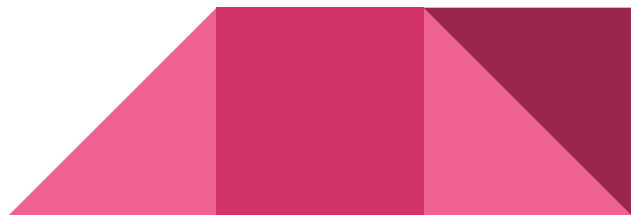


# Visual Datasets and Bias

Do datasets provide a *good* representation of the world?

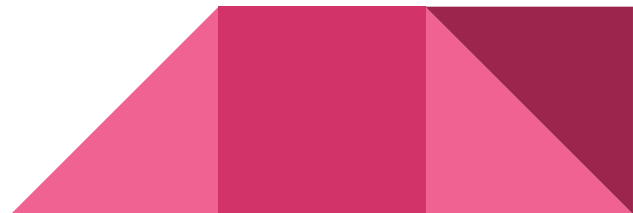
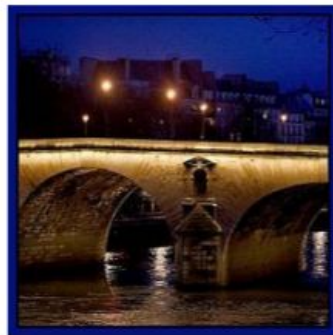
# Visual Data is Inherently Biased

- Internet is a tremendous repository of visual data (Flickr, YouTube, Picassa, etc)
- But it's not random samples of visual world

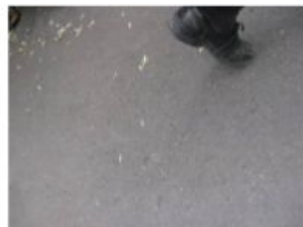
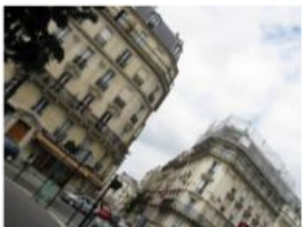
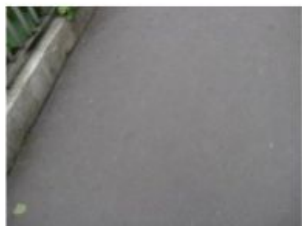




# Flickr Paris



# Sampled Alyosha Efros's Paris



# Sampling Bias

- People like to take pictures on vacation



# Photographer Bias

- People want their pictures to be recognizable and/or interesting



VS.



# Social Bias



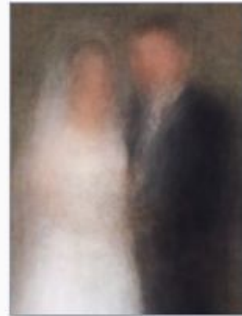
Little Leaguer



Kids with Santa



The Graduate



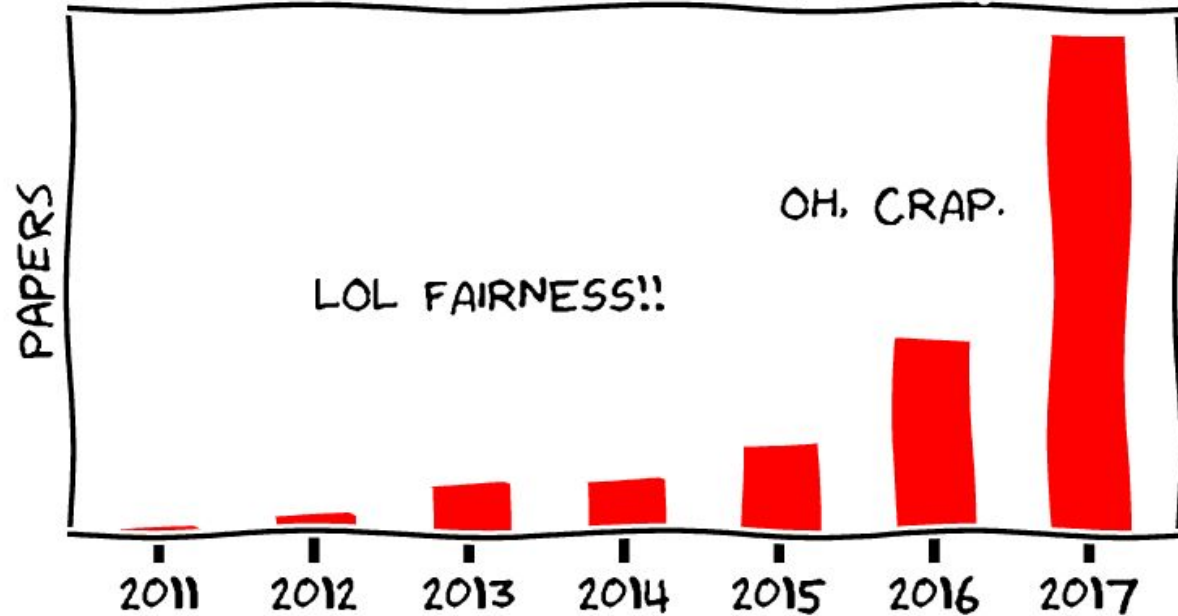
Newlyweds

**“100 Special Moments” by Jason Salavon**





## BRIEF HISTORY OF FAIRNESS IN ML





# Where does bias come from?

## Collection:

- Demographic, geographic, behavioral, temporal biases,

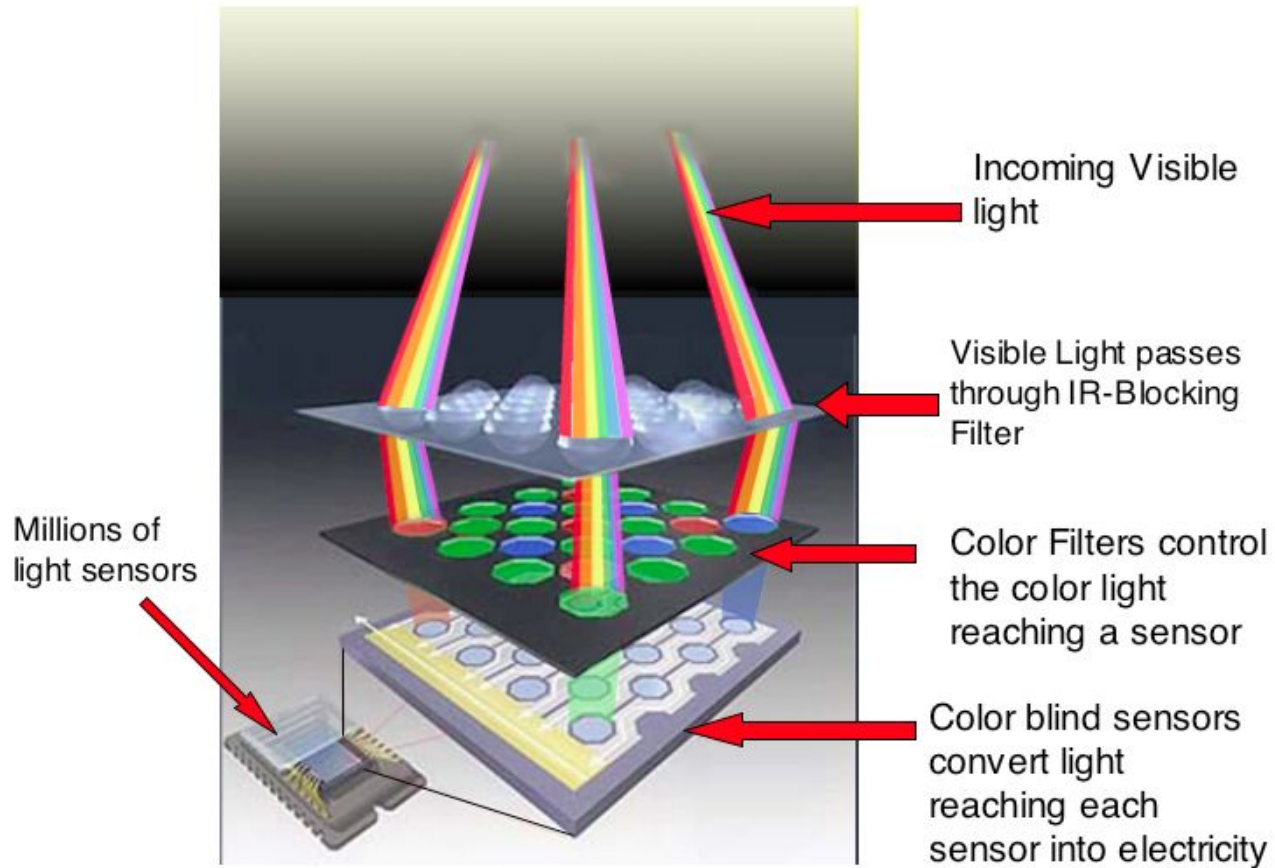
## Measurement:

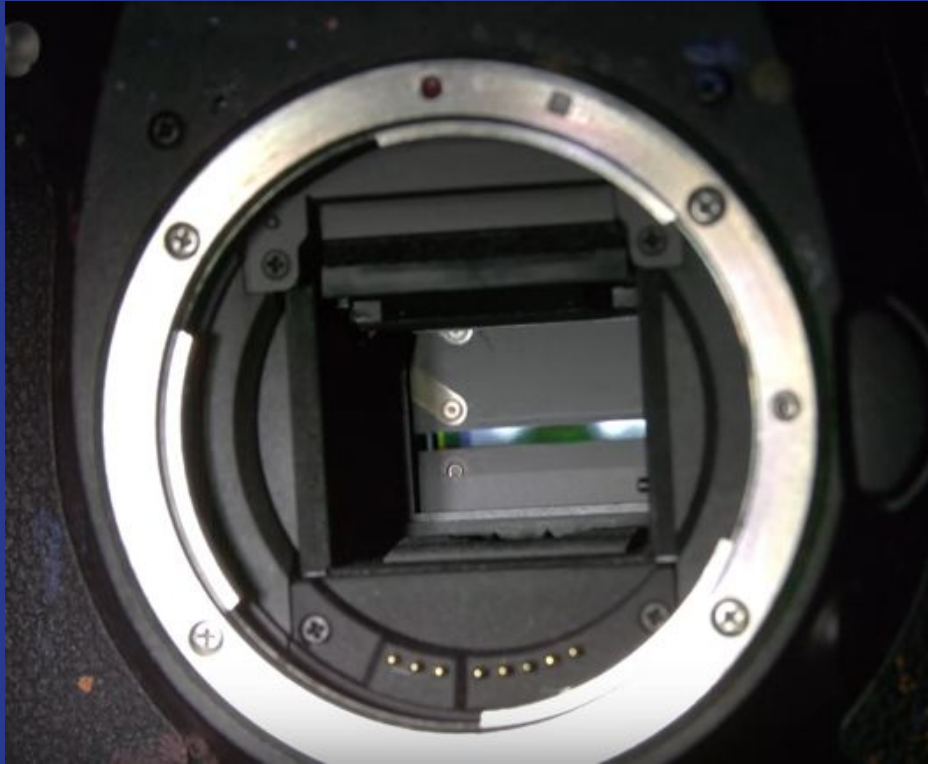
- What do we choose to measure? How do we measure (e.g., *grit*)?

## Pre-existing biases

- gender roles in text and images, racial stereotypes in language
- 

# RGB Inside the Camera





<https://www.youtube.com/watch?v=CmjeCchGRQo&t=361s>