# UNDERSTANDING AND PREDICTING IMAGE MEMORABILITY AT A LARGE SCALE

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## QUICK DEMO

LaMem Demo

## POPULARITY DATA

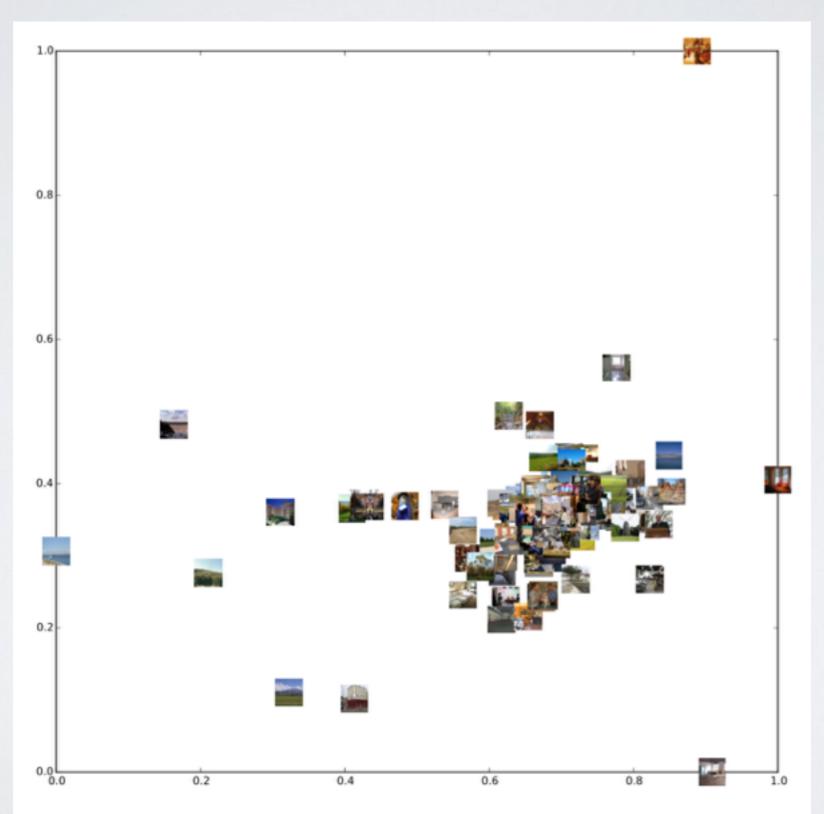
- · Random sample of scene categories from SUN dataset.
- Task was to press the space bar whenever they saw an identical repeat of an image at any time in the sequence.
- Memorability score defined as percentage of correct detections.
- 2,222 target images.

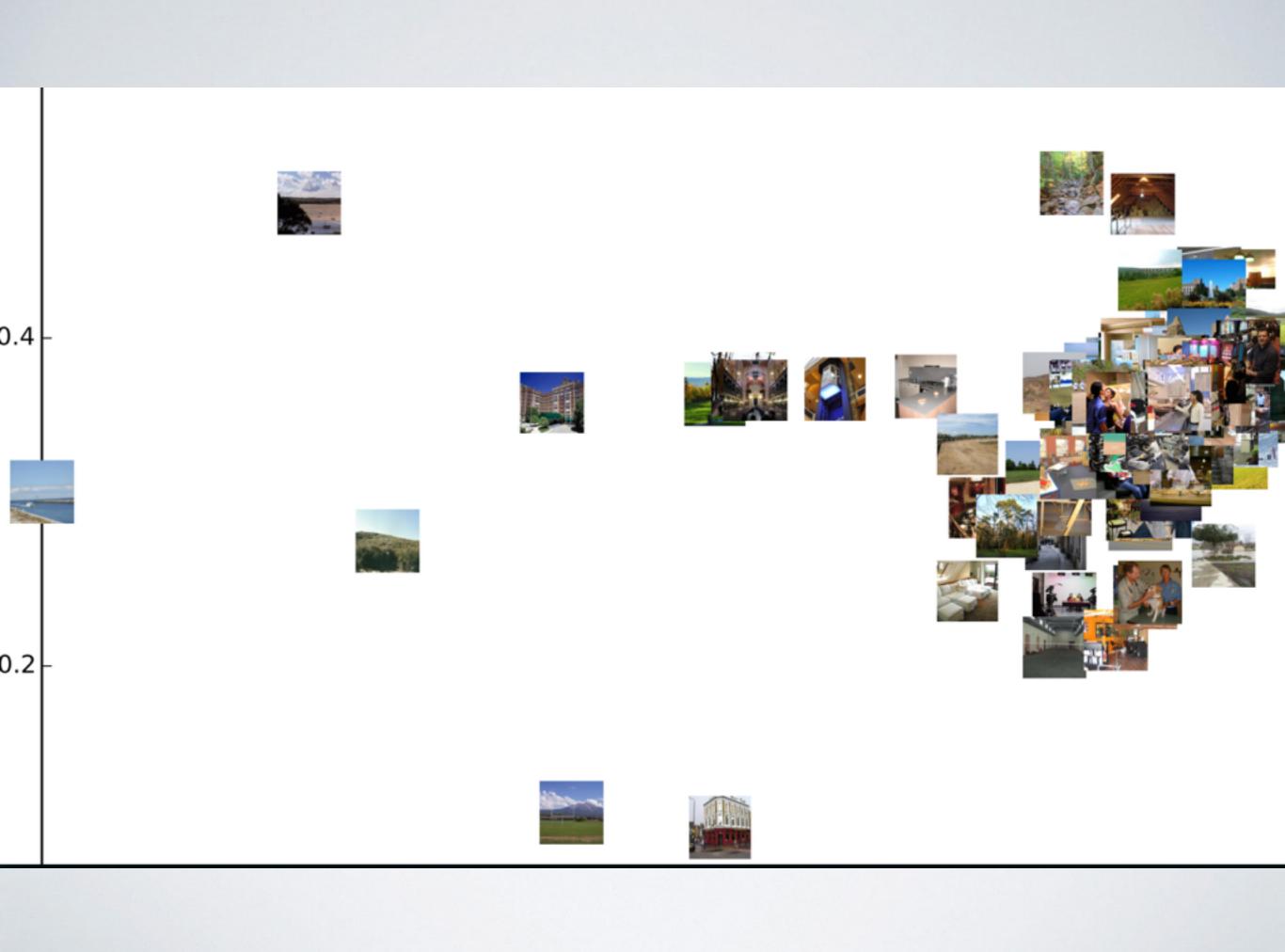
## RANK CORRELATION

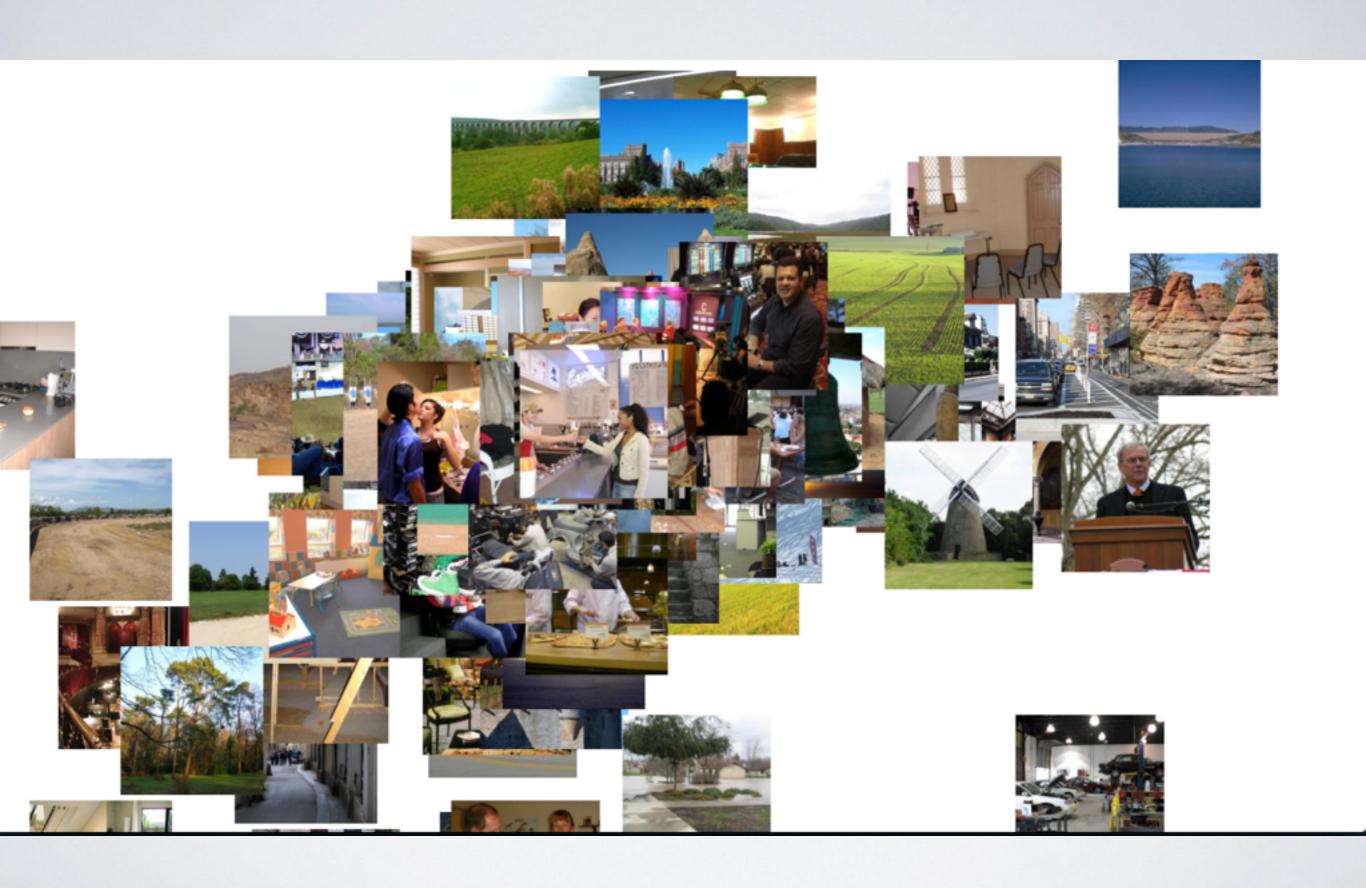
|                 | Human<br>Performance | State of the<br>Art | MemNet |
|-----------------|----------------------|---------------------|--------|
| Popularity Data | 0.75                 | 0.54*               | 0.52   |

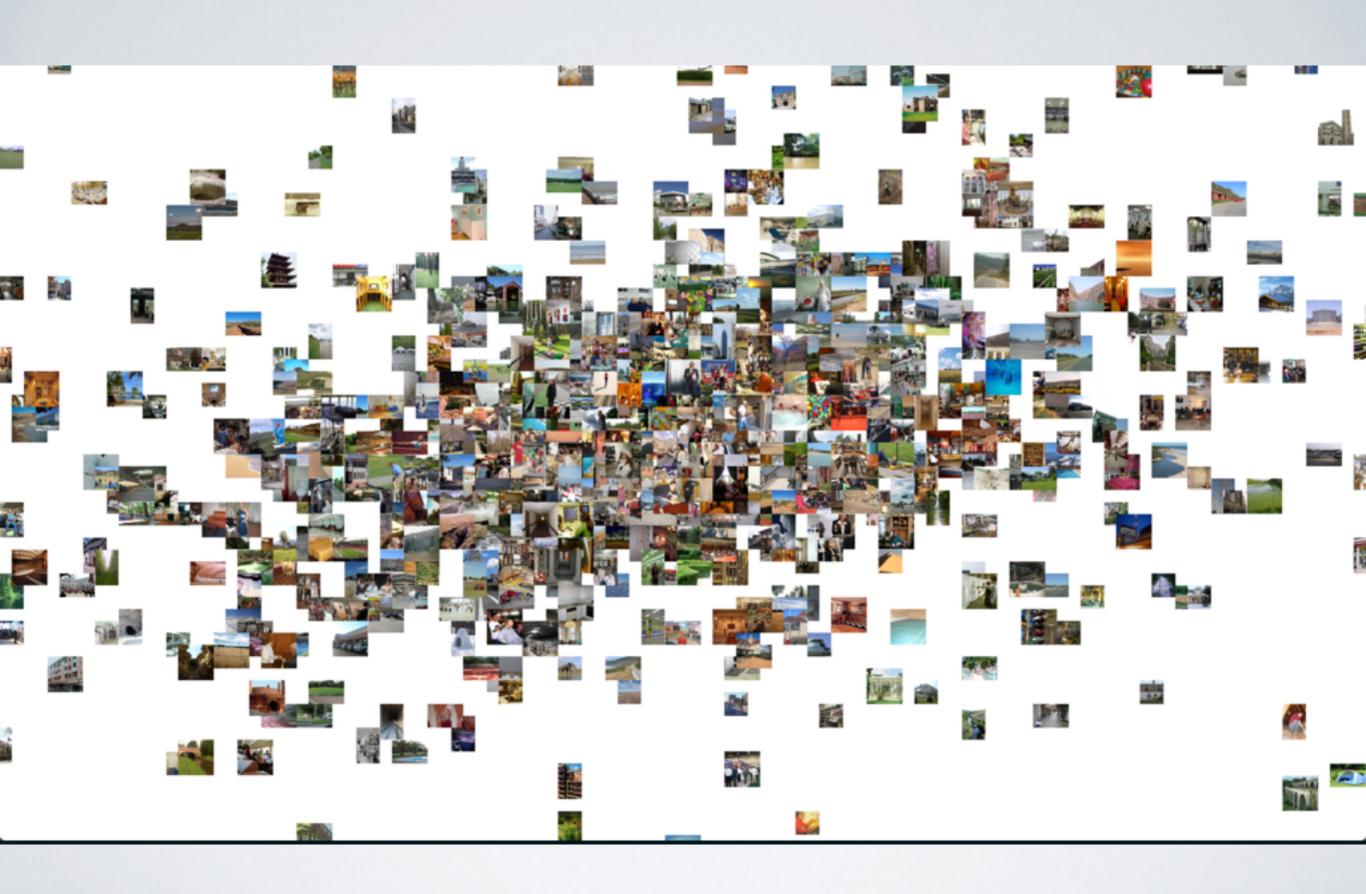
<sup>\*</sup> Isola, P., Xiao, J., Torralba, A., Oliva, A. What makes an image memorable? IEEE Conference on Computer Vision and Pattern Recognition (CVPR), 2011. Pages 145-152.

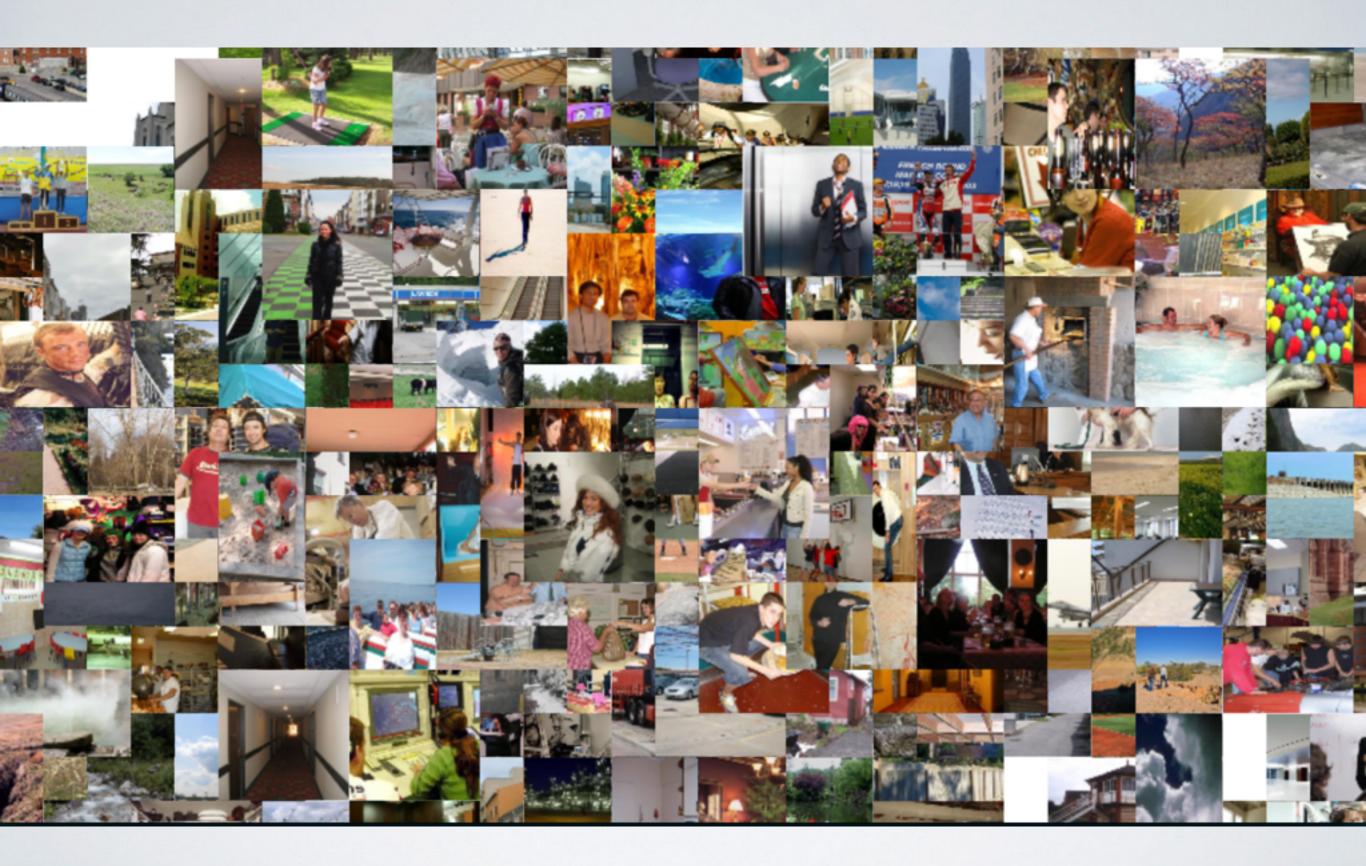
## T-SNE EMBEDDINGS







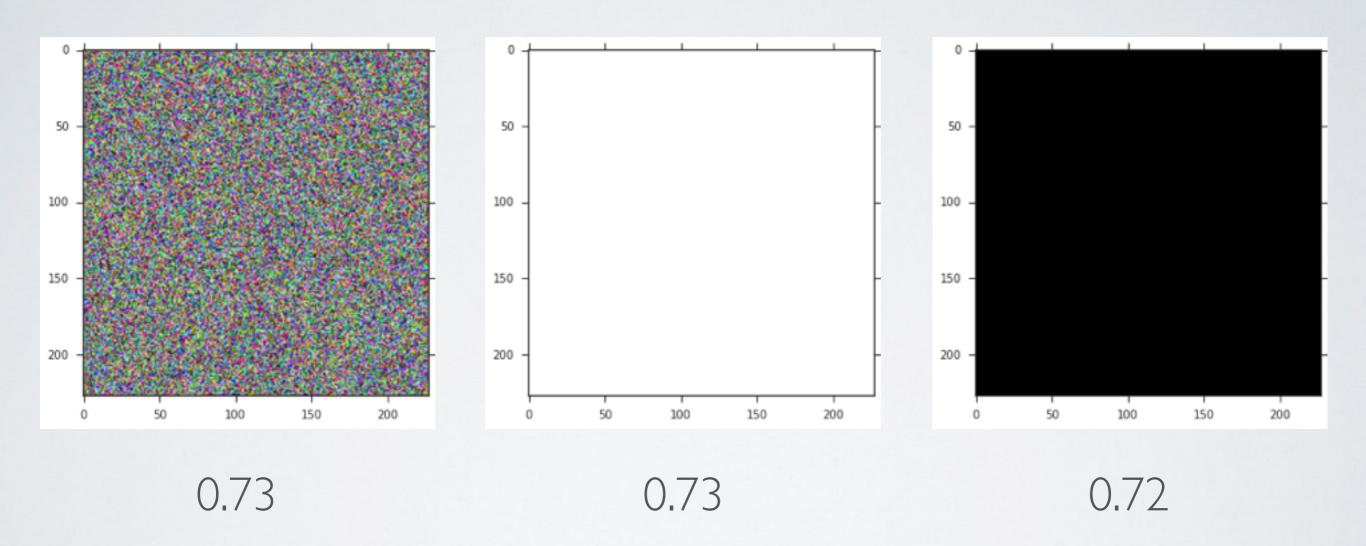




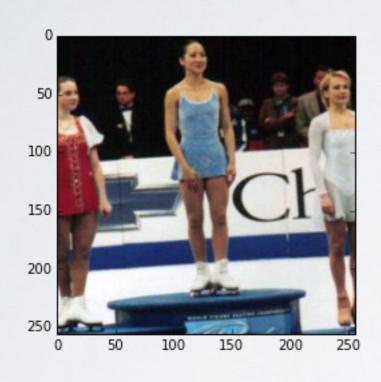
## DO PEOPLE MAKE IMAGES MEMORABLE?

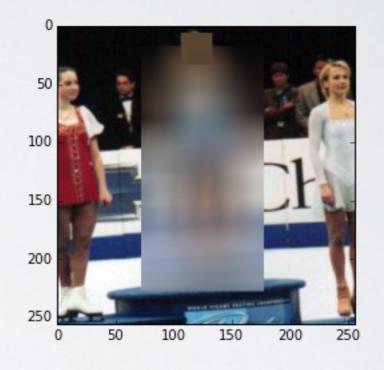
- 17.8% of the data have pedestrians detected in them.
- 2.4% have faces detected.
- Pedestrians detected using HOG features and faces using Haar feature-based cascade classifiers.
- What if these people were blurred?

## BASELINES



## BLURRING PEOPLE



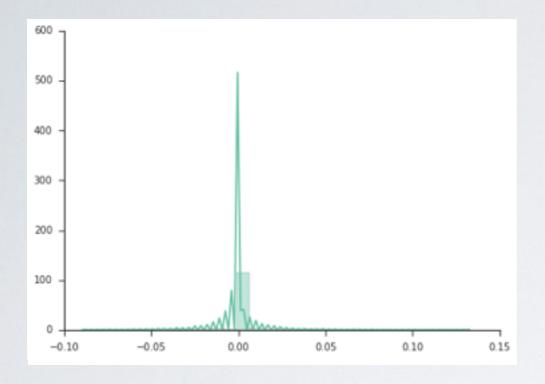


0.80

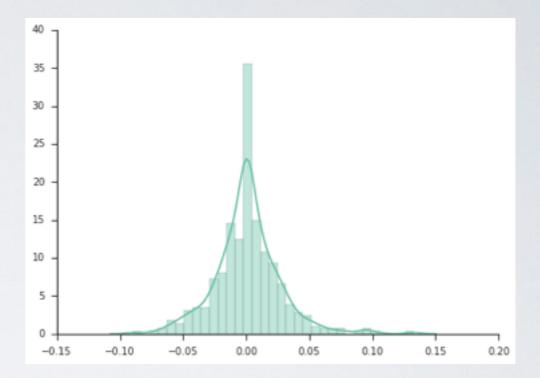
0.70

Actual Memorability: 0.90

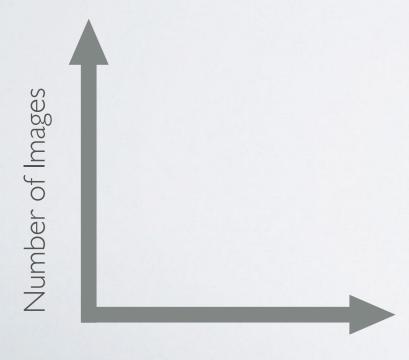
#### All Images



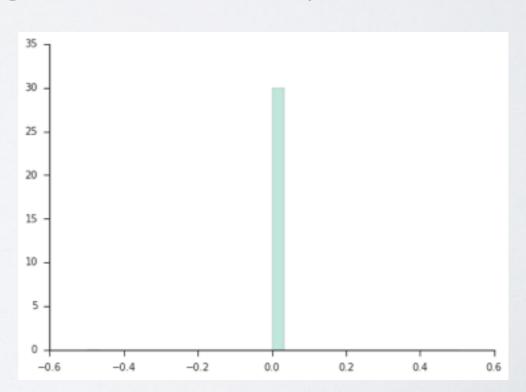
#### Images with People



Images without People

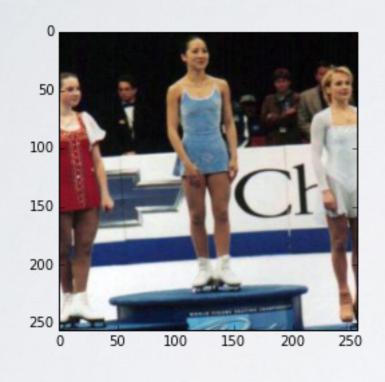


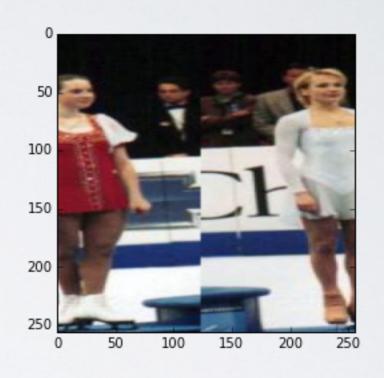
Change in memorability (normal - blurred)



Blurring detected pedestrians or faces doesn't seem to consistently decrease memorability

## REMOVING PEOPLE

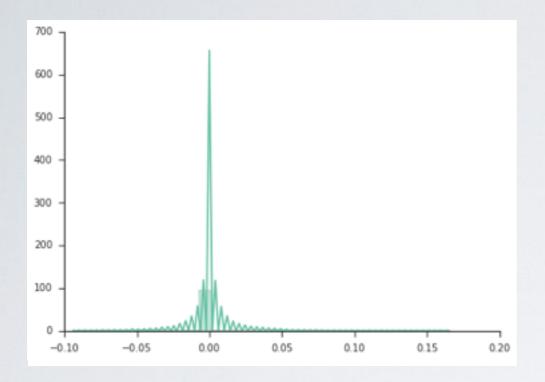




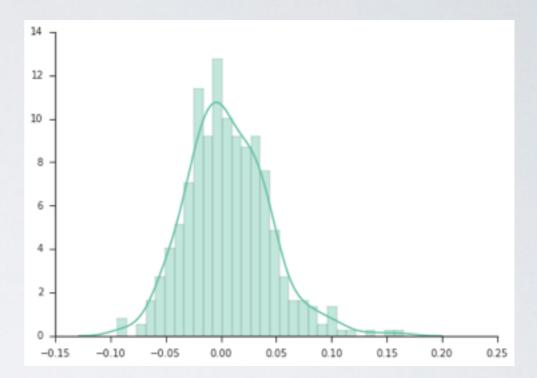
0.80

0.75

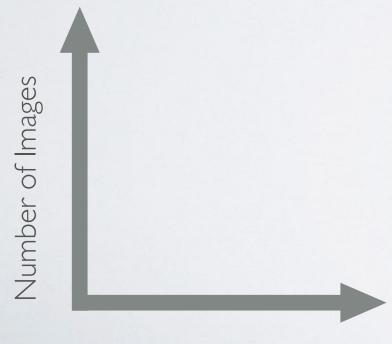
#### All Images



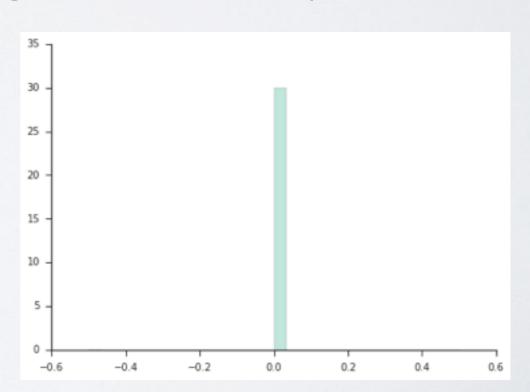
#### Images with People



Images without People



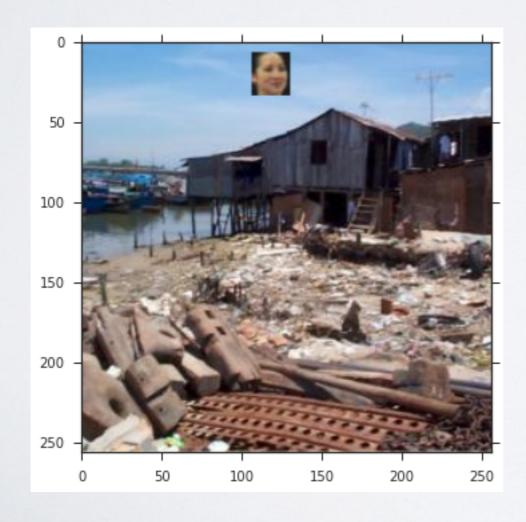
Change in memorability (normal - removed)



Removing people or faces from images shows stronger signs of decreasing memorability, but still not very conclusive.

## ADDING FACE TO IMAGES

What happens if we paste a face into all of our images?

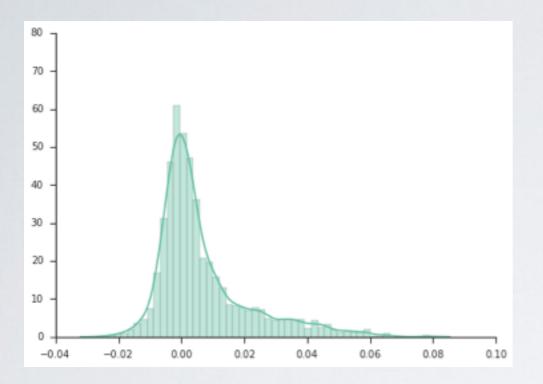


Actual: 0.61

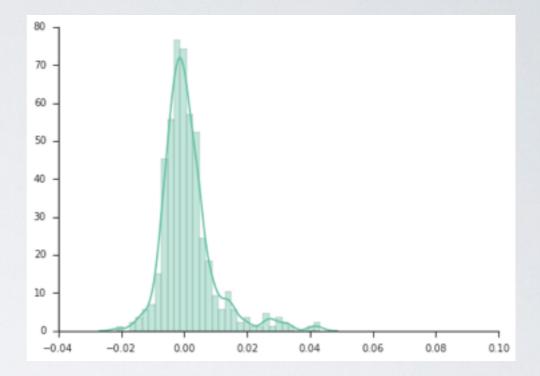
Predicted: 0.60

Predicted with Face: 0.62

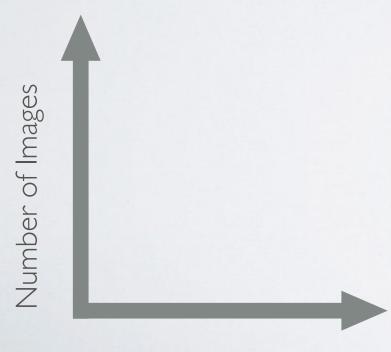
#### All Images



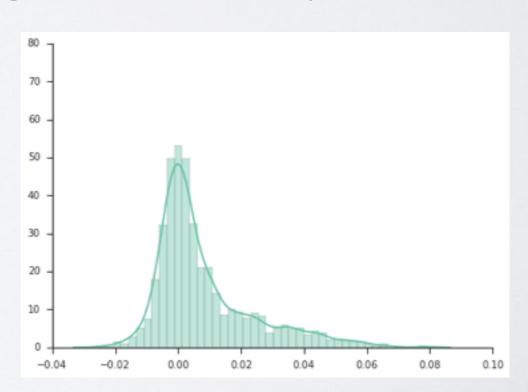
#### Images with People



Images without People



Change in memorability (added faces - normal)



Adding a face to images seems to increase memorability

## SUMMARY

- MemNet generalizes to the popularity dataset approaching state-of-the-art results (without fine-tuning).
- t-SNE embeddings suggest people might improve memorability while landscapes and structures are not very memorable.
- Inconclusive results when blurring/removing people in images and its effects on MemNet. Perhaps stronger results if hand blur all people.
- Adding a single 27x27 face to images looks to boost predicted memorability especially for images with no people.
- Adding or removing people from images may be changing predicted memorability for other reasons.

### REFERENCES

- http://web.mit.edu/phillipi/Public/ WhatMakesAnlmageMemorable/
- http://memorability.csail.mit.edu/