







#### November 8<sup>th</sup>

Election day

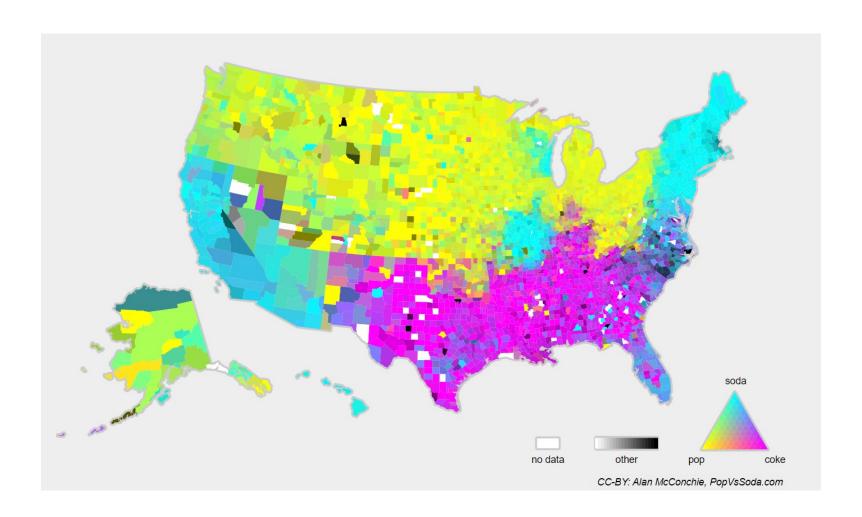
Option A: Cancel class

 Option B: Hold extended reading group for those that can come

# Distribution shift

Eric Wong 9/8/2022

# Pop vs Soda



#### Content moderation

92.2% average test accuracy, but...

Demographic	Test accuracy on non-toxic comments
Male	87.3 (0.7)
Female	$89.0 \; (0.6)$
LGBTQ	74.6 (0.5)
Christian	92.1 (0.2)
Muslim	80.9 (1.0)
Other religions	86.1 (0.1)
Black	<b>69.2</b> $(1.3)$
White	71.2(1.4)

Borkan et al. 2019 "Nuanced Metrics for Measuring Unintended Bias with Real Data for Text Classification"

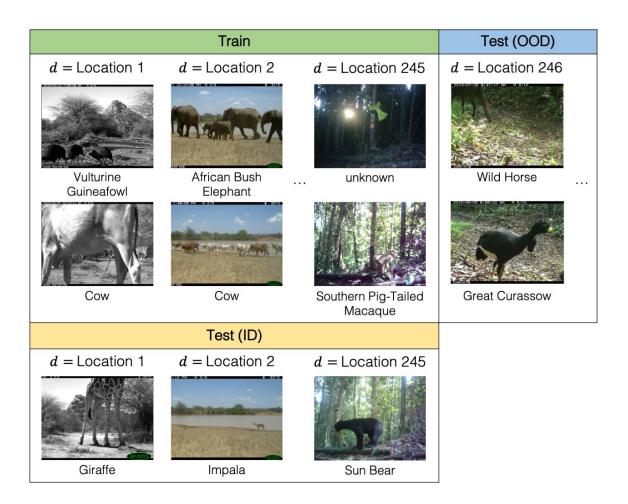


 10 datasets with distribution shift, ranging from ecological conservation to medical imaging.

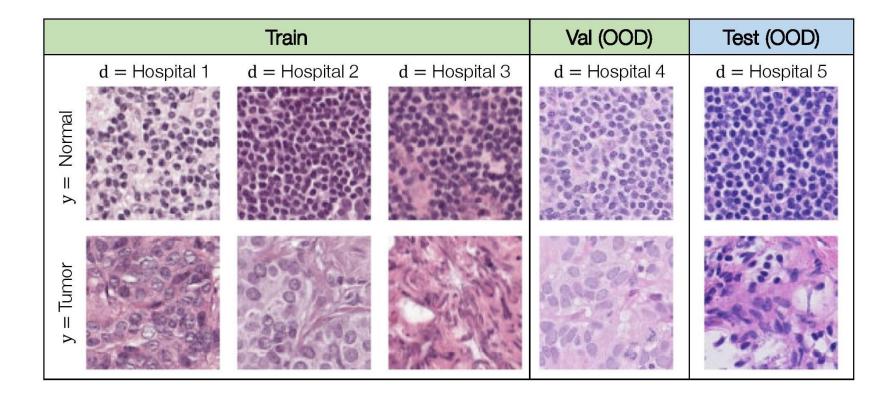
WILDS 2.0 adds unlabeled data for 8 datasets.

Koh\*, Sagawa\*, Marklund, Xie, Zhang, Balsubramani, Hu, Yasunaga, Phillips, Gao, Lee, David, Stavness, Guo, Earnshaw, Haque, Beery, Leskovec, Kundaje, Pierson, Levine, Finn, Liang. WILDS: A Benchmark of in-the-Wild Distribution Shifts. ICML 2021.

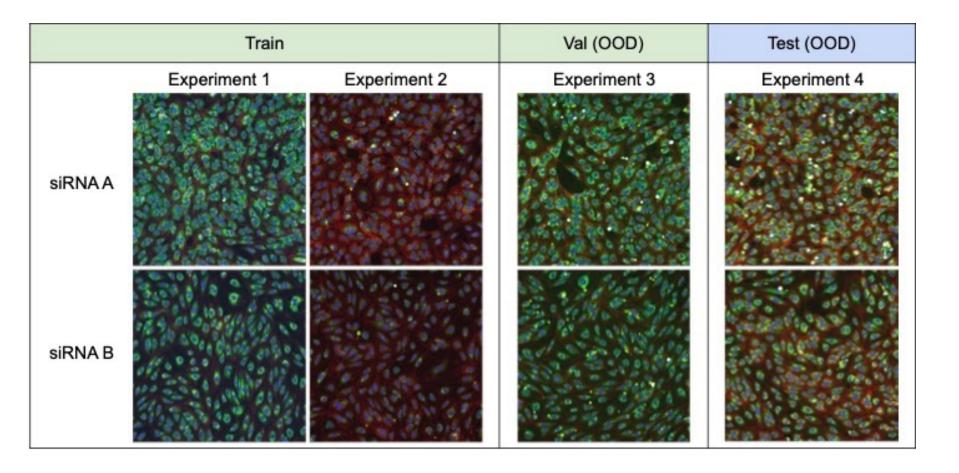
### iWildCam



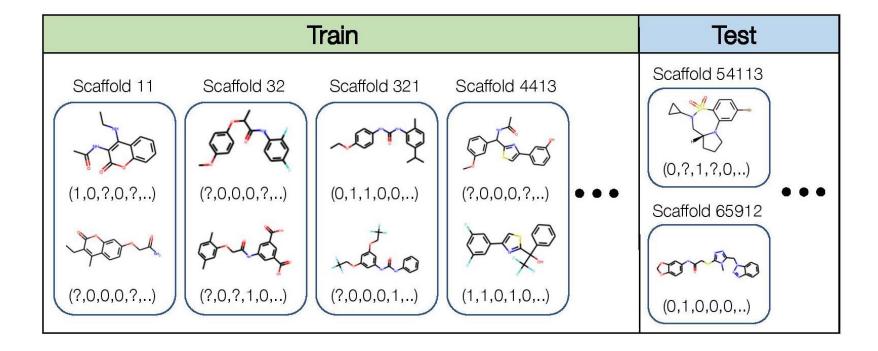
# Camelyon17



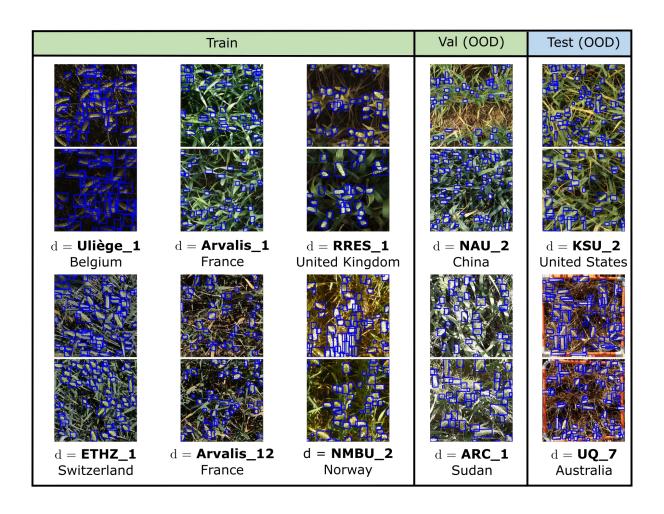




#### OGB-MolPCBA



#### GlobalWheat



## CivilComments

Toxic	Comment Text	Male	Female	LGBTQ	White	Black	 Christian
0	I applaud your father. He was a good man! We need more like him.	1	0	0	0	0	 0
0	As a Christian, I will not be patronizing any of those businesses.	0	0	0	0	0	 1
0	What do Black and LGBT people have to do with bicycle licensing?	0	0	1	0	1	 0
0	Government agencies track down foreign baddies and protect lawabiding white citizens. How many shows does that describe?	0	0	0	1	0	 0
1	Maybe you should learn to write a coherent sentence so we can understand WTF your point is.	0	0	0	0	0	 0

## FMoW

		Train	Test		
Satellite Image (x)					
Year / Region (d)	2002 / Americas	2009 / Africa	2012 / Europe	2016 / Americas	2017 / Africa
Building / Land Type (y)	shopping mall	multi-unit residential	road bridge	recreational facility	educational institution

# PovertyMap

	Train			Test		
Satellite image (x)						
Country / Urban-rural (d)	Angola / urban	Angola / rural	Angola / urban	Kenya / urban	Kenya / rural	
Asset index (y)	0.259	-1.106	2.347	0.827	0.130	

## Amazon

	Reviewer ID (d)	Review Text (x)	Stars (y)
	Reviewer 1	They are decent shoes. Material quality is good but the color fades very quickly. Not as black in person as shown.	5
		Super easy to put together. Very well built.	5
_	Reviewer 2	This works well and was easy to install. The only thing I don't like is that it tilts forward a little bit and I can't figure out how to stop it.	4
Train		Perfect for the trail camera	5
	Reviewer 10,000	I am disappointed in the quality of these. They have significantly deteriorated in just a few uses. I am going to stick with using foil.	1
2-		Very sturdy especially at this price point. I have a memory foam mattress on it with nothing underneath and the slats perform well.	5
	Reviewer 10,001	Solidly built plug in. I have had 4 devices plugged in and all charge just fine.	5
Test		Works perfectly on the wall to hang our wreath without having to do any permanent damage.	5

# Py150

	Repository ID ( $d$ )	Source code context $(x)$	Next tokens ( $oldsymbol{y}$ )
Train	Repository 1	<pre> from easyrec.gateway import EasyRec <eol> gateway = EasyRec('tenant','key') <eol> item_type = gateway.</eol></eol></pre>	get_item_type
		<pre> response = gateway.get_other_users() <eol> get_params = HTTPretty.</eol></pre>	last_request
	Repository 2	<pre>import numpy as np <eol> if np.linalg.norm(target - prev_target) &gt; far_threshold: <eol> norm = np.</eol></eol></pre>	linalg
		<pre> new_trans = np.zeros((n_beats + max_beats, n_beats) <eol> new_trans[:n_beats,:n_beats] = np.</eol></pre>	max
	i i		
Test	Repository 6,001	if e.errno == errno.ENOENT: <eol> continue <eol> p = subprocess.Popen () <eol> stdout = p.</eol></eol></eol>	communicate
		<pre> command = shlex.split(command) <eol> command = map(str, command) <eol> env = os.</eol></eol></pre>	environ
	i i		