

# CS 229r - LECTURE 20

4/6/17

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- TODAY:
- 1) Finish High Rate LDPCs
  - 2) LTC constructions.
    - 2.1) Redundant LDPCs
    - 2.2) Tensor codes & Testing  $\Rightarrow$  RM-like perf.
    - 2.3) Zig-Zag codes & Testing  $\Rightarrow$   $\sim$  polylog locality

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LDC: See notes for Lecture 19

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Terminology: LDPC codes: Low Density Parity Check  
= Gallager codes  
= Tanner codes  
= Sipser-Spielman codes.

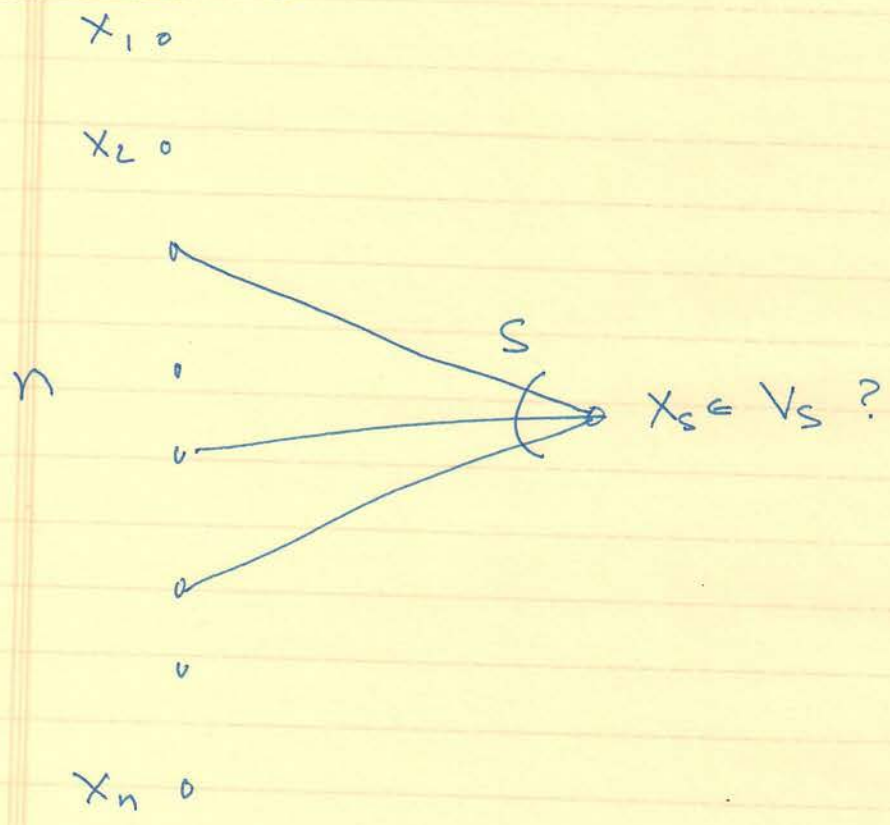
Low Density: Parity Check Matrix = Sparse

- $\Leftrightarrow$  Underlying graph sparse
- $\Leftrightarrow$  average constant degree.

Contrast: LDPC & LTCs

LTC: Picks randomly  $S \subseteq [n]$ ;  $|S| \leq \ell$   
& verify  $x|_S \in V_S \subseteq \mathbb{F}_2^{|S|}$

(i) LTC  $\Rightarrow$  LDPC



"Strong soundness"  $\Rightarrow \forall S \quad x_S \in V_S \Leftrightarrow x \in C$

$$Pr[x_S \notin V_S] \geq \epsilon \cdot \delta(x, C)$$

$$0 \Rightarrow \delta(x, C) = 0 \Rightarrow x \in C$$

~~$\delta(x, C)$~~

(ii) But LDPC  $\not\Rightarrow$  LTC [Ben-Sasson Harsha Razkhodnikova]



- Key Issue: Need redundant local constraints.

i.e. Removing ~~1/2~~ one or few or ~~constant fraction of~~ constraints  $\frac{1}{R}$  fraction of constraints should not change the code.

- How can we get redundancy.

o Ans 1: By building code with many symmetries.

E.g. RM codes have constraint for each line.

# coordinates =  $n = q^m$

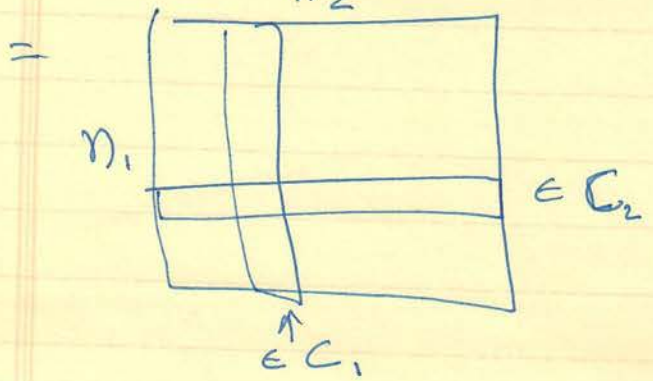
# constraints =  $\binom{q^m}{2} \approx n^2 \gg n$ .

o Ans 2: Tensor Products [Ben-Sasson-Sudan]

Tensor Product Code

$C_1 = [n_1, k_1, d_1]_q$  &  $C_2 = [n_2, k_2, d_2]_q$

$C_1 \otimes C_2 = [n_1 n_2, k_1 k_2, d_1 d_2]_q$  code with codewords



with every column in  $C_1$  every row in  $C_2$ .

Exercise: Prove dimension & distance

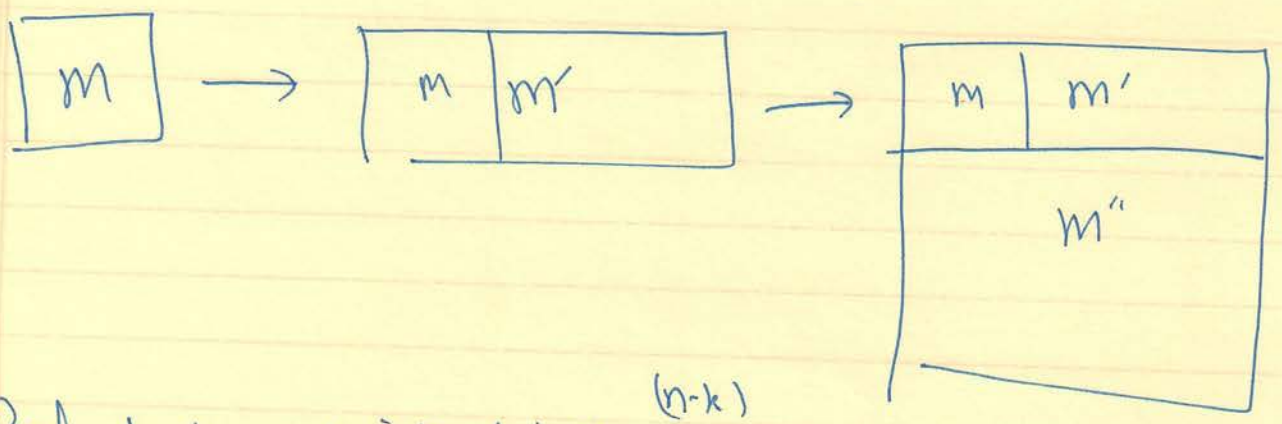
Redundancy in Tensor Product Codes Let  $C_1 = C_2 = C$ .

Code has length  $n^2$

- But specified by  $2n$  constraints; assume  $C$  is a systematic code with first  $k$  coordinates being message.

- Then given  $k \times k$  matrix  $M$ , its encoding may be obtained by expanding rows into codewords of  $C$  [giving matrix  $M' \in \mathbb{F}^{k \times n}$ ]

& then expanding columns into codewords of  $C$  giving  $n \times n$  matrix  $M''$ .



- Redundant constraints:  $(n-k)$  bottom rows of  $M'' \in C$ !

[<sup>Code</sup> Encoding specified by saying top  $k$  rows in  $M'' \in C$  & all columns in  $M'' \in C$ ]



### Basic Testing Question

if  $\Pr[\text{random row} \in C] \geq 1 - \epsilon$   
 &  $\Pr[\text{random column} \in C] \geq 1 - \epsilon$

then  $\delta(m, C \otimes C) \leq 1 - \epsilon''$  ?

### Robust Testing Question

if  $\frac{1}{2} \left[ \mathbb{E}_{\text{row}} [\delta(m|_{\text{row}}, C)] + \mathbb{E}_{\text{column}} [\delta(m|_{\text{column}}, C)] \right] \leq \beta$

$\Rightarrow \delta(m, C \otimes C) \leq \alpha \cdot \beta$

Why Robustness?  $\uparrow$  if  $C \otimes C$ -test is  $\alpha$ -robust ~~then~~  
 &  $C$  is  $(\epsilon, \ell)$ -locally testable,  
 then  $C \otimes C$  is  $(\frac{\epsilon}{\alpha}, \ell)$ -locally testable.  
 $\uparrow$  Proposition  $\uparrow$

Hope:  $\forall \delta \exists \alpha$  s.t. if  $C$  is a code of  $\text{dist} \geq \delta$   
 [BSS] then  ~~$C \otimes C$  is  $\alpha$~~   
 $C$ -test for  $C \otimes C$  is  $\alpha$ -robust.

Example: No.  
 [Paul Valiant]

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Generalizing:  $C^{\otimes m} = C \otimes C \otimes \dots \otimes C$

$C^{\otimes l}$  test of  $C^{\otimes m}$ : Pick random  $l$ -dim axis parallel surface  $S$   
Verify  $\int(M|_S, C^{\otimes l}) \leq \text{small}$ .

Theorem [Ben-Sasson-S., Videman]

$\forall m \geq 3 \exists \delta \exists \alpha$  s.t. if  $f(C) \geq \delta$  then

$C^{\otimes m-1}$  test for  $C^{\otimes m}$  is  $\alpha$ -robust.

Corollary

$\forall m \geq 3 \forall \delta \exists \alpha'$  s.t. if  $f(C) \geq \delta$  then

$C^{\otimes 2}$  test for  $C^{\otimes m}$  is  $\alpha'$ -robust.

Proposition: A-test for B is  $\alpha_1$ -robust  
& B-test for C is  $\alpha_2$ -robust  
 $\Rightarrow$  A-test for C is  $(\alpha_1 \alpha_2)$ -robust.



### Using Tensor Codes directly

Thm [Viderman]:  $\forall \alpha, \beta > 0 \exists \delta$  s.t. for large  $N \exists$  codes of length  $N$ , Rate  $\geq 1 - \alpha$ , locality  $\leq N^\beta$ , distance  $\geq \delta$

Proof: Exercise (analogous to Kopparty, Serat, Yekhanin).

~~Can do~~  
But dependence of  $\delta$  on  $\alpha, \beta$  much worse ( $\delta = (\alpha\beta)^{1/\beta}$ )

### Tensor Codes + Distance-Amplification

Thm [KMRS1]:  $\exists n^{o(1)}$  function  $\ell(n)$  s.t.  $\forall \delta \exists$  codes of rate  $1 - \delta - o(1)$  & dist  $\delta$  that are  $\ell(n)$ -locally testable.   
 ← barely subpolynomial; worse than for LDPC.



But: Can do much better:

We have two operations:

- Tensor Product: Makes code longer; Preserves locality; Makes distance worse; Makes Rate worse
- A-L Transform: Code longer; Loses locality; Improves distance; Makes rate worse.

Idea: Will pick  $\delta_0 = o(1)$

m - repetitions of Tensor Product followed by A-L Transform

Rate	$R$	$\rightsquigarrow$	$R^2$	$\rightsquigarrow$	$R^2 - \delta_0$
dist	$\delta_0$	$\rightsquigarrow$	$\delta_0^2$	$\rightsquigarrow$	$\delta_0$
locality	$l$	$\rightsquigarrow$	$l$	$\rightsquigarrow$	$l/\delta_0$
length	$n_i$	$\rightsquigarrow$	$n_i^2$	$\rightsquigarrow$	$n_i^2 = n_{i+1}$

~~Alt~~ Start with  $n_0 = \frac{\text{near const.}}{\text{poly}(1/\delta_0)}$ ;  $R = 1 - \delta_0$

$$n_i = n_0^{2^i}; R_i = R - 2^i \delta_0; l_i = l/\delta_0^i$$

Yields codes of length  $N$  with  $R = 1 - o(1)$ ;  $l_i = (\log N)^{\log N}$ .



(Need some care)

Tensor products testable only by  $\square$ 's .... But can work this out. Details omitted.



Concluding:

LTCs  $\rightsquigarrow$  very strong performance

LDCs  $\rightsquigarrow$  weaker but substantially  $o(n)$  for no-cost!

LRCs  $\rightsquigarrow$  ~~strong~~

Other concepts

Relaxed LDCs: Either recover a bit or say "there are too many errors".

Usually as good as LTCs ...