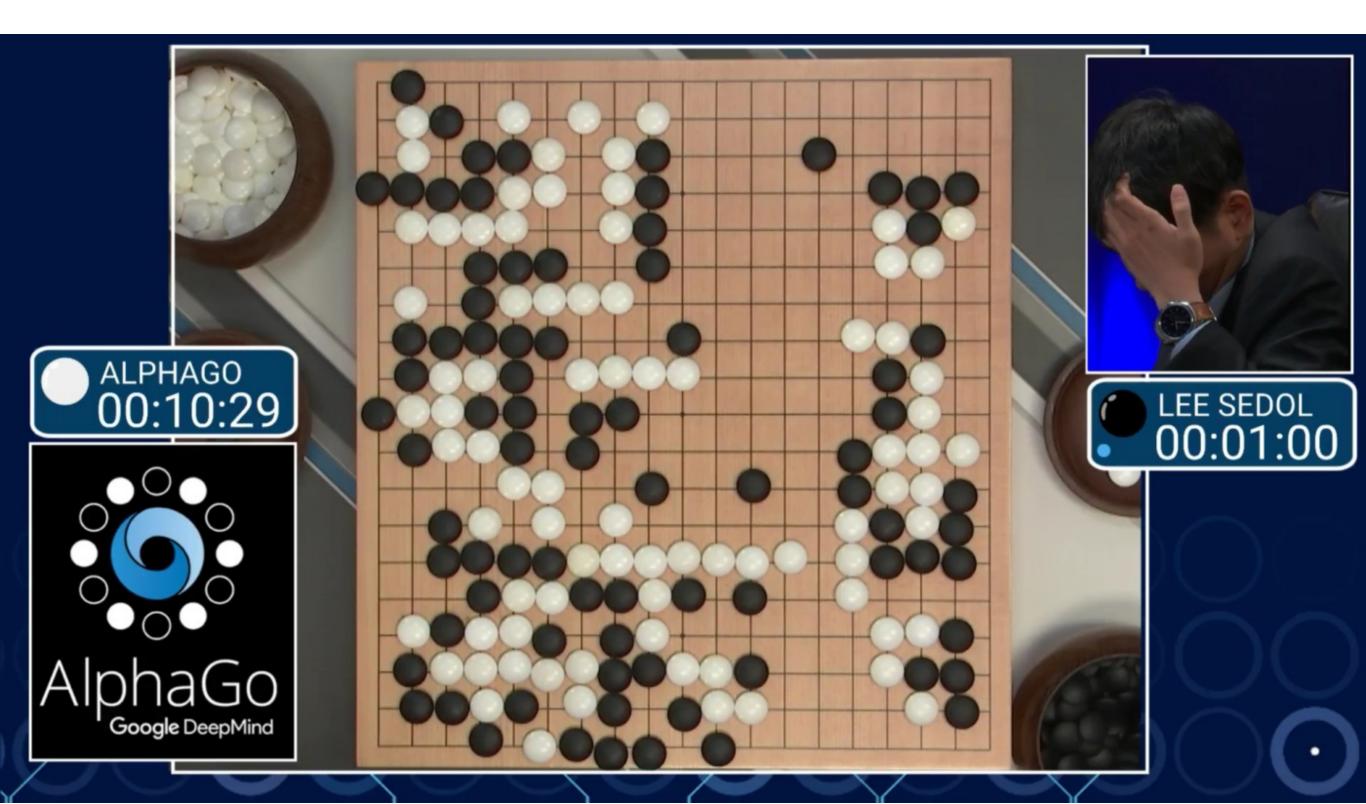
# WORLD ECONOMIC FORUM

#### ML for Healthcare

# WORLD ECONOMIC FORUM

# Auto Reply

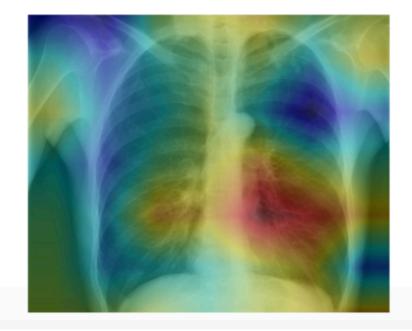
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Thanksgiving on I	vite you to join us fo November 22nd, be ase bring your favor	ginning		by	reque a new	m, erver appear sts (see atta release sin on. Is anyo	iched dash ce last nigh	boards). it, so I'm	There not sur	hasn't
Reply				→		Reply				
Reply		Ba	d sugges	Ĩ.		Reply			Ba	id suggi
Reply Count us in!	We'll be there!	Sorr	<u>d sugges</u> ry, we wor le to mak	tions? n't be		Reply eck on it.	I'll see if I ou			id sugge I'm on

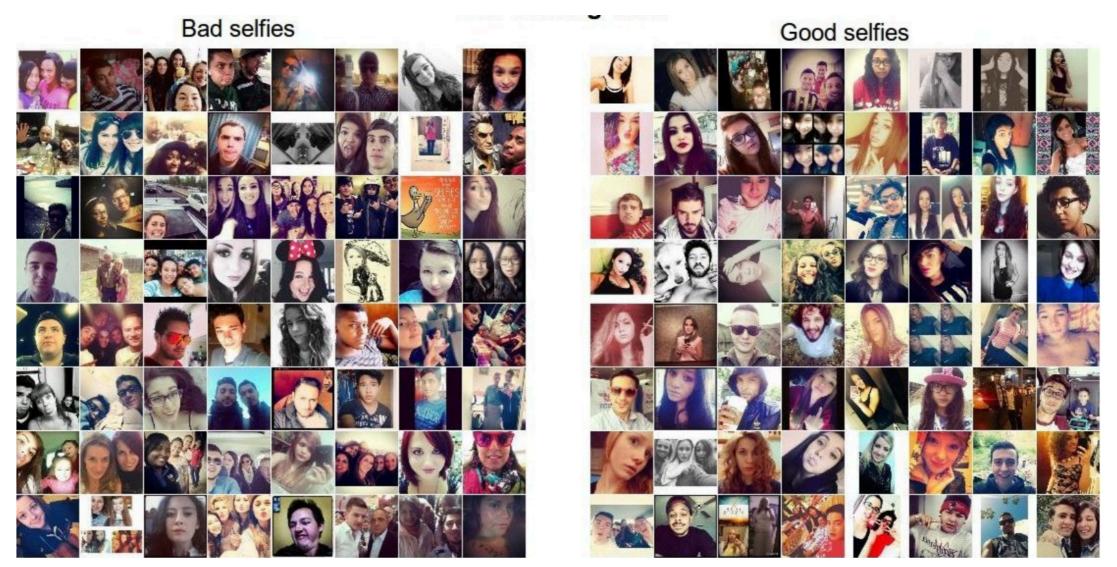




Input Chest X-Ray Image **CheXNet** 121-layer CNN

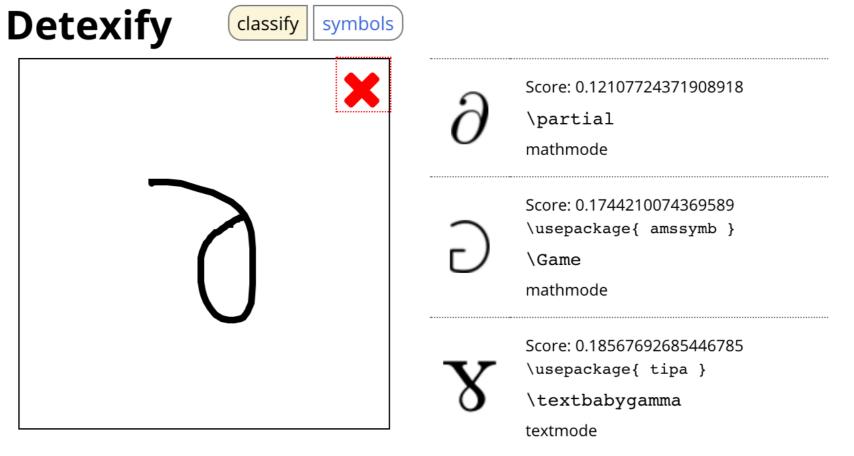
#### **Output** Pneumonia Positive (85%)





Example images showing good and bad selfies in our training data. These will be given to the ConvNet as teaching material.

- Face should occupy about 1/3 of the image.
- Cut off your forehead



#### Want a Mac app?

Lucky you. The Mac app is finally stable enough. See how it works on <u>Vimeo</u>. Download the latest version <u>here</u>.

*Restriction:* In addition to the LaTeX command the unlicensed version will copy a reminder to purchase a license to the clipboard when you select a symbol.

You can purchase a license here:

5

Buy Detexify for Mac

\textbabygamma
textmode

Score: 0.19845446379011045
\usepackage{ upgreek }
\upgamma
mathmode
Score: 0.19849650347374576

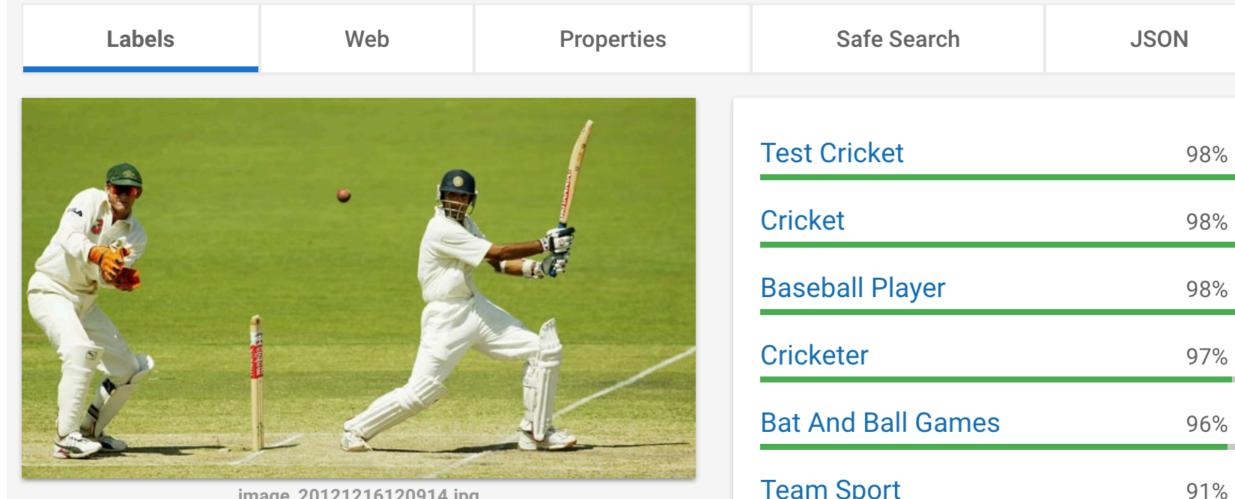


Score: 0.19849650347374576
\usepackage[T1]{fontenc}
\dh

textmode

The symbol is not in the list? Show more

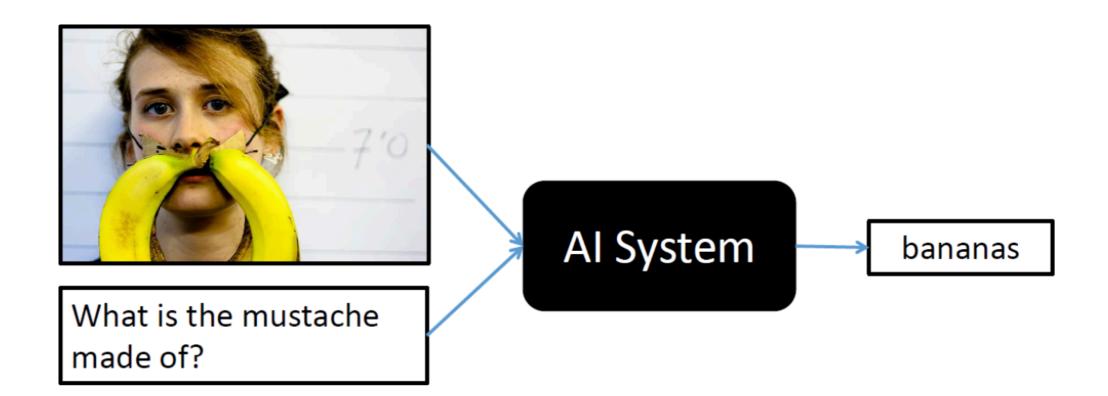
Did this help?



image\_20121216120914.jpg

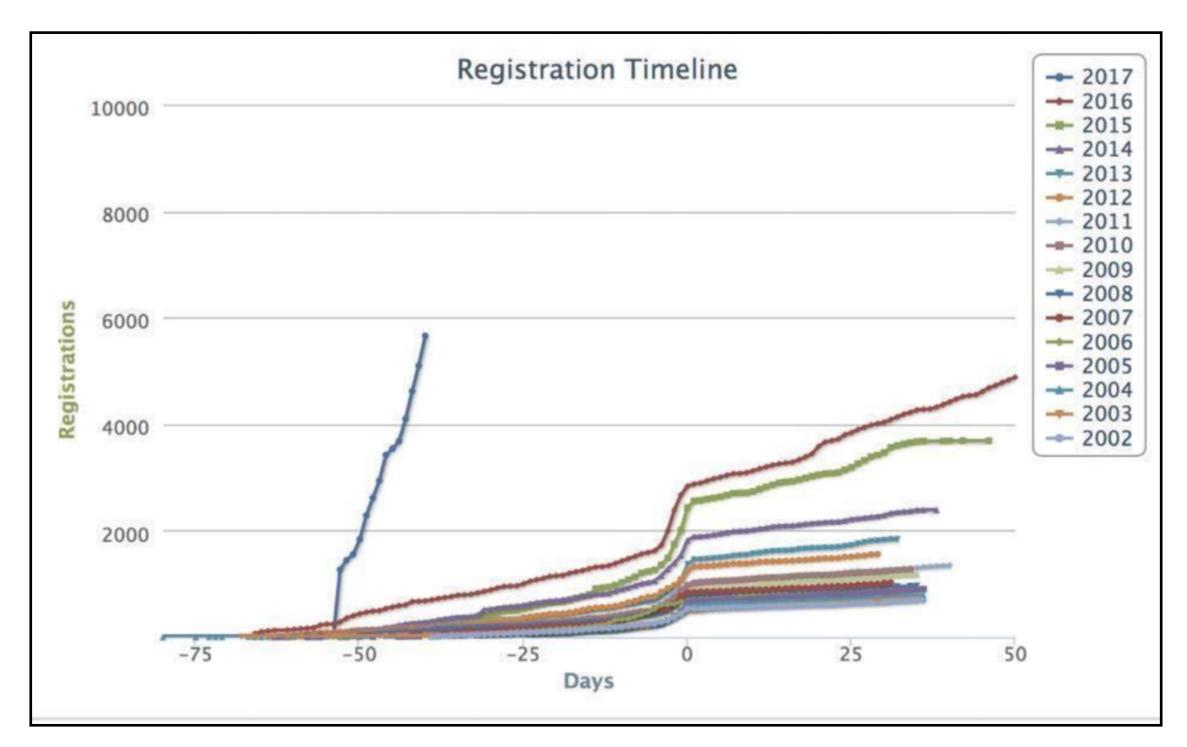
Baseball Player	98%
Cricketer	97%
Bat And Ball Games	96%
Team Sport	91%
Ball Game	88%
Games	86%
Sports	85%

#### Visual Q and A



#### NeurIPS registration

#### x=0 -> early registration deadline



## Machine Learning Gone Wrong

#### THEVERGE TECH - SCIENCE - CULTURE - CARS - REVIEWS - LONGFORM VIDEO MOR

④ STORYSTREAM TRANSPORTATION \ UBER \ RIDE-SHARING \



Uber's fatal self-driving crash: all the news and updates

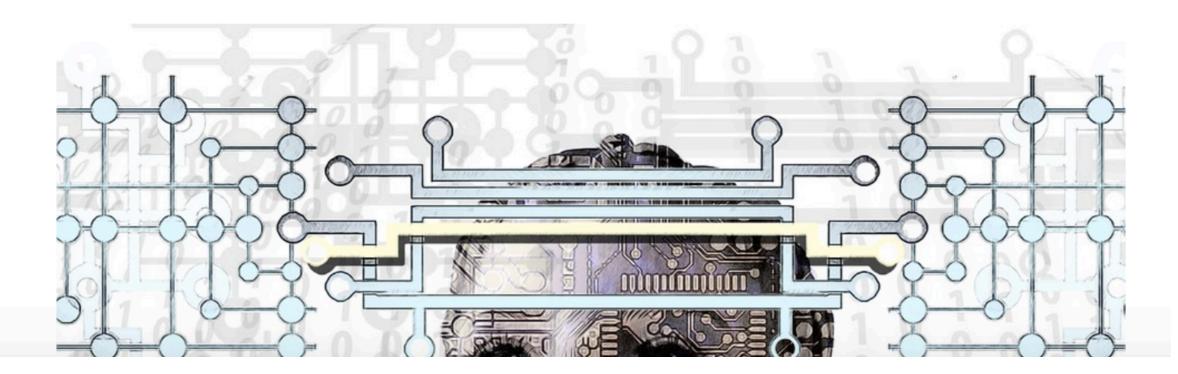
## Machine Learning Gone Wrong

Home > Cool Science > After Uber, Tesla Incidents, Can Artificial Intelligence Be Trusted?

## After Uber, Tesla Incidents, Can Artificial Intelligence Be Trusted?

April 13, 2018





## "Bias" in Machine Learning

ranslate		
French English Turkish Detect language +	**	English French Turkish - Trabelate
He is a babysitter She is a doctor	×	O bir bebek bakıcısı O bir doktor
•) 🜷 📼 •	34/5000	* ③ •) く
rench English Turkish Detect language -	*	English French Turkish - Translate
D bir bebek bakıcısı D bir doktor	×	She's a babysitter He is a doctor
• • • • •	33/5000	11 10 10 1

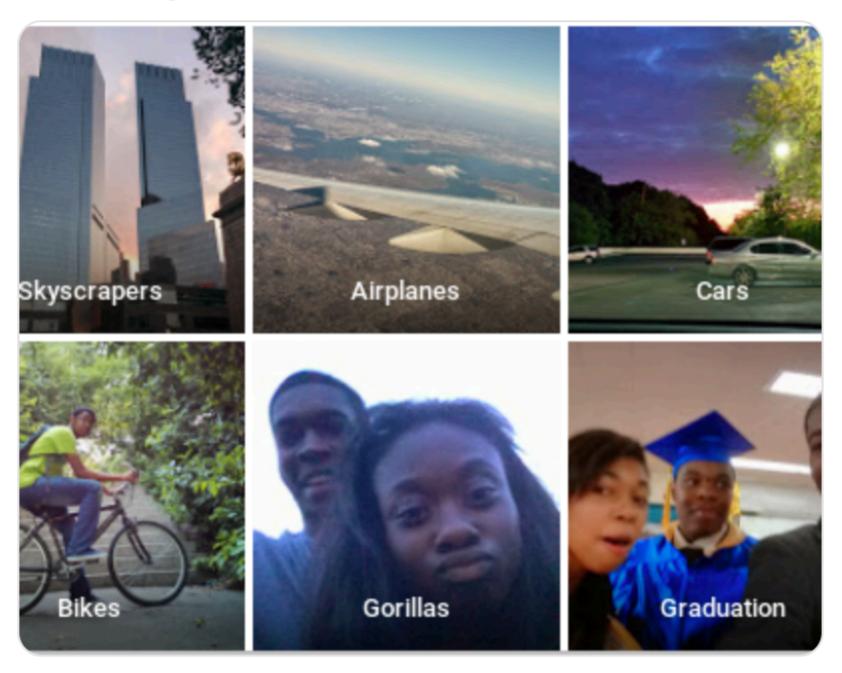
24

#### "Bias" addressed

ズ <sub>A</sub> Text Docum	ents					
TURKISH - DETECTED	ENGLISH	SPANISH	FRENCH	$\checkmark$	Ę	TURKISH ARABIC ENGLISH V
o bir doktor				€	×	Translations are gender-specific. LEARN MORE
						she is a doctor (feminine)
•				12/5000	<i>P</i> <sup>1</sup>	he is a doctor (masculine)

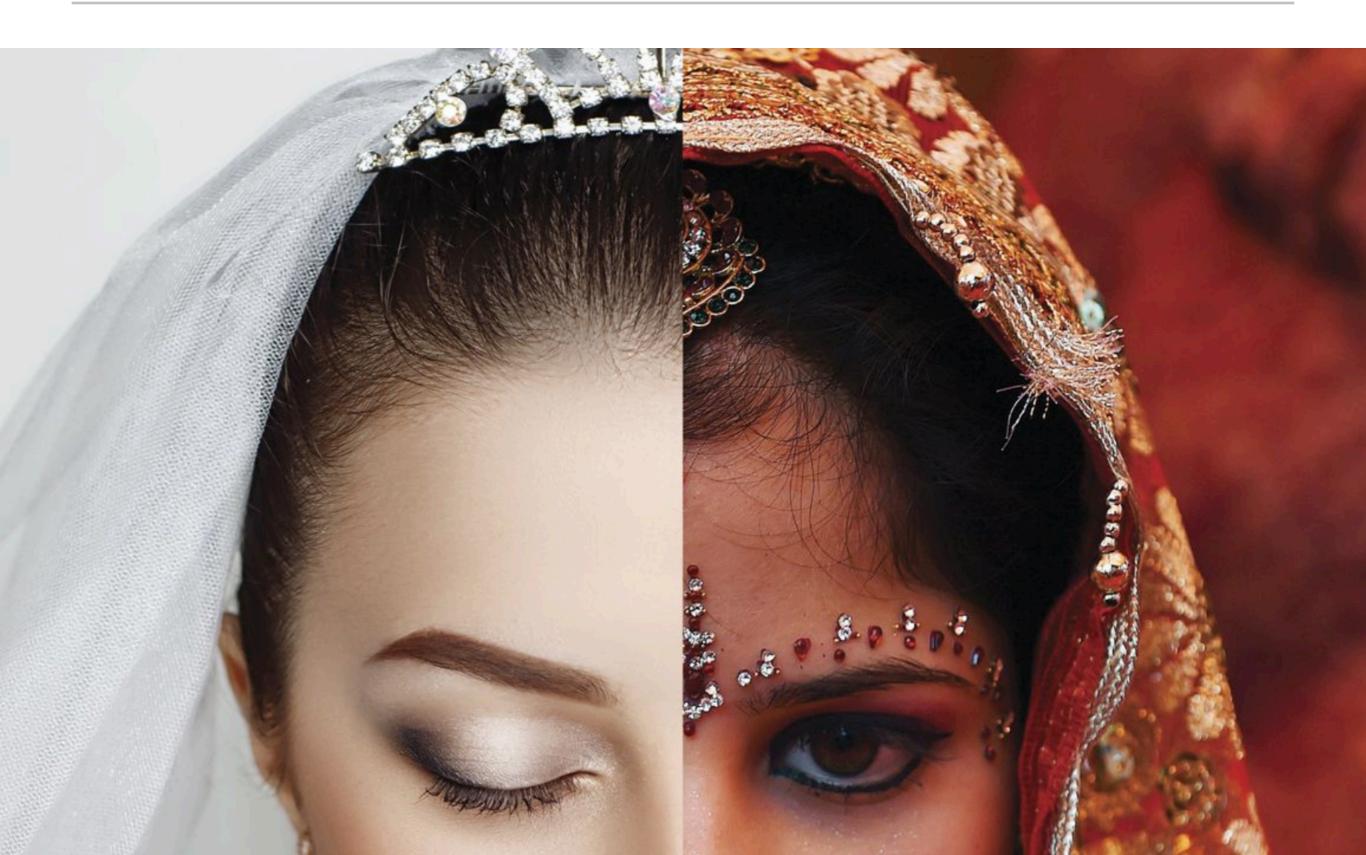
#### "Racist" Machine Learning?

#### not a gorilla.



6:22 PM - 28 Jun 2015

#### Where is the bride?



#### "Bias" addressed

#### "Bias" addressed

## A "reality" check



## A "reality" check

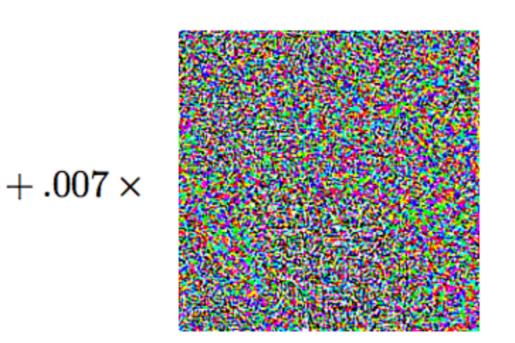


#### Adversaries!



 $\boldsymbol{x}$ 

"panda" 57.7% confidence



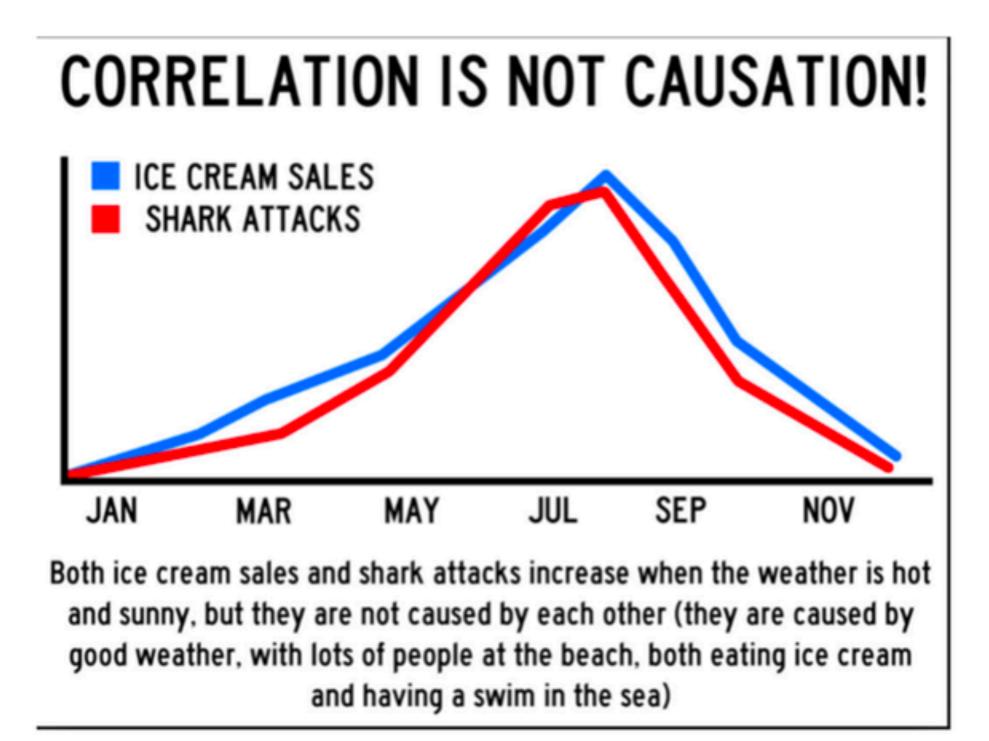
 $\operatorname{sign}(\nabla_{\boldsymbol{x}} J(\boldsymbol{\theta}, \boldsymbol{x}, y))$ 

"nematode" 8.2% confidence



 $m{x} + \epsilon \operatorname{sign}(
abla_{m{x}} J(m{ heta}, m{x}, y))$ "gibbon" 99.3 % confidence

#### Causality v.s. Correlation



 "Field of study that give computers the ability to learn without being explicitly programmed" - Arthur Samuel [1959]  "Field of study that give computers the ability to learn without being explicitly programmed" - Arthur Samuel [1959]

- "Field of study that give computers the ability to learn without being explicitly programmed" - Arthur Samuel [1959]
- "A computer program is said to learn from experience E with respect to some class of tasks T and performance measure P if its performance at tasks in T, as measured by P, improves with experience E." - Tom Mitchell



**CheXNet** 121-layer CNN

#### **Output** Pneumonia Positive (85%)



Input Chest X-Ray Image

#### **Output** Pneumonia Positive (85%)



Task

**CheXNet** 121-layer CNN

Input Chest X-Ray Image

Performance measure **Output** Pneumonia Positive (85%)



Task

**CheXNet** 121-layer CNN



Input Chest X-Ray Image

Experience 1000s of <image, disease> pairs Performance measure **Output** Pneumonia Positive (85%)



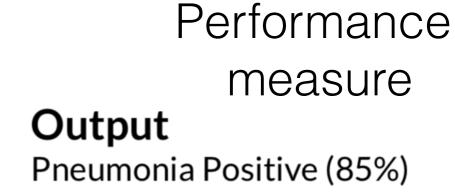
Task

**CheXNet** 121-layer CNN



Input Chest X-Ray Image

Experience 1000s of <image, disease> pairs





**Input** Chest X-Ray Image Task

**CheXNet** 121-layer CNN



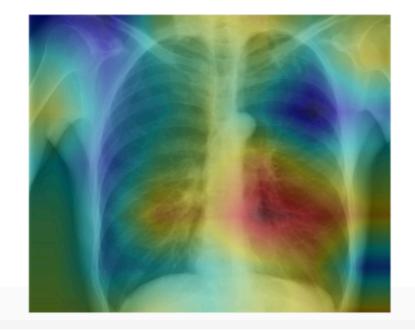
Experience 1000s of <image, disease> pairs



**Input** Chest X-Ray Image Task

**CheXNet** 121-layer CNN

#### **Output** Pneumonia Positive (85%)

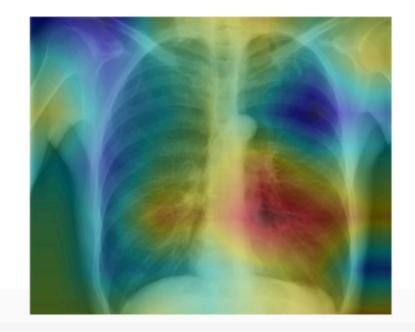


Experience 1000s of <image, disease> pairs



**CheXNet** 121-layer CNN

#### **Output** Pneumonia Positive (85%)



Input Chest X-Ray Image

Experience 1000s of <image, disease> pairs





**CheXNet** 121-layer CNN



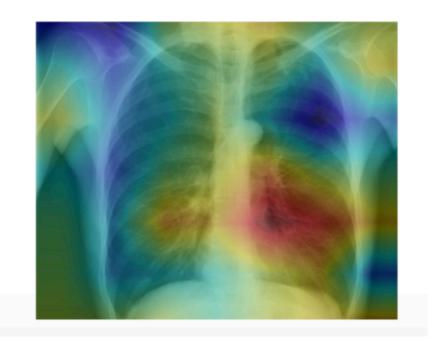
Input Chest X-Ray Image

Experience 1000s of <image, disease> pairs

Supervised Learning Output Pneumonia Positive (85%)



**CheXNet** 121-layer CNN



Input Chest X-Ray Image

#### Google Classroom and Website

# Google Classroom code: cgt6rwd

# Website: <u>https://sites.google.com/</u> <u>view/es654-2020/</u>

#### Announcement

 Saturday, 11th Jan: Extra lecture(s) at 10 AM in 1/101 in lieu of 15th Jan (institute holiday)