

Title: Percolation transition vs. erasure thresholds for surface codes on graphs

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Abstract: <p>For a family of finite rate stabilizer codes, one can define two distinct error correction thresholds: the usual "block" threshold for the entire code, and the single-qubit threshold, where we only care about the stability of a single encoded qubit corresponding to a randomly chosen conjugate pair of logical X and Z operators.&nbsp; Our main result is that in the case of erasures, for hyperbolic surface codes related to a  $\{p,q\}$  tiling of the hyperbolic plane, it is the latter threshold that coincides exactly with the infinite-graph edge percolation transition.&nbsp; I will also discuss likely generalizations to more general codes and other error models. This is joint work with Nicolas Delfosse.</p>

# Percolation vs. erasure thresholds for hyperbolic surface codes

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April 26, 2017

- Introduction: From quantum codes to spin models
- Percolation on infinite graphs
- Inequalities for erasure and homological thresholds
- Conjectured extensions to other error models

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Kathleen Hamilton (ORNL)

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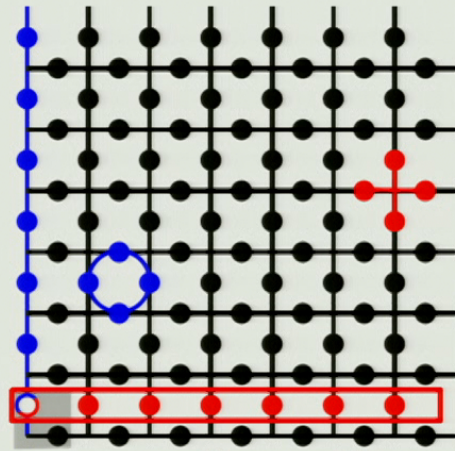


## Surface codes

Family of codes invented by Alexey Kitaev (orig: *toric* codes)

Stabilizer generators: plaquette  $A_{\square} = ZZZZ$  and vertex

$B_{+} = XXXX$  operators



toric code  $[[98, 2, 7]]$

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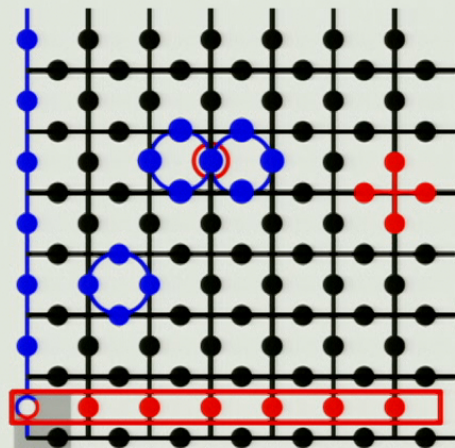
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Code: common +1 eigenspace of all  $A$  and  $B$  operators

Detectable errors: open  $Z$  chains along the original lattice or open

$X$  chains on the dual lattice

**Measured syndrome: end points**



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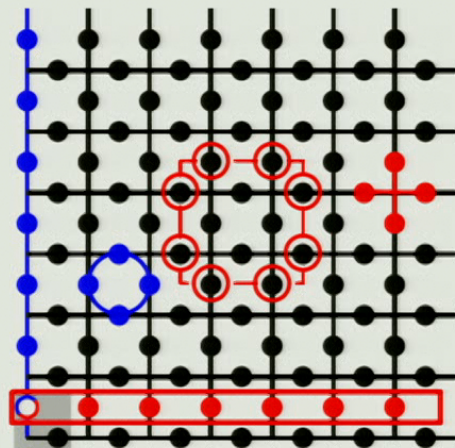
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**Undetectable** error: closed loops

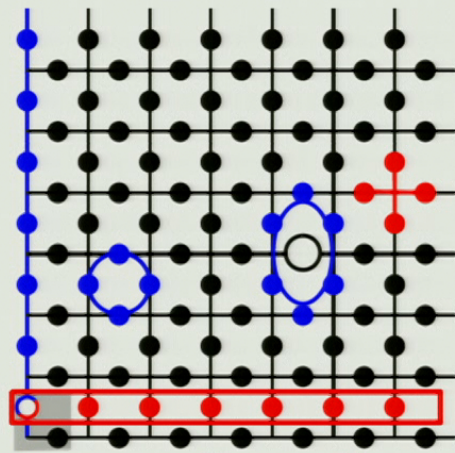
Trivial undetectable error:  
topologically trivial loops

**Bad** undetectable error:  
topologically non-trivial loop  $\Rightarrow$   
Code distance  $d = L \propto \sqrt{n}$ .

$$[[n = 2L^2, k = 2, d = L]]$$

## Stability to erasures

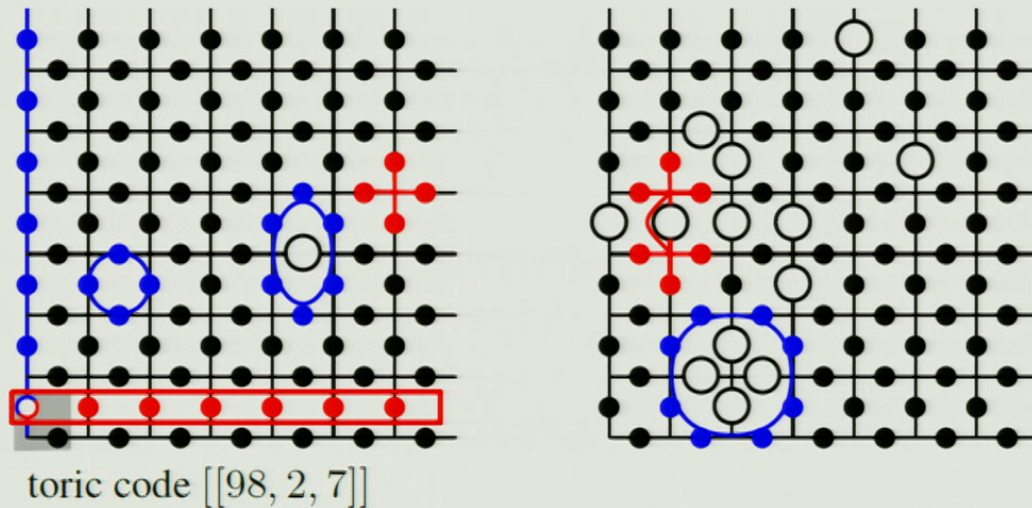
- Erasures: Unknown errors in a known set of qubits
- Modify stabilizer generators and logical operators
- Distance of this punctured code may decrease



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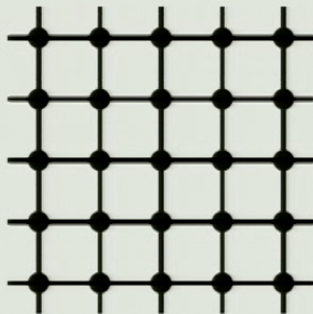
- Erasures: Unknown errors in a known set of qubits
- Modify stabilizer generators and logical operators
- Distance of this punctured code may decrease
- Encoded qubits preserved as long as no homology is covered
- Clear similarity to percolation





## Edge percolation on a graph

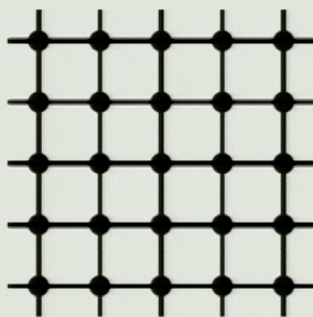
- Each edge is independently labeled "open" with probability  $p$  and "closed" with probability  $1 - p$ .
- Drop closed edges.
- What is the connectivity of the resulting graph?



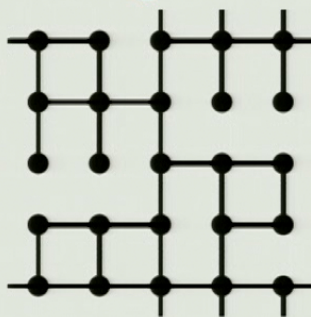
$G$

## Edge percolation on a graph

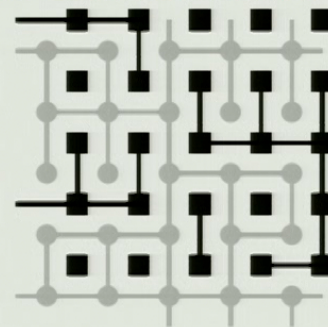
- Each edge is independently labeled "open" with probability  $p$  and "closed" with probability  $1 - p$ .
- Drop closed edges.
- What is the connectivity of the resulting graph?
- Percolation threshold  $p_c$  on an infinite graph: smallest  $p$  so that a vertex  $v$  has probability  $\theta_v(p) > 0$  of connecting to infinity
- Not quite the same as covering homologies!
- How are erasure and percolation thresholds related?



$G$



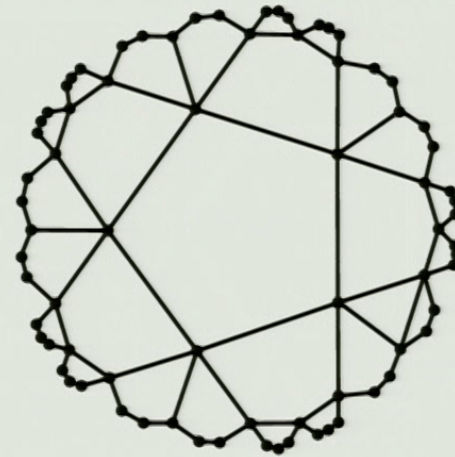
$G'$



Dual to  $G'$

## More complicated example

- How about hyperbolic surface codes?
- Codes from  $\{5, 5\}$  hyperbolic tilings:  $[[30, 8, 3]]$ ,  $[[40, 10, 4]]$ ,  $[[80, 18, 5]]$ ,  $[[150, 32, 6]]$ ,  $[[900, 182, 8]]$ , ...
  - Finite rate family
  - Highly symmetric
  - Logarithmic distance

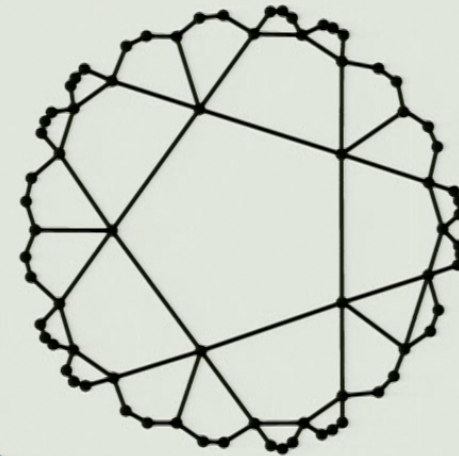


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  - Finite rate family
  - Highly symmetric
  - Logarithmic distance

- Expander graphs

- Perimeter scales as area,  $B \geq i_E V$
- Two percolation transitions
- $p_c$ : infinite clusters formed for  $p > p_c$
- $p_u$ : unique infinite cluster for  $p > p_u$
- Self-dual graph:  $p_c + p_u = 1$



Connectivity  $\tau_{uv}$  decays exponentially below  $p_u$

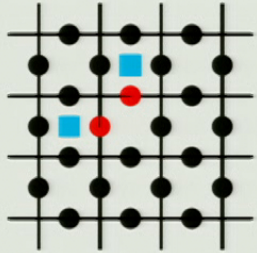
Average cluster size  $\chi_v$  diverges at  $p_c$

$$\chi_v = \sum_u \tau_{vu}$$

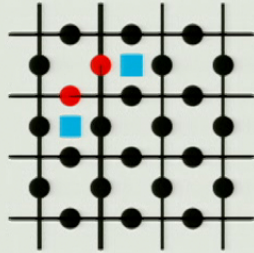
## Maximum likelihood decoding

Syndrome-based decoding: find likely error, given the syndrome

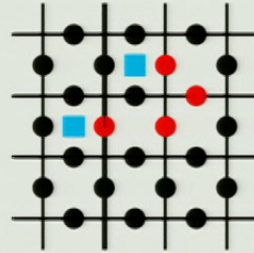
**Can only be done up to degeneracy class**



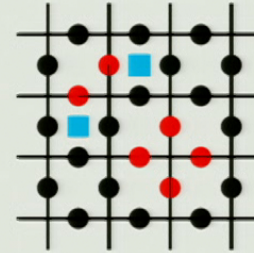
$$p^2(1-p)^{n-2}$$



$$p^2(1-p)^{n-2}$$



$$p^4(1-p)^{n-4}$$



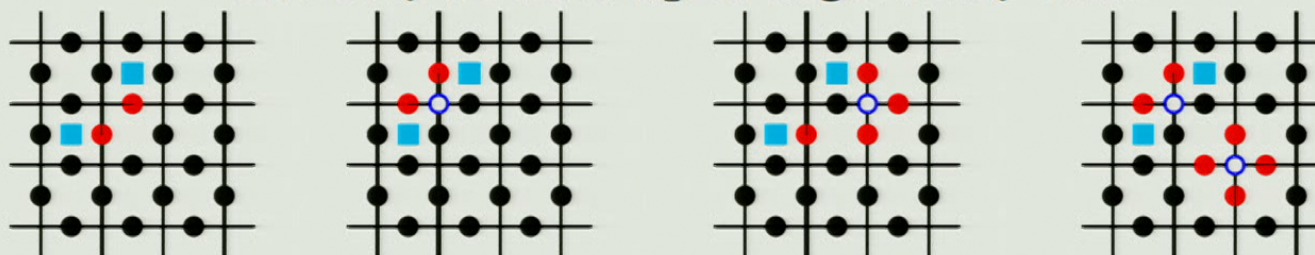
$$p^6(1-p)^{n-6}$$

Trivial sector probabilities:  $P_0$

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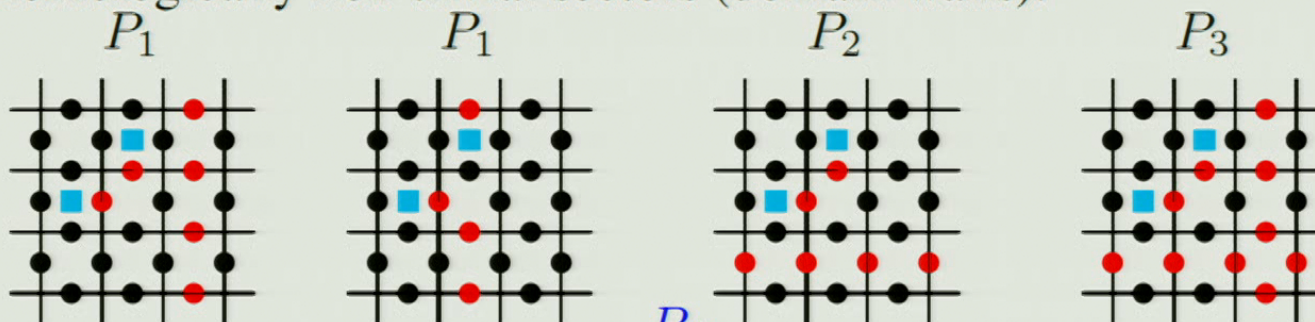
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$$p^2(1-p)^{n-2} \quad p^2(1-p)^{n-2} \quad p^4(1-p)^{n-4} \quad p^6(1-p)^{n-6}$$

Trivial sector probabilities:  $P_0$  Random Bond Ising model map

Homologically non-trivial sectors (domain walls):

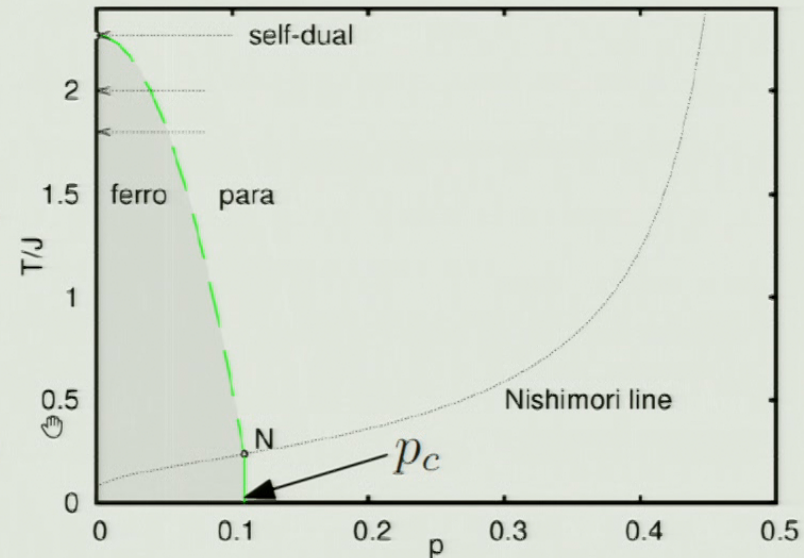


ML dec success:  $\mathbb{P} = \frac{P_0}{P_0 + P_1 + P_2 + P_3}$  [Dennis et al, 2002]

## Spin glass physics and decoding threshold

Toric code: decoding  $X$  or  $Z$  errors  $\leftrightarrow$  random bond Ising model on the Nishimori line,  $e^{-2K} \equiv e^{-2J/T} = p/(1-p)$ .

Points away from the Nishimori line: suboptimal decoder (assumed  $p$  is wrong)



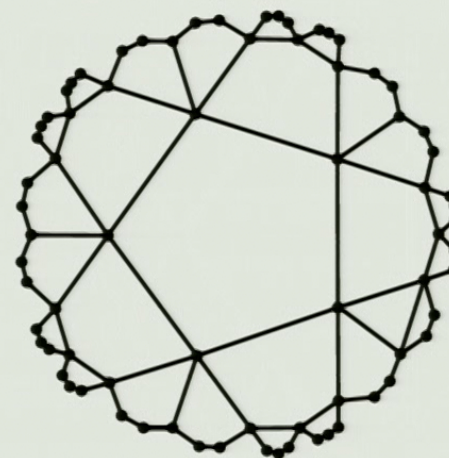
Multicritical point at  $p_c \approx 0.109$  is the highest point where FM phase is possible

$$\mathbb{P}_{\text{succ}} = \frac{P_0}{P_0 + P_1 + P_2 + P_3}$$

Here, **decodable phase** is the FM phase with **non-zero domain wall tension**: homologically non-trivial sectors are suppressed in thermodynamical limit

## Example: hyperbolic surface codes

- Shown: (5,5) hyperbolic tiling. Planar **expander** graph. Not embeddable in 2D without large deformations
- Surface code on related finite graphs: weight=5 generators; rate  $R = 1/5$ .
- Ground state degeneracy  $2^k$
- ML decoding  $\rightarrow$  random bond Ising



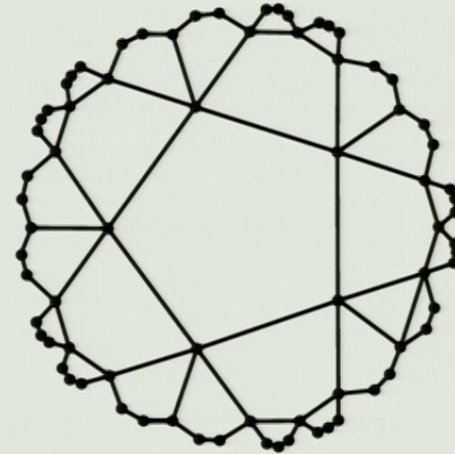
$$\mathbb{P}_{\text{succ}} = \frac{P_0}{P_0 + P_1 + \dots + P_{2^k - 1}}$$

- Generally different from those defined using
  - Domain wall line tension
  - Correlation function  $\tau_{ab} \equiv \langle s_a s_b \rangle$
  - Susceptibility at  $a$ :  $\chi_a = \sum_b \tau_{ab}$ .
- **No unique way to define the infinite graph limit**



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## Motivating questions

- Can we convert these into maps for threshold parameters?
  - Erasure and percolation thresholds
  - ML decoding threshold vs. the transition in RB Ising model
  - Same for quqit code and random bond  $q$ -state Potts
  - Same for GKP code and charge- $q$  compact QED...
- Is there associated critical scaling?
- What determines the critical exponents?
- Is there a meaningful notion of convergence for sequences of quantum codes?
- Is there a meaningful definition of a family of quantum codes, comparable to ensembles of random classical codes?

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- Is there a meaningful definition of a family of quantum codes, comparable to ensembles of random classical codes?
- Percolation is the simplest example
- Also the transition most easy to understand
- Of current independent interest (network theory)
- Some of these questions may have already been answered

## Erasure threshold for hyperbolic surface codes

- Consider a sequence of hyperbolic surface codes  $[[n_t, k_t, d_t]]$  from transitive graphs  $H_t, t \in \mathbb{N} \longrightarrow \{r, r\}$  regular tiling  $H$
- Assume  $d_t \geq 2t + 1$ , then  $H_t$  converge to  $H$  locally, meaning that balls of radius  $t$  look the same on  $H$  and  $H_t$ .

**Theorem:** For surface codes defined by a sequence of homologically non-trivial graphs locally convergent to a planar infinite graph,  $p_E \leq p_c$ .

- Proof based on the cluster expansion: Denote  $N_{V,E,B}^{(v)}$  number of edge-connected clusters with  $V$  vertices,  $E$  edges, and  $B$  "boundary" edges, which include the chosen vertex  $v$ , then

$$1 - \theta_p(v) = \sum_{V,E,B} N_{V,E,B}^{(v)} p^E (1 - p)^B$$

## Erasure threshold (cont'd)

- For any  $p > p_E$ , probability to cover a homology:  $\mathbb{P} \geq \epsilon > 0$

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- Note:  $p_E$  is not necessarily the same as  $p_c$ :  $t \times L_t$  toric codes
  - Infinite graph limit = square lattice
  - Percolation threshold  $p_c = 1/2$
  - For  $L_t = 2^{t \ln t}$ ,  $p_E = 0$ .
  - For  $L_t = m^t$ ,  $p_E \leq 1/m$ .
- Same *may be* true for hyperbolic codes:  $p_E < p_c$  (log distance)

$$\begin{aligned} \mathbb{P}_{\text{vert}} &\geq 1 - (1 - p^t)^{L_t} \\ &\geq 1 - e^{-p^t L_t} \\ &\rightarrow 1, \quad \forall p > 0. \end{aligned}$$

## Homological threshold

- Consider a **finite-rate** family of surface codes associated with a sequence  $(G_t)$  of finite locally planar transitive graphs weakly convergent to  $G$  (rate  $R = \lim_t k_t/n_t$ ).
- Necessarily, these are some hyperbolic tilings.

Let  $p_H^f$  be the threshold to cover fraction  $f$  of homologies: for  $p > p_H^f$ , fraction  $\eta_p > f$  is covered, while for  $p < p_H^f$ ,  $\eta_p < f$ .

$$\text{Define } p_H^0 = \lim_{f \downarrow 0} p_H^f, \quad p_H^1 = \lim_{f \uparrow 1} p_H^f$$

**Theorem:**  $p_c \leq p_H^0 \leq p_H^1 \leq p_u$  [Version of Delfosse, Zemor 2010]

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**Theorem:**  $p_c \leq p_H^0 \leq p_H^1 \leq p_u$  [Version of Delfosse, Zemor 2010]

- Notice:  $p_c$  and  $p_u$  are mutually dual, and so are  $p_H^0$  and  $p_H^1$ .  
On self-dual graphs,  $p_c + p_u = 1$ ,  $p_H^0 + p_H^1 = 1$ .

Proof: For graphs with maximum vertex degree  $\Delta$ ,  $\theta_p \geq fR \frac{2}{\Delta}$ .



## Homological threshold (cont'd)

- Notice that  $p_H^0$  can be viewed as a **logical bit erasure threshold**: for  $p > p_H^0$ , there is a finite probability that a randomly chosen homology is covered
- Calculate the fraction of covered homologies  $\eta_p$ : [Delfosse & Zemor]
  - Finite graph with  $V_t$  vertices,  $E_t$  edges,  $k_t$  homologies.
  - Take a subgraph  $G'_t$  induced by  $E \leq E_t$  open edges
  - $G'_t$  has  $K = V_t - E + C$  connected components, ← [Euler]  
 $C = F + H$  cycles,  $F$  faces, and  $H$  homologies
  - For the dual graph,  $\tilde{K} = 1 + F$ .
  - This gives  $H = K - \tilde{K} + E - V_t + 1$
  - Rescale and take the expectation

$$\frac{k_t}{V_t} \eta_p = \kappa_{p,0}(G_t) - \kappa_{1-p,0}(\tilde{G}_t) + \frac{pE_t - 1}{V_t} - 1$$

$$\kappa_{p,h}(G) \equiv \sum \frac{1}{V} N_{V,E,B} e^{hV} p^E (1-p)^B \quad (\text{vertex-average})$$

## Homological threshold (cont'd)

Take the infinite graph limit:

$$\frac{2R}{d} \eta_p = \kappa_{p,0}(G) - \kappa_{1-p,0}(\tilde{G}) + \frac{2}{d}p - 1$$

- $\kappa_{p,h}(G)$  is an analog of the free energy density:

$$\kappa_{p,h}(G) \equiv \sum_V e^{hV} \frac{1}{V} \underbrace{\sum_{E,B} N_{V,E,B} p^E (1-p)^B}_{\mathbb{P}_V(p)}$$

$$1 - \theta_p = \left. \partial_h \kappa_{p,h} \right|_{h=0}$$

$$\chi_p = \left. \partial_h^2 \kappa_{p,h} \right|_{h=0}$$

$\mathbb{P}_V(p)$ : Probability of a cluster of size  $V$

- Transitive graph:  $\mathbb{P}_V(p)$  decay exponentially for any  $p < p_c$   
 $\Rightarrow \kappa_{p,0}$  analytic
- Scaling form:  $\mathbb{P}_s(p) = s^{-\tau} f\left((p - p_c)s^{1/\sigma}\right)$  [conjectured]
- $\kappa_{p,0}$  has non-analyticity at  $p_c$  [ $\partial_p^4 \kappa_{p,0}$  diverges]

## Analyticity bound

Any cluster on a graph with Cheeger constant  $i_E$  has  $B \geq i_E V$ .

With handshaking lemma, this also gives:  $E \leq \frac{\Delta - i_E}{2} V$ .



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For some  $p_0$ , let  $p > p_0$ , then  $1 - p < 1 - p_0$ , and we have

$$\begin{aligned} \mathbb{P}_v(p) &= \sum_{B,E} N_{V,E,B} p^E (1-p)^B \\ &\leq \sum_{B,E} N_{V,E,B} p_0^E (1-p_0)^B \left(\frac{p}{p_0}\right)^{(\Delta-i_E)V/2} \left(\frac{1-p}{1-p_0}\right)^{i_E V} \\ &= \mathbb{P}_v(p_0) \left(\frac{p^{(\Delta-i_E)/2} (1-p)^{i_E}}{p_0^{(\Delta-i_E)/2} (1-p_0)^{i_E}}\right)^V \leq \left(\frac{p^{(\Delta-i_E)/2} (1-p)^{i_E}}{p_0^{(\Delta-i_E)/2} (1-p_0)^{i_E}}\right)^V \end{aligned}$$

Take  $p_0 = \frac{(\Delta - i_E)/2}{(\Delta - i_E)/2 + i_E} = \frac{\Delta - i_E}{\Delta + i_E}$ , the maximum of  $p^{(\Delta-i_E)/2} (1-p)^{i_E}$ ,

$\Rightarrow$  Exponential decay of  $\mathbb{P}_v(p)$  for any  $p > p_0 \Rightarrow$  Analyticity of  $\kappa_p(G)$

$\Rightarrow \kappa_{1-p}$  analytic for  $p < 1 - p_0 = \frac{2i_E}{\Delta + i_E}$ . Also known:  $\frac{1}{\Delta - 1} \leq p_c \leq \frac{1}{i_E + 1}$

## Summary for erasure and percolation

- For self-dual hyperbolic tilings
  - $p_E \leq p_c = p_H^0 < p_H^1 = p_u$
  - Expect  $p_E < p_c$
  - Effectively infinite dimension — MF critical exponents
  - Proof relied on analyticity of  $\kappa_{p,0}(G)$  (cf. Lee-Yang zeros!)
- For codes with power-law distance based on amenable graphs ( $i_E = 0$ ) — e.g.,  $\mathbb{Z}^D$ :
  - $p_E = p_c = p_u$ ,  $p_H$  is not meaningful
  - MF exponents for  $D \geq 6$  (upper critical dimension)
- These results require local convergence of  $G_t \xrightarrow{t} G$ .

## Benjamini-Schramm convergence

Definition: consider a sequence of finite graphs  $(G_t)$ ,  $t \in \mathbb{N}$ , with vertex degrees uniformly bounded by  $\Delta$ . For each  $L = 1, 2, \dots$ , let  $B_t(v, L)$  be the ball of radius  $L$  in  $G_t$ , centered at its vertex  $v$ . Let us choose  $v$  randomly, and denote  $\pi_t(L; H)$  the probability that  $B_t(v, L)$  is isomorphic to  $H$ .

The sequence is said to be Benjamini-Schramm convergent if the sequence  $\pi_t(L; H)$ ,  $t \in \mathbb{N}$  is convergent for every  $L$  and  $H$ .

- This convergence guarantees only local properties
- Yet it is enough to construct an expansion of the limiting  $\kappa_{p,h}$  to an arbitrary order.
- This is enough to fix the location of percolation transition,  $p_c$
- In some cases, also the uniqueness,  $p_u$ , and the homological transitions,  $p_H^0$ .
- If distance scaling is also known, a bound on  $p_E$  can be made.

## Extension to other iid error models

- BS convergence of Tanner graphs  $\Rightarrow$  analyticity of free energy per edge,  $f(T)$ , at high enough temperatures  
[generalization of Borgs et al, 2012]
- This also defines a code family
- $\mathbb{P}_{\text{dec}} = \frac{Z_0}{Z_{\text{tot}}}$ ;  $\mathbb{P}_{\text{dec}} = 1$  for small enough  $T$  and  $p$
- $\frac{1}{n} \ln \mathbb{P}_{\text{dec}} = f_0(T) - f_{\text{tot}}(T) \xrightarrow{T \rightarrow \infty} -R \ln 2$   $\tanh \tilde{\beta} = e^{-2\beta}$   
 $\beta \equiv 1/T$
- At  $p = 0$  use duality:  $\frac{1}{n} \ln \mathbb{P}_{\text{dec}} = f_0(T) - f_0(\tilde{T})$  Only bounded-weight terms are involved
- In general,  $T_{\text{dec}} \leq \tilde{T}_c$  (dual of upper critical temperature).
- With known scaling of the distance, this allows to make a good lower bound for the decoding threshold,  $T_{\text{dec}}$ .



## Conclusions

- Erasures on graph-based LDPC codes:  $p_E \leq p_c \leq p_H^0 \leq p_H^1 \leq p_u$ 
  - Self-dual hyperbolic codes:  $p_c = p_H^0$
  - Codes on quasi-transitive graphs with  $d \propto n^\alpha$ :  $p_E = p_c$ .
- Here  $p_H^0$  is the “logical bit” erasure threshold
- Families of quantum LDPC codes can be introduced in terms of the distributional limit of the corresponding Tanner graphs
- This gives asymptotic distribution of linked clusters to any size — analog of the asymptotic weight distribution for ensembles of random classical codes, or a free energy density analytic in a finite range of parameters
- Thus defined thermodynamic properties are insensitive to local properties affecting sublinear fractions of the qubits
- For a well defined error correction threshold, additional information about the global properties of the codes is needed: e.g., distance scaling with  $n$

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