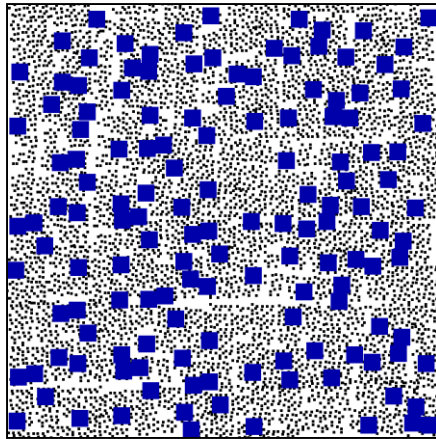


# Clustering in Interfering Binary Mixtures

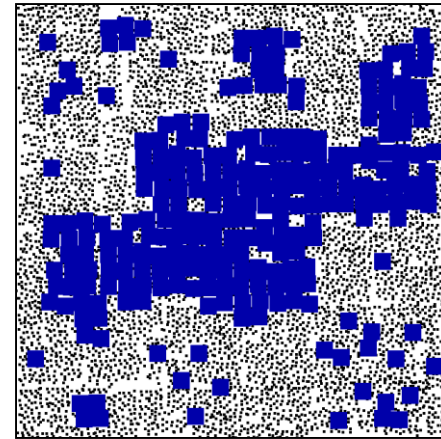
Sarah Miracle, Dana Randall, Amanda Streib  
Georgia Institute of Technology

# Colloids

**Colloids** are mixtures of 2 types of molecules  
- one suspended in the other.



lower density



higher density

As the density increases, large particles cluster together.

*\* purely entropic \**

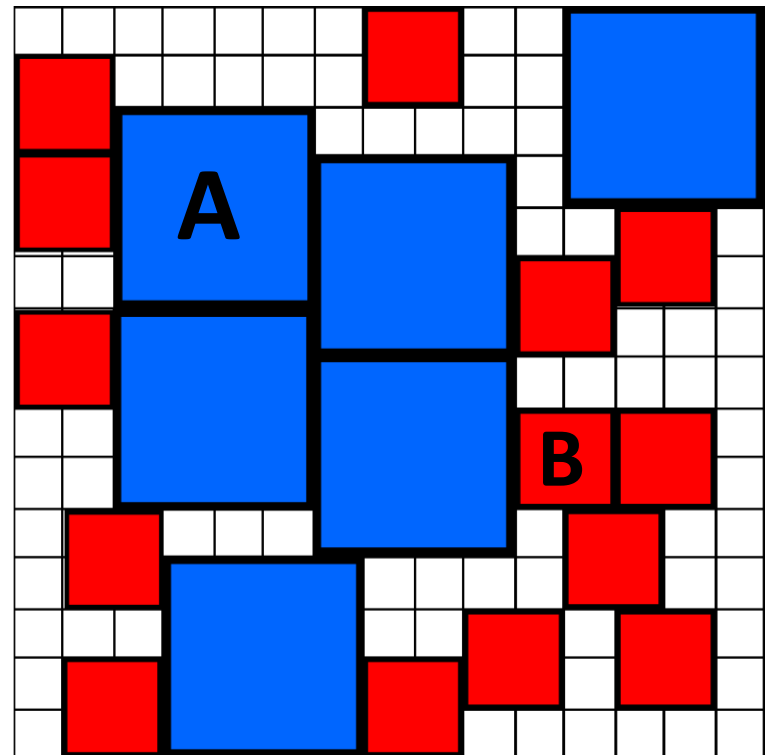
**Folklore:** A dense system of non-overlapping large and small tiles will exhibit “clumping”.

# Framework for Colloid Models

Physicists study the model with fixed # of A-tiles and B-tiles, but it is often helpful to switch to a grand-canonical ensemble where the # of each type of tile is allowed to vary.

- $\alpha$  A-tiles and
- vary the # of B-tiles
- $\sigma$  has weight:

$$\pi(\sigma) = \frac{\lambda^{\#B\text{-tiles}}}{Z}$$

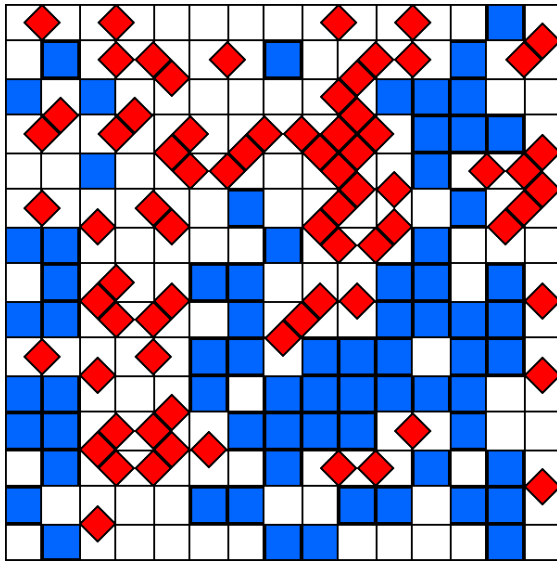


# Examples of Colloid Models

## Model 1

A-tiles: squares on faces

B-tiles: diamonds on edges

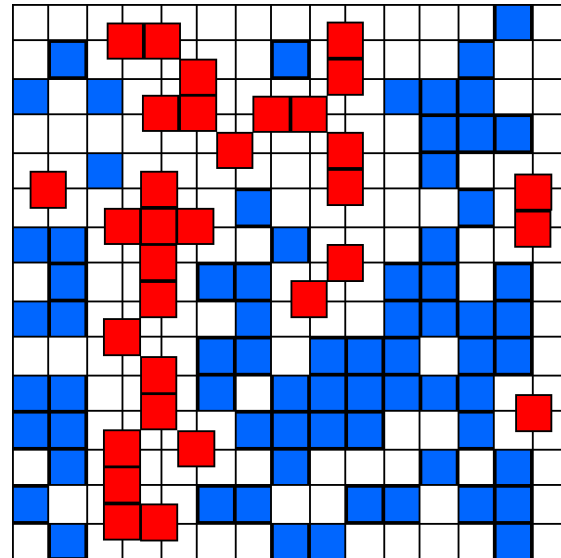


Ising Model

## Model 2

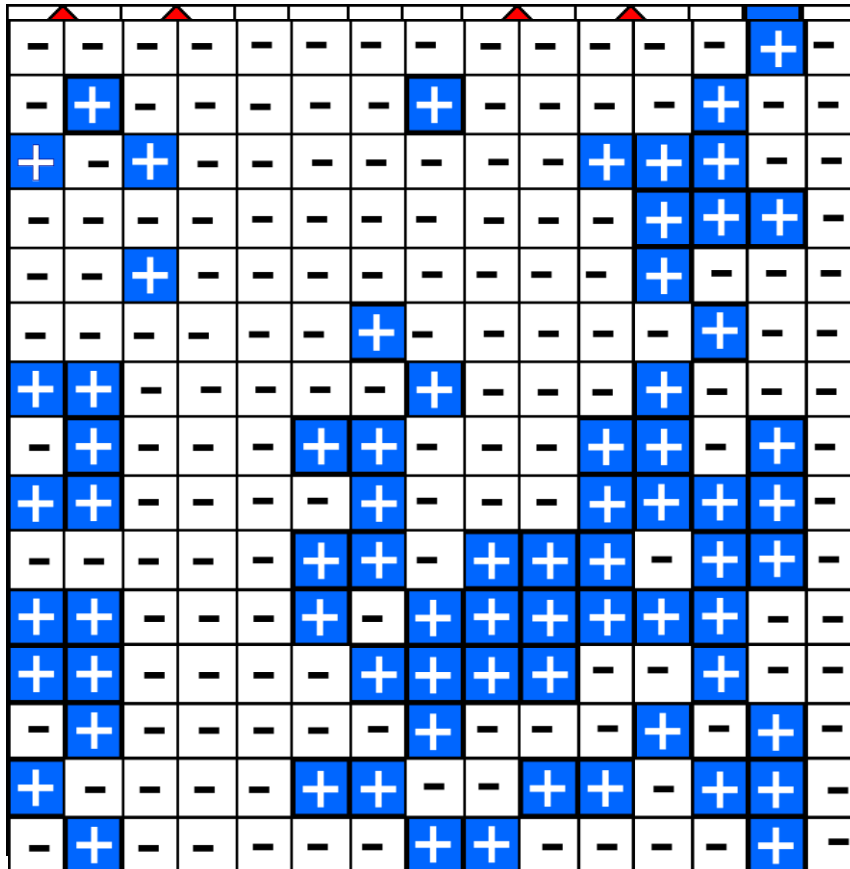
A-tiles: squares on faces

B-tiles: squares on vertices



Independent Sets

# Model 1 – Ising Model



Ising Model

$$\begin{aligned}
 P_{\pi}(X) &= \sum_{\sigma: X(\sigma)=X} \pi(\sigma) \\
 \pi(\sigma) &= \frac{\mu^{\text{disagree}} \lambda^{\#B\text{-tiles}}}{\sum_{\sigma: X(\sigma)=X} Z} \\
 &= \frac{(1 + \lambda)^{\#open\ edges} \mu^{\text{perimeter}}}{Z} \\
 &= \frac{\mu^{\text{perimeter of A-tiles}}}{Z}
 \end{aligned}$$

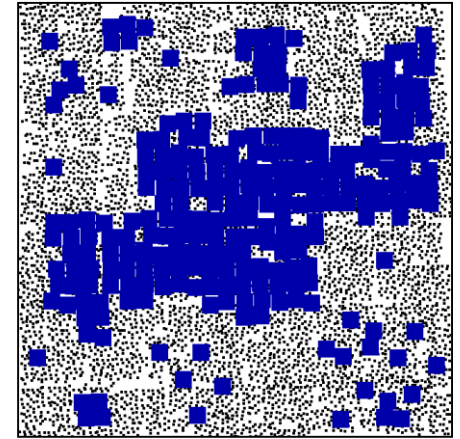
# Goal: Identify Clustering

*What does a typical configuration look like?*

2 approaches:

## (1) Sampling

- Local algorithms are inefficient at high densities
- [Buhot and Krauth '99] Using algorithm from Dress and Krauth, provided experimental evidence of clustering in a colloid model consisting of different sized squares
- [M., Randall and Streib '11] Showed that the Dress and Krauth algorithm can take exponential time to converge



## (2) Counting

# Previous Work

## [Frenkel and Louis '92]

Introduced Model 1, constructed so that its behavior could be inferred from the Ising Model.

→ Model 1 inherits clustering from Ising Model

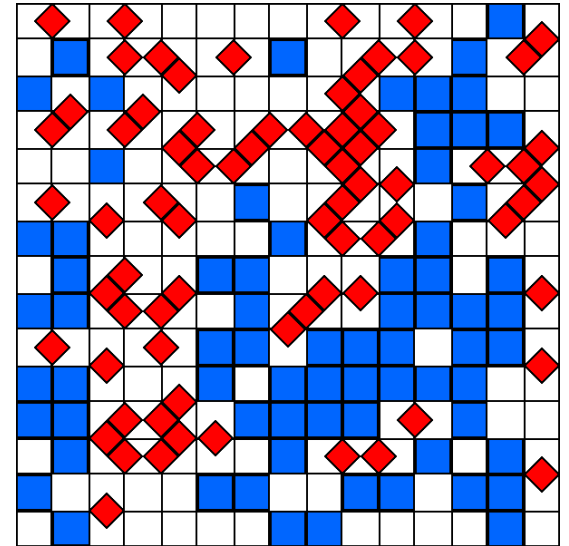
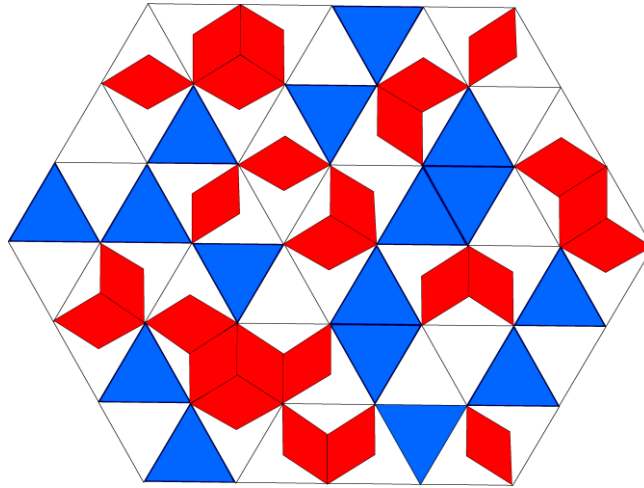
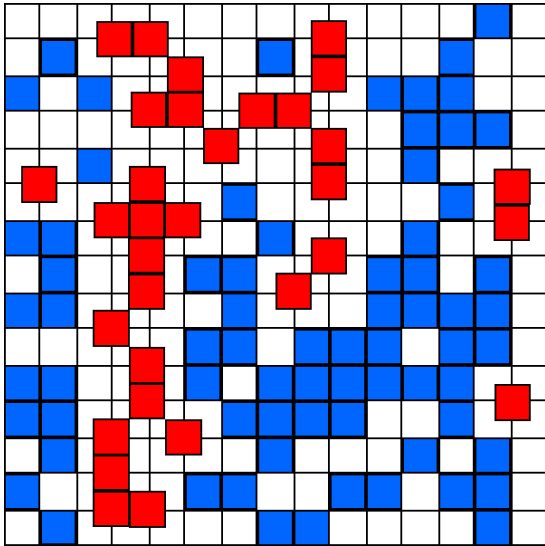
## [Dobrushin, Kotecký and Shlosman '92]

In the Ising Model, the exact limiting shape is the **Wulff shape**.

**We prove clustering directly for **Interfering Binary Mixtures****

- Uses elementary methods
- Applies broad class of colloid models
- Direct proof in terms of parameters natural for clustering

# Examples of Interfering Binary Mixtures



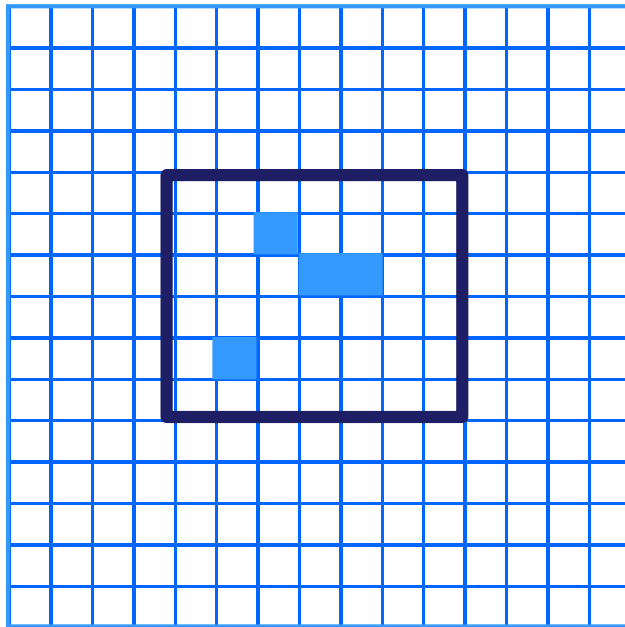


# Interfering Binary Mixtures

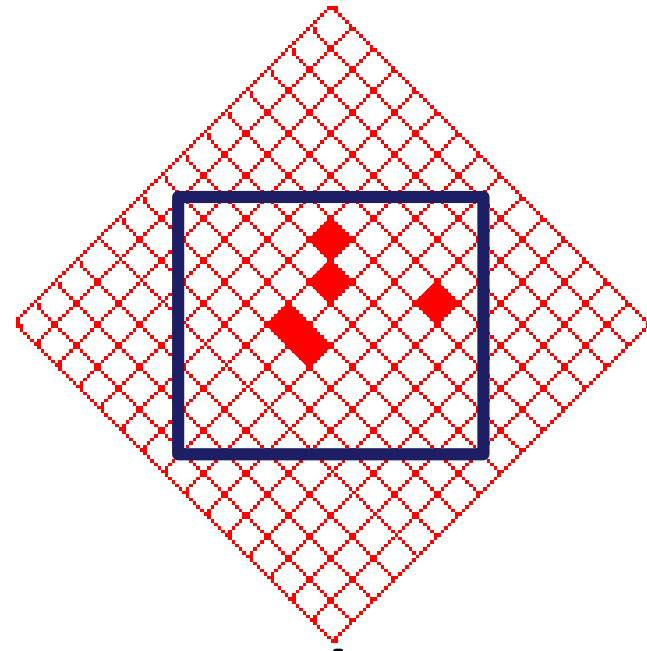
Take two planar lattices  $\Lambda_A, \Lambda_B$ .

- $A$ -tiles lie on the faces of  $\Lambda_A$
- $B$ -tiles lie on the faces of  $\Lambda_B$

Take their intersection with some finite region.



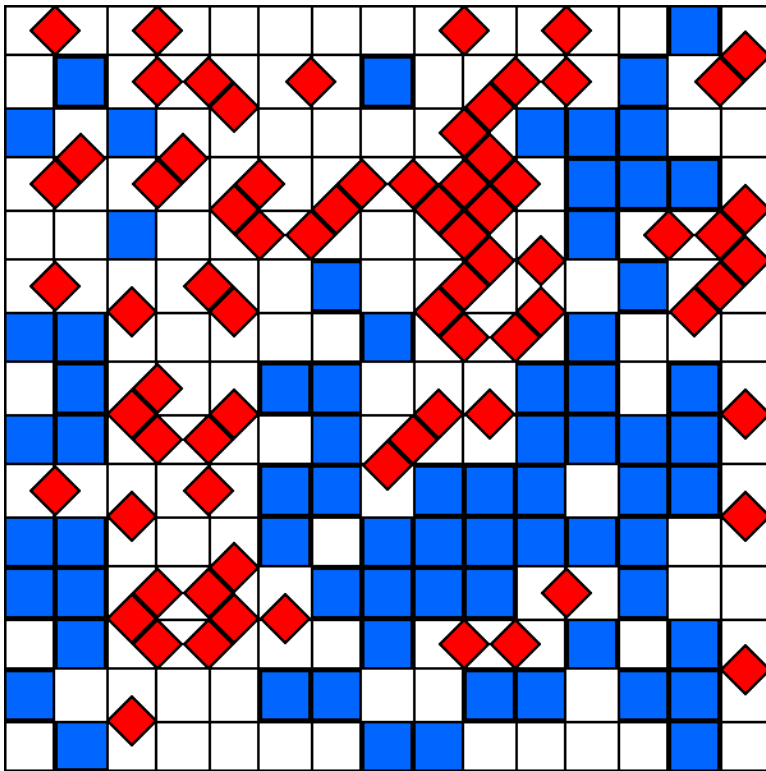
$\Lambda_A$



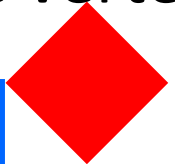
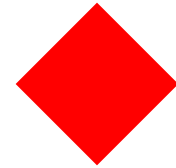
$\Lambda_B$

# Interfering Binary Mixtures

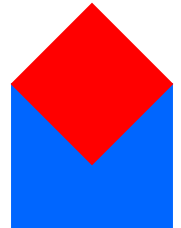
Require that the faces of  $\Lambda_A$  and  $\Lambda_B$  are either



- Disjoint,
- Intersect at a single vertex
- Intersect at a fixed shape  $S$  with positive area

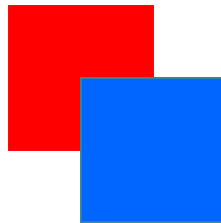
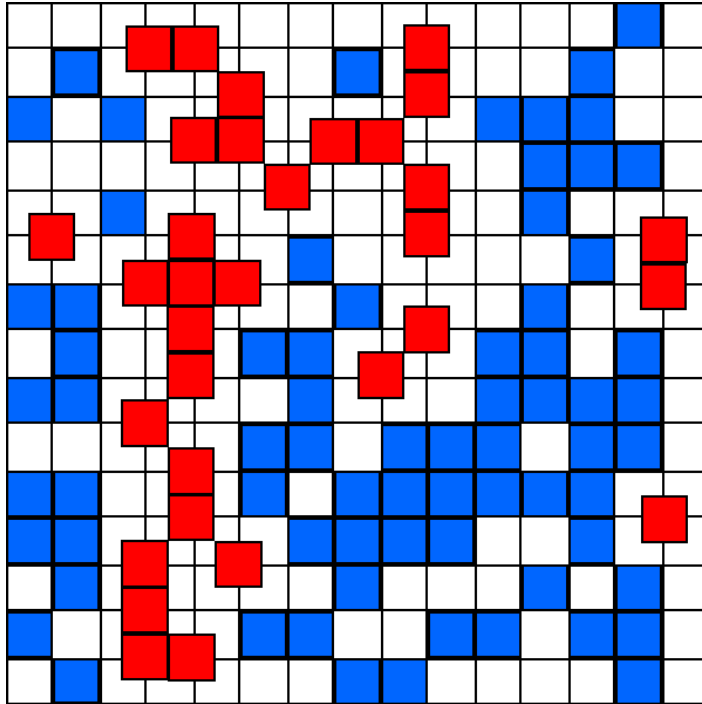


$S$

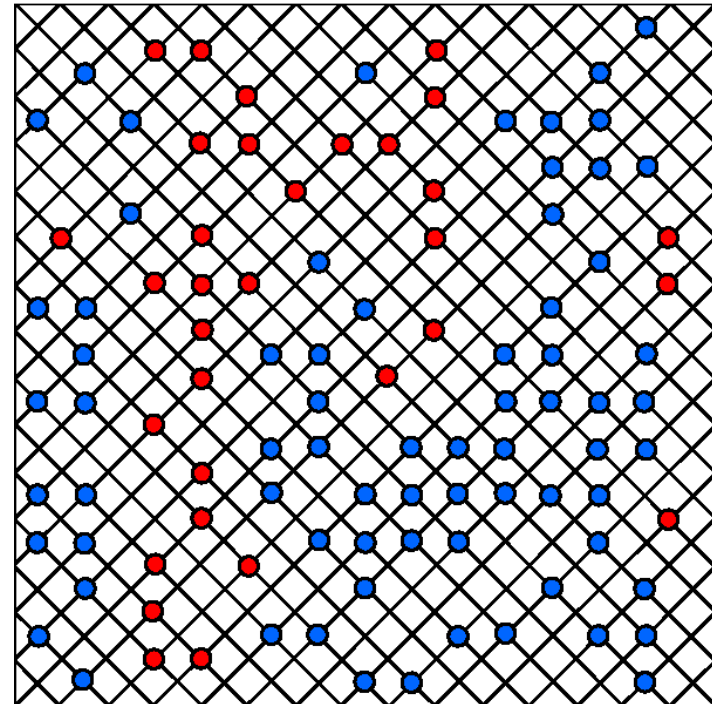


# Interfering Binary Mixtures

Model 2



Independent Sets



$$S = \text{yellow square}$$

# Main Theorems

*Model 1 on an  $n \times n$  region with  $bn^2$  A-tiles*

## Theorem 1:

For  $0 < b \leq 1/2$ , there exist constants  $\lambda^* = \lambda^*(b) > 1$ ,  $Y_1 < 1$  and  $n_1 = n_1(b)$  such that for all  $n > n_1$ ,  $\lambda \geq \lambda^*$  a random sample from  $\Omega$  will have the *clustering property* with probability at least  $(1 - Y_1)^n$ .

## Theorem 2:

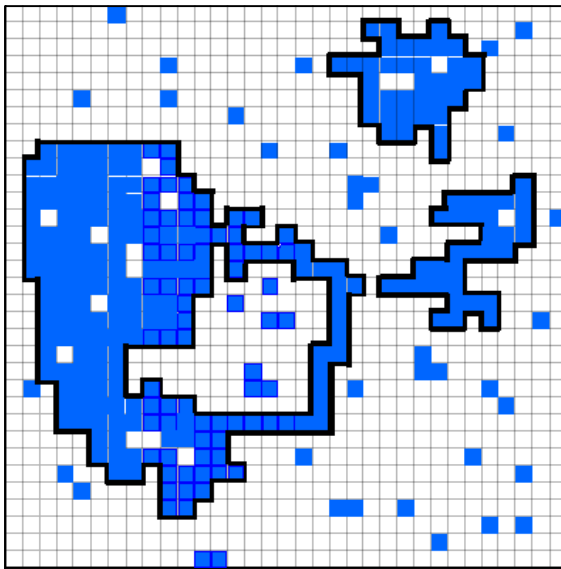
For  $0 < b < 1/2$ , there exist constants  $\lambda_* = \lambda_*(b) > 0$ ,  $Y_2 < 1$  and  $n_2 = n_2(b)$  such that for all  $n > n_2$ ,  $\lambda \leq \lambda_*$  a random sample from  $\Omega$  will not have the *clustering property* with probability at least  $(1 - Y_2)^n$ .

Thms 1 and 2 hold for all Interfering Binary Mixtures

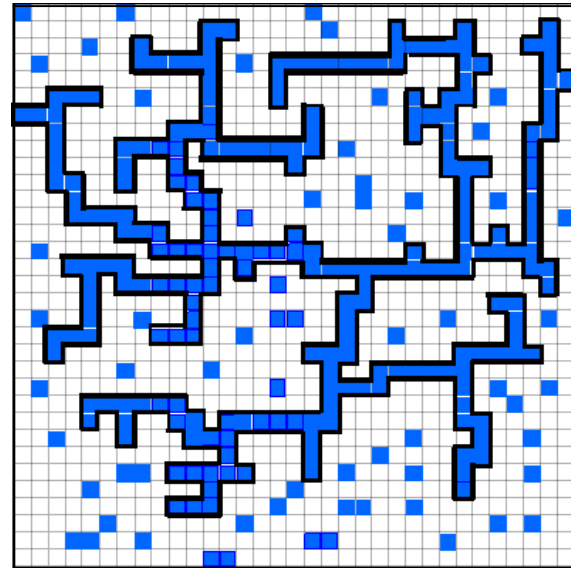
# Our Results: The Cluster Property

What does it mean for a config. to “cluster”?

- has large, very dense region
- tightly packed (small perimeter:area ratio)
- the rest of the config. is very sparse



Clustering



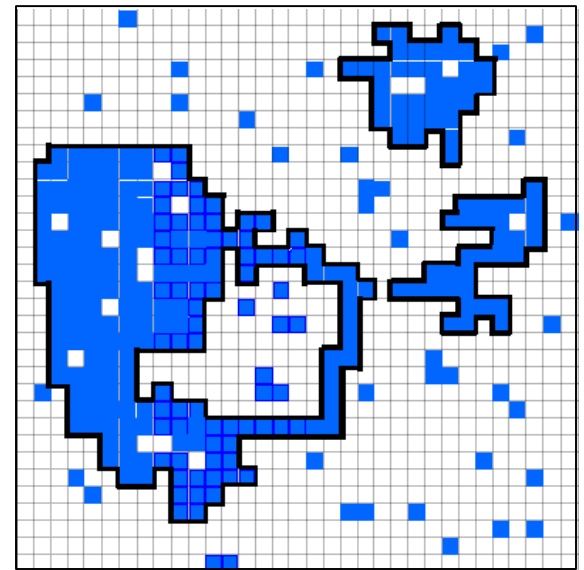
No Clustering

# Formal Definition of Clustering

A configuration has the clustering property if it contains a region  $R$  such that:

1.  $R$  contains at least  $(b - c)n^2$   $A$ -tiles
2. Perimeter of  $R$  is at most  $8\sqrt{bn}$
3. Density of  $A$ -tiles in  $R$  is at least  $1-c$  and in  $\bar{R}$  is at most  $c$ .

$$c = \min\left\{b/2, 1/100\right\}$$



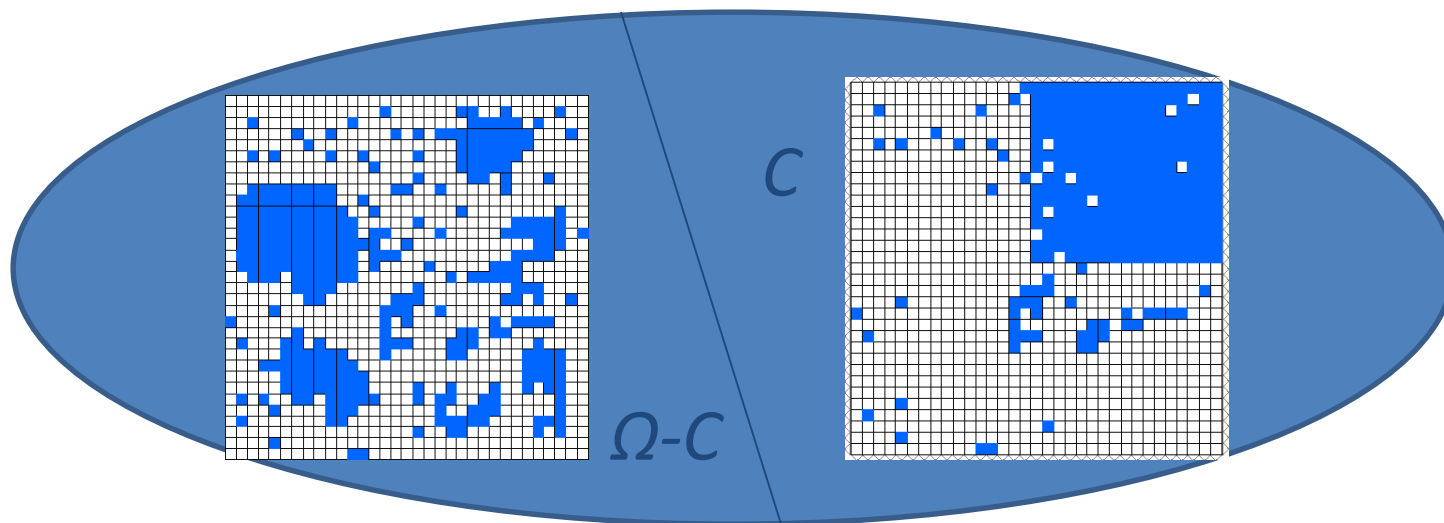
# Thm 1 (high density): Proof Sketch

$C$ : configurations that have the clustering property

Want to show:  $\pi(\Omega - C) \leq \gamma^{-n} \pi(C)$

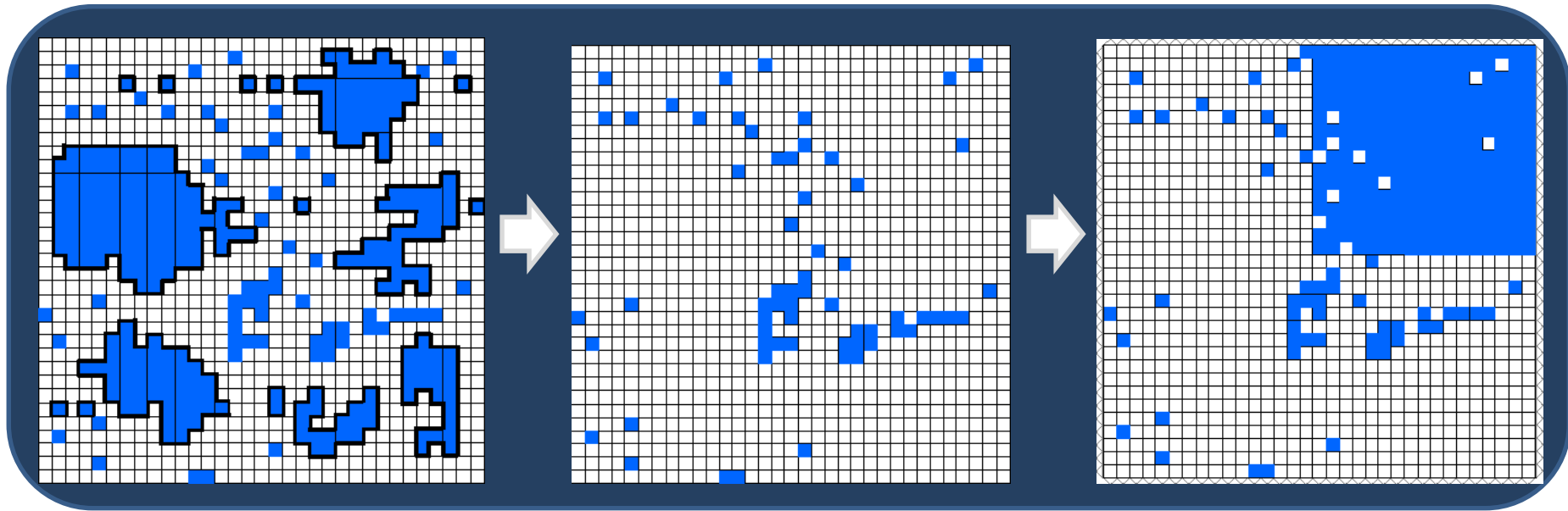
Define  $f: \Omega - C \rightarrow C$  such that for every  $\tau \in C$ ,

$$\sum_{\sigma \in f^{-1}(\tau)} \pi(\sigma) \leq \gamma^{-n} \pi(\tau)$$



# Thm 1 (high density): Proof Sketch

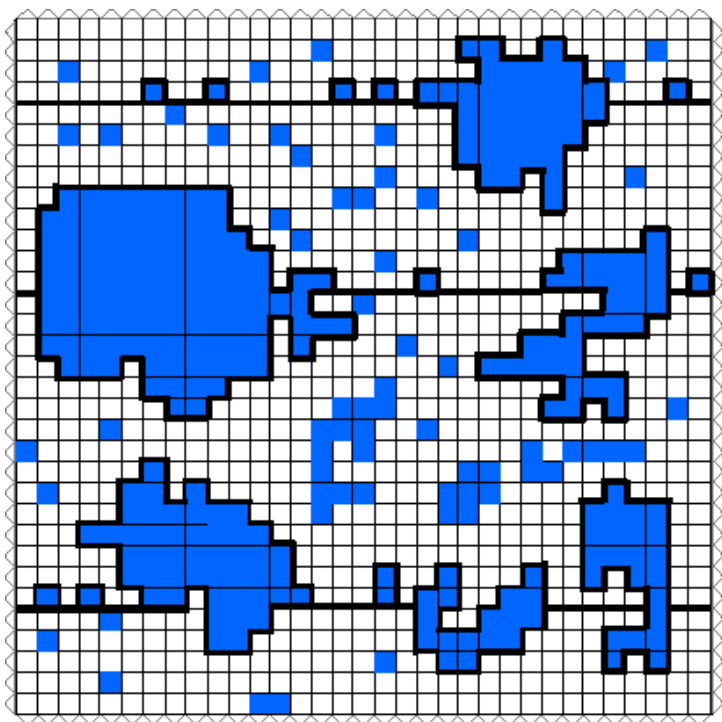
1. Identify a set of components to remove.
2. Remove selected components to obtain a “bank” of tiles
3. Use bank of tiles to create a large square component





# Thm 1 (high density): Proof Sketch

To bound  $|f^{-1}(\tau)|$  : Record where the components were and what they looked like



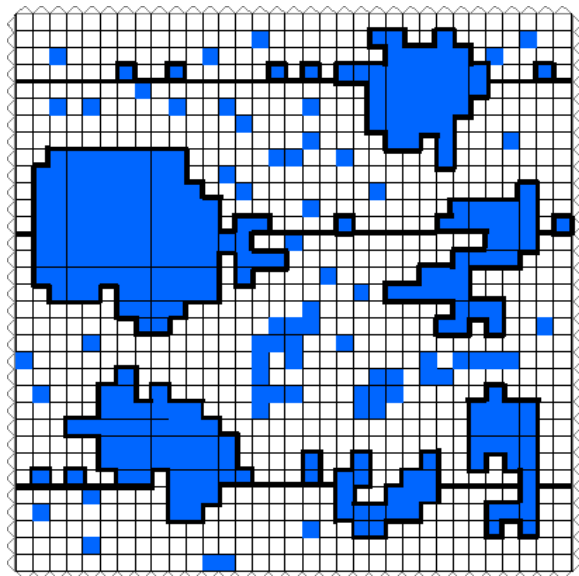
**Plan:** Find a set  $B$  of edges (**bridges**) that connect several components to the boundary of the region.

Use those bridges to encode the location and perimeter of the components removed.

→ # preimages is at most  $6^{\#edges\ encoded}$

# Thm 1 (high density): Proof Sketch

**Plan:** Find a set  $B$  of edges (**bridges**) that connect several components to the boundary of the region.



## Properties of bridges:

- # edges  $< c * \text{perimeter of components we remove}$
- Perimeter of components removed is large  $\theta(n^2)$

# preimages is at most  $6^{\# \text{edges encoded}} \leq 6^{t \Delta_{\text{perim}}}$

and  $\pi(\sigma) \leq \mu^{-\Delta_{\text{perim}}} \pi(\tau)$

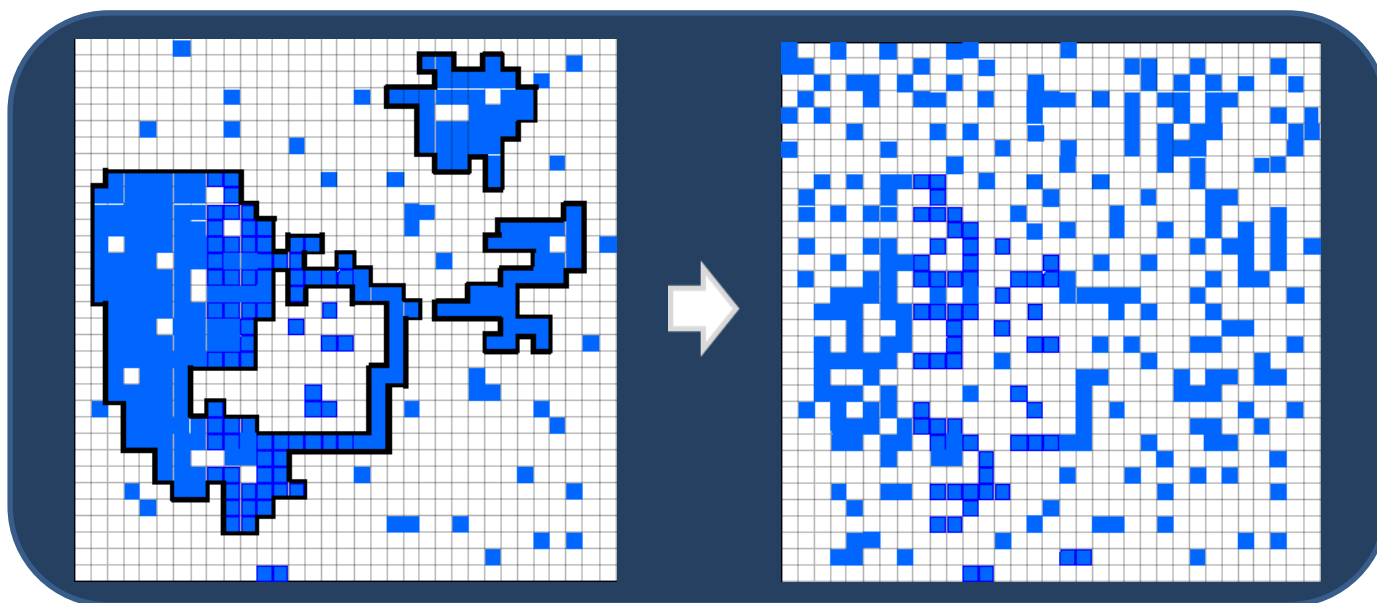
So:  $\sum_{\sigma \in f^{-1}(\tau)} \pi(\sigma) \leq \left(\frac{6^t}{\mu}\right)^{\Delta_{\text{perim}}} \pi(\tau) \leq \mu^{-n} \pi(\tau)$

# Thm 2 (low density): Proof Sketch

Want to show if  $\lambda$  is small enough:  $\pi(C) \leq \gamma^{-n} \pi(\Omega - C)$

Proof idea:

1. Define bridges as before.
2. Remove big components –  $t$  tiles.
3. Redistribute the  $t$  tiles uniformly:  $\binom{n^2 - an^2}{t}$  ways



# Open Problems

- Prove clustering occurs in other discrete models where the overlap between lattice faces is not a fixed shape.
- Generalize to higher dimensions
- Other algorithms for sampling