

# Information Storage in the Stochastic Ising Model at Zero Temperature

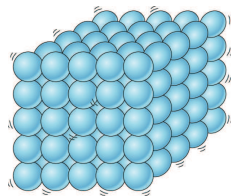
Ziv Goldfeld, Guy Bresler and Yury Polyanskiy

MIT

The 2018 International Symposium on Information Theory  
Vail, Colorado, US

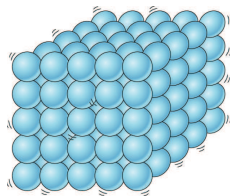
Jun. 21st, 2018

# Storing Information Inside Matter



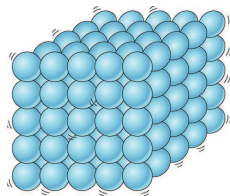
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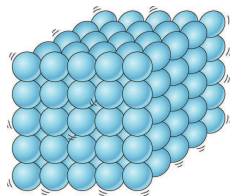
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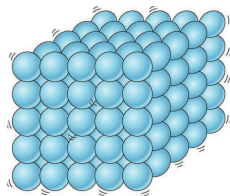
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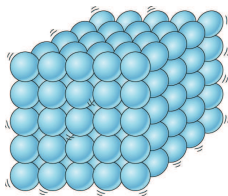
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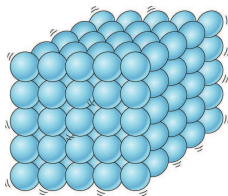
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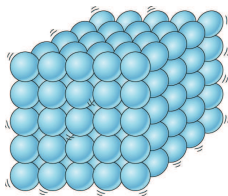


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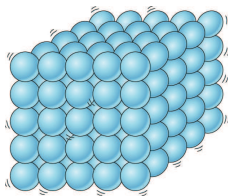


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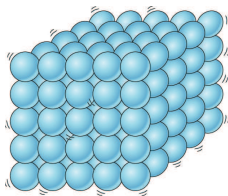


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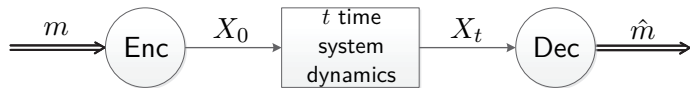
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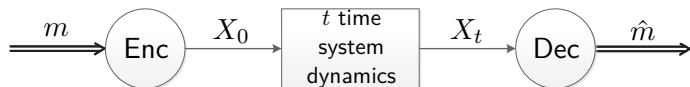
## Goals:

- Distill notion of storage from particular technology
- Capture interparticle interaction and system's dynamics
- How much data can be stored and for how long?

# Operational Framework

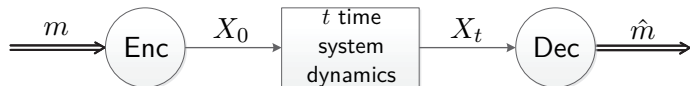


# Operational Framework



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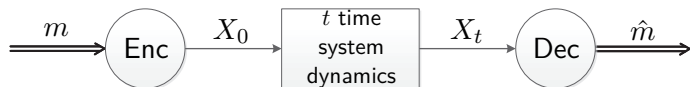
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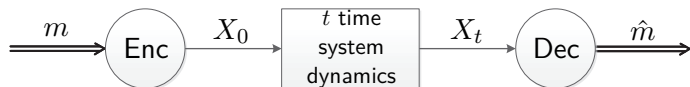


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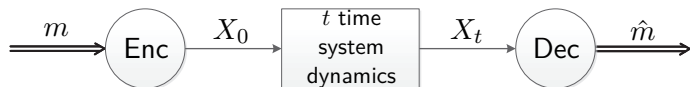
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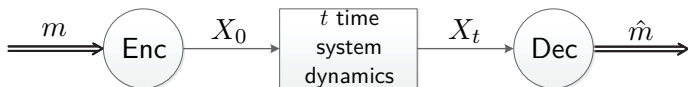
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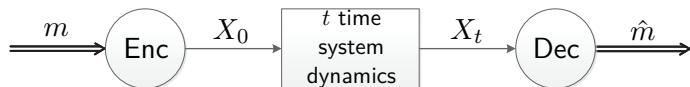
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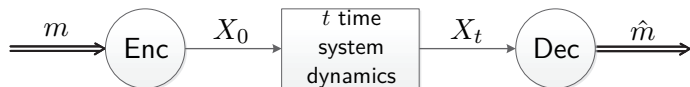
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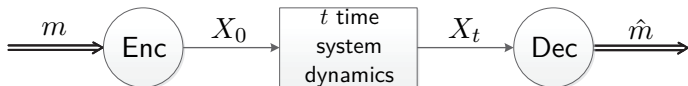
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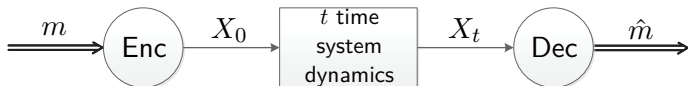
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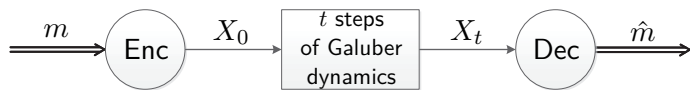
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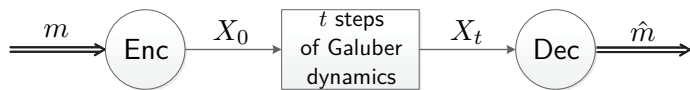
**Warm** ( $\beta$  small)  $\implies$  Weak interactions

**Cold** ( $\beta$  large)  $\implies$  Strong interactions

# Measuring Information Storage



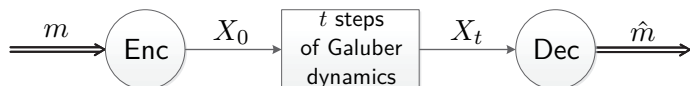
# Measuring Information Storage



## Information Capacity:



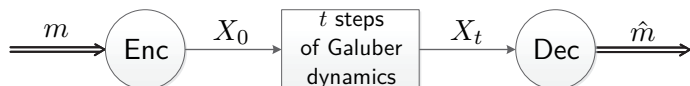
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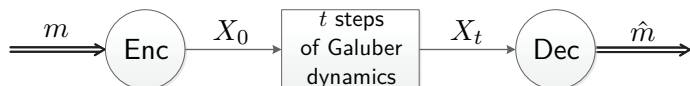


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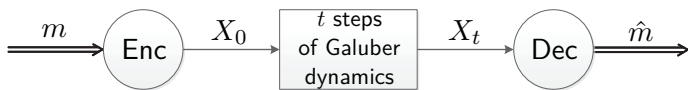


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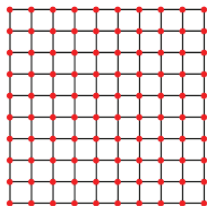
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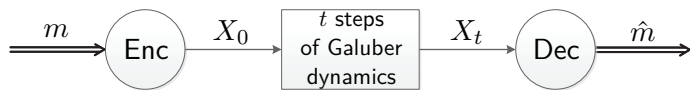
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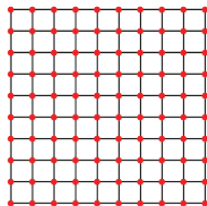


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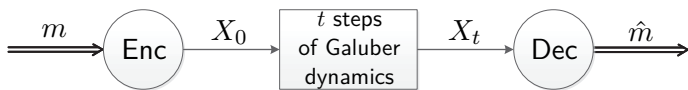
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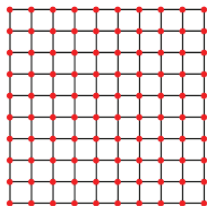
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⊛ **Cold:** Can interactions (memory) help?



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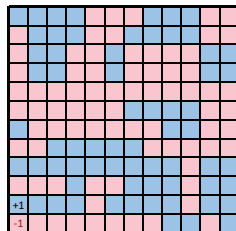
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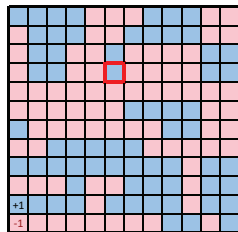
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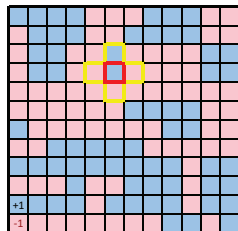
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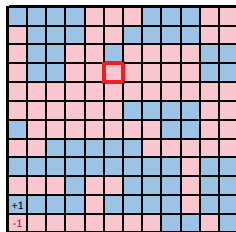
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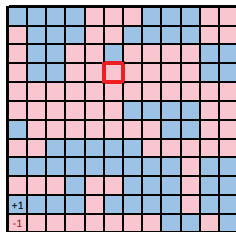
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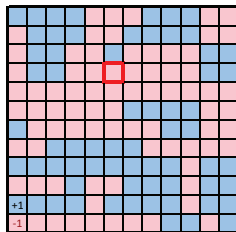


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**Q1:** What (if anything) can be stored for infinite time?

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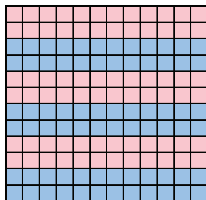
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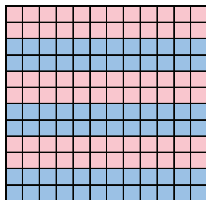
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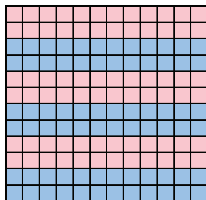
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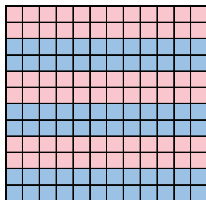
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**Q2:** Can we do better than  $\sqrt{n}$  for finite superlinear  $t$ ?

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Let  $a(n) = o(n)$ . Then  $\exists c > 0$  s.t.  $I_n(t) = \Omega\left(\frac{n}{a(n)}\right)$ ,  $\forall t \leq c \cdot a(n) \cdot n$ .

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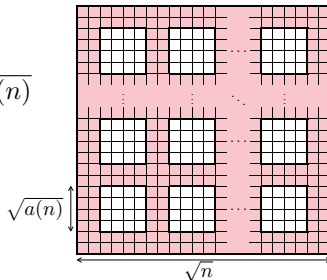
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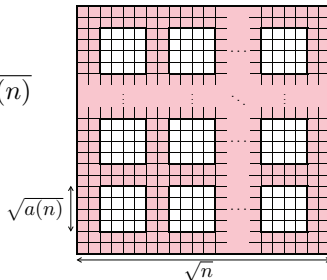
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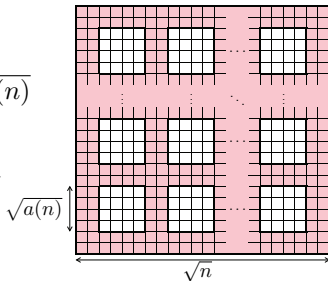
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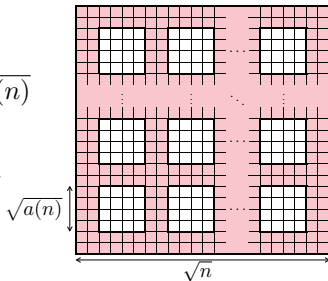
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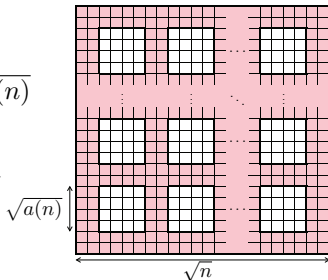
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$$I_n(t) \approx I_n^{(c)}((1 + o(1))t), \quad t \sim \text{suplog}(n)$$

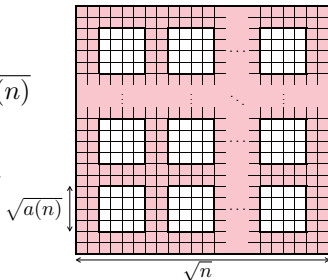
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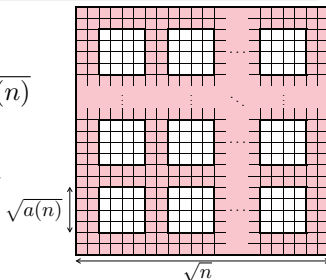
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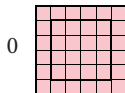
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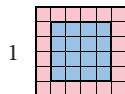
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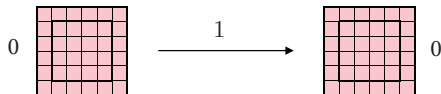
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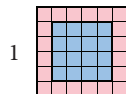
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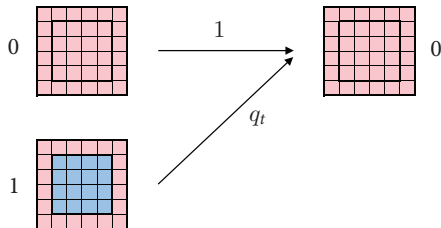


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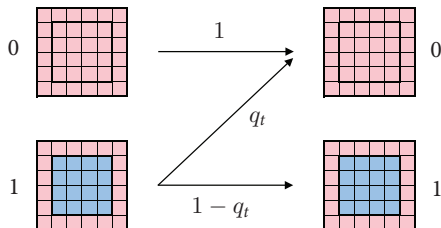


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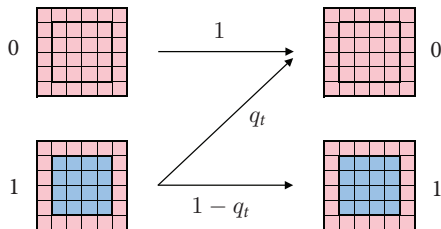


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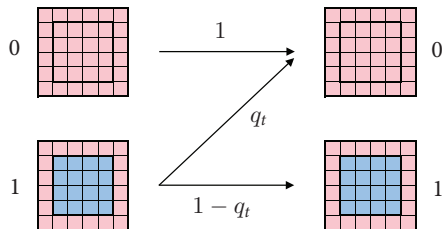


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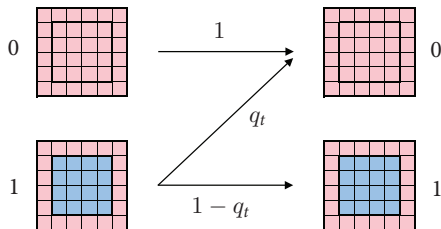
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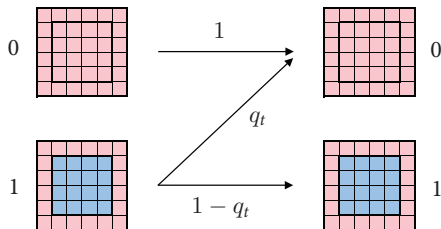
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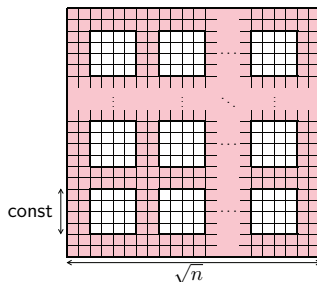
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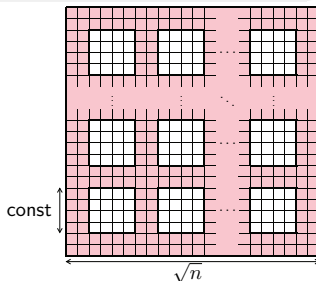
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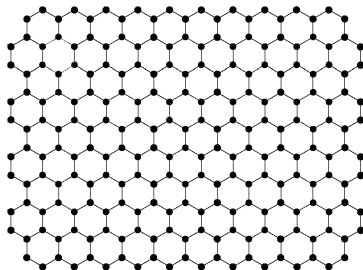
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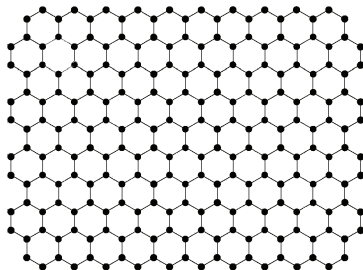
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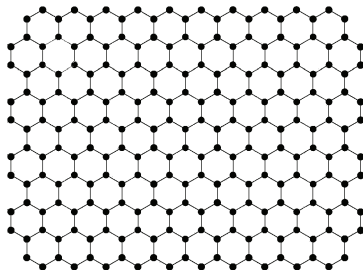
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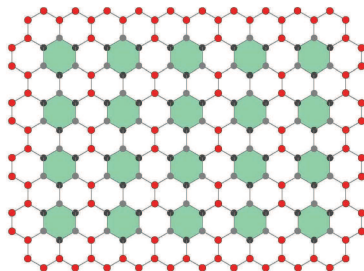
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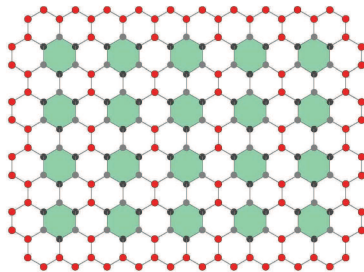
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For zero-temp. SIM on Honeycomb lattice with  $n$  vertices:  
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