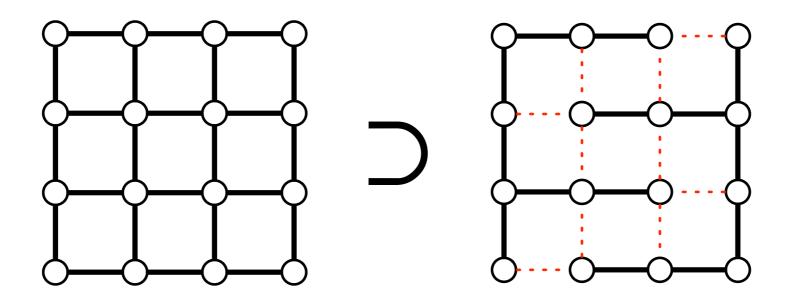
### Optimization of Structured Mean Field Objectives

Alexandre Bouchard-Côté\* Michael I. Jordan\*,<sup>†</sup> \* Computer Science Division <sup>†</sup> Department of Statistics University of California at Berkeley

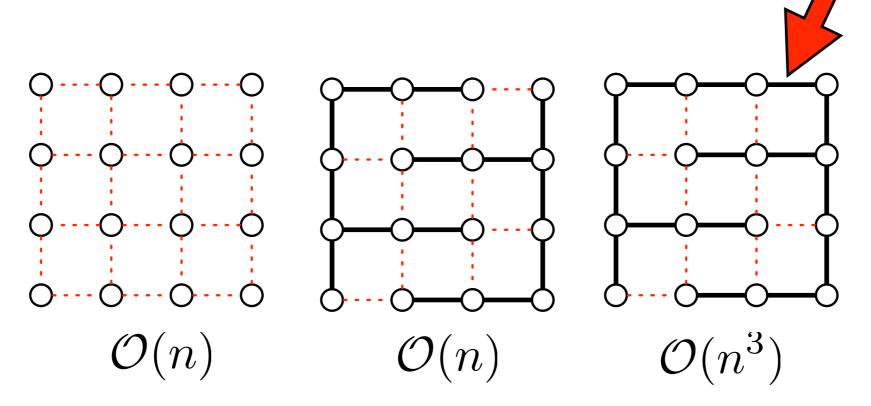
## Structured mean field

- A well-known method for doing approximate inference in intractable probabilistic models
- In Markov random fields, the approximation is usually based on an acyclic subgraph



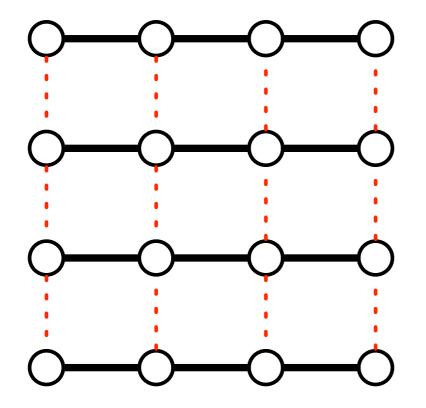
# Picking a subgraph

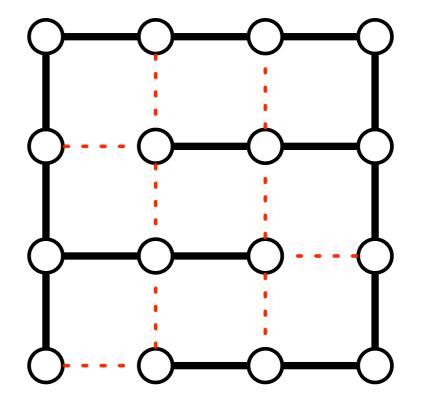
- Using more edges increases quality
- What is the impact on computational complexity?



n = #nodes

#### Preview of our results





*b*-acyclic

*v*-acyclic

## v-acyclic

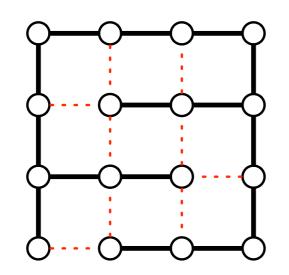
- Computationally easy
- Approximations in the literature fall into this category
- Connection with block Gibbs sampling

0.1	0.3			
0.9		0.8		
			0.4	0.9
	0.2		0.6	
	0.5	0.2		0.1

0	1			
1		1		
			0	1
	0		1	
	0	0		0

**b**-acyclic

- More accurate but computationally harder
- We improve on the direct method by using a technique based on *auxiliary exponential families*



$$\mathcal{O}(n^3) \to \mathcal{O}(n^2)$$