## Spatial Summarization of Image Collections

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### Outline

Augmented features

Sampling the distribution

### Leftover question

• Does using a feature matrix  $X' = X \mid \mathbb{I}$  improve the results?

			K		
		0	2	5	10
	0	$17.38\pm1.81$	$18.75\pm2.95$	$18.82 \pm 2.58$	$18.91 \pm 2.40$
L	2	$22.66 \pm 4.58$	$28.53 \pm 4.36$		
	5	$25.40 \pm 4.77$		$31.59 \pm 2.38$	
	10	$31.13 \pm 2.92$			$30.49 \pm 3.51$

- Not really, the best score so far is  $34.35 \pm 2.15$  with  $\mathbf{X} = \mathbb{I}$ .
- Running time is significantly slower, because of the increased number of features M=N+4.

### Outline

Augmented features

Sampling the distribution

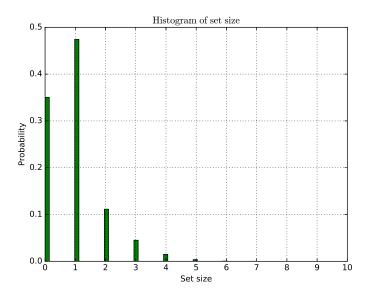
### Sampling from the model

- Using the best model, i.e. without features and with L=5, K=5.
- How does the resulting distribution look?
- How to use the distribution to recommend sets?

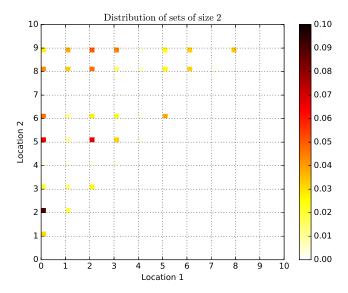
### Exact sampling

- With N=10, it is possible to calculate the probabilities from the model for all  $2^{10}=1024$  possible sets.
- Evaluating the model on all sets  $S \subseteq V$  and then normalizing the probability distribution.
- Takes only seconds to evaluate.

## Distribution of set size (100k samples)



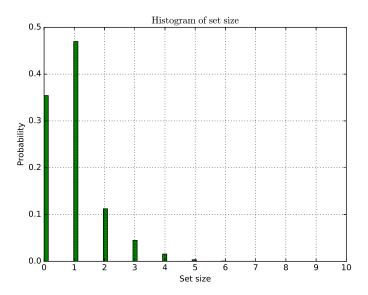
# Distribution of sets with |S| = 2 (100k samples)



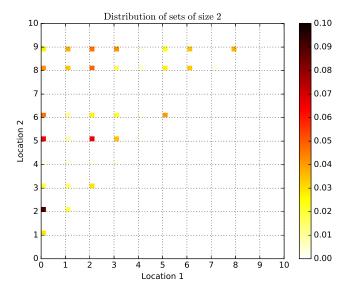
## Gibbs sampling

- What about a method that scales? For example if N=30, then there are  $2^{30}=1073741824$  sets.
- Gibbs sampling as presented in [1].
- ullet Run for 1M iterations, remove the first half of iterations are burn-in.
- Running time is a couple of minutes.

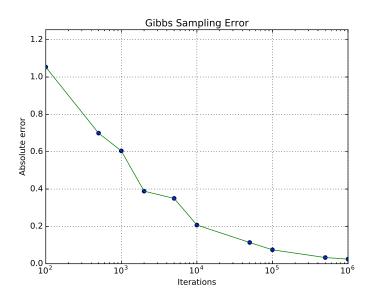
## Distribution of set size (100k samples)



# Distribution of sets with |S| = 2 (100k samples)



## Gibbs Sampling Performance



### Outline

Augmented features

2 Sampling the distribution

Use more mean-shift clusters

#### References



Gotovos, A., Hassani, S. H., and Krause, A.
Sampling from probabilistic submodular models.
In Neural Information Processing Systems (NIPS) (December 2015).