# Time and Space Efficient Deterministic Decoders

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### What is an Error Correcting code?

**Definition** (Error Correcting Code):

Function C:  $\Sigma^k \rightarrow \Sigma^n$  such that for  $x \neq y$ , we have

 $\Pr_{i}[C(x)_{i}\neq C(y)_{i}] \geq \boldsymbol{\delta}^{*}.$ 

Relative distance  $\boldsymbol{\delta}^*$ , rate r = k/n. Good if  $\boldsymbol{\delta}^*$ , r =  $\boldsymbol{\Omega}(1)$  and  $|\boldsymbol{\Sigma}| = O(1)$ .

The correcting radius is  $\boldsymbol{\delta} = \boldsymbol{\delta}^*/2$ .

Many, many applications,

some of which are in the small space regime.



### What is a low space decoder?

Input is read only. Output is write only. Have only n<sup>o(1)</sup> working space.



### **Reed-Solomon Codes**

Reed-Solomon codes: univariate low degree polynomials.

Example: message  $a = (a_1, a_2, a_3)$ , field of order 5. Let  $f_a(x) = a_1 + a_2 x + a_3 x^2$ . Codeword is:  $[f_a(0), f_a(1), f_a(2), f_a(3), f_a(4)]$ . Has known (almost) linear time (and space) decoders.

Examples: [0, 1, 2, 3, 4] is the codeword of (0, 1, 0), f(x) = x. [1, 2, 0, 0, 2] is the codeword of (1, 0, 1),  $f(x) = 1 + x^2$ .

### **Reed-Muller Codes**

Reed-Muller codes: codewords are multivariate low degree polynomials.

$$f(x,y) = a_1 + a_2 x + a_3 x^2 + a_4 xy + a_5 y + a_6 y^2.$$

$$f(0,0) \quad f(1,0) \quad f(2,0) \quad f(3,0) \quad g(A)$$

$$f(0,1) \quad f(1,1) \quad f(2,1) \quad g(3) \quad f(4,1)$$

$$f(0,2) \quad f(1,2) \quad g(2) \quad f(3,2) \quad f(4,2)$$

$$f(0,3) \quad f(1,2) \quad g(2) \quad f(3,3) \quad f(4,3)$$

$$f(0,3) \quad f(1,4) \quad f(2,4) \quad f(3,4) \quad f(4,4)$$

### Local Decoding

Correct a symbol with a small number of queries.

Take a random line through a point.

Works when line hits few corruptions.

Deterministic local correction?

No.

Always checks the same few symbols, adversary corrupts those.

**Red:** Corrupt This line works Correct here This line fails

Reed-Muller

Green: Correct

### Locally Correctable Codes (LCC)

### **Definition** (Locally Correctable Code (LCC)):

An LCC is a code C:  $\Sigma^k \rightarrow \Sigma^n$  with a randomized algorithm D such that:

For any  $w \in \Sigma^n$ ,  $x \in \Sigma^k$  where  $\Pr_i[C(x)_i \neq w_i] \leq \delta$  and any  $i \in [n]$  we have

 $\Pr[D(w, i) \neq C(x)_i] \leq \frac{1}{3}$ 

D is q query if it only makes q queries to w.  $\delta$ ' is called the correcting radius.

Most codes we consider are systematic (the message is contained as plain text within the codeword), so local correctors are decoders.

### Randomized Decoder Continued

Reed-Muller codes are locally correctable!

By repeating  $O(\log(n))$  times, the error probability drops below 1/n.

So it is unlikely any symbol is decoded incorrectly.

This gives a time and space efficient randomized decoder.

Local correction cannot be **deterministic**!

This decoder is **non-adaptive** (queries do not depend on the input).

### Non-Adaptive, Deterministic Decoders Fail

Gronemeier: non-adaptive deterministic decoders can't be sub-polynomial space and almost linear time.

Non-adaptive means read and write locations are independent of the input.

Idea: for space S, wait for an interval where the decoder outputs S+1 symbols and only reads o(n) input symbols.



### First Result: Efficient (Non-Uniform) Deterministic Decoders

### **Theorem** (Deterministic Decoder for LCC):

Good, typical<sup>\*</sup> q = n<sup> $\alpha$ </sup> query LCCs have **non-uniform**, *deterministic* decoders running in space O(q log(n)<sup>2</sup>) and time n<sup>1+O( $\sqrt{\alpha}$ )</sup>.

\*(typical means systematic, non-adaptive, and with perfect completeness).

For  $q = n^{o(1)}$ : space is  $n^{o(1)}$  and time  $n^{1+o(1)}$ .

Gronemeier proved non-adaptive decoders for good codes required time T and space S such that  $ST = \Omega(n^2)$ .

### A flawed approach

Find a (single) q query f such that

 $\Pr_{i,i}[C(x)_{i} \neq f_{i}(w)_{i}] \leq \eta \Pr_{i}[C(x)_{i} \neq w_{i}]$ 

f reduces corruptions by an  $\eta$  fraction.

Good Corruption Codeword Correct here

Input

Tradeoff between q and  $\eta$ .

Need both q and  $\eta$  small.

### How good can a single, deterministic f be?

If f makes q queries, and we can corrupt  $\boldsymbol{\delta}$  fraction of symbols.



For deterministic f, only get  $\eta = 1/q$ 

### Why doesn't it work?

Deterministic, q query f only reduces  $\boldsymbol{\delta}$  corruptions to  $\boldsymbol{\delta}/q$ .

To get zero errors, we would need **δ**n queries (per symbol)!



This gives a total time of  $\delta n^2$ .

### Fix: More than one function

What about m different q query functions  $f_1, ..., f_m$ ?

Now the  $O(\delta / q)$  failures are distributed among m functions.

Less than  $O(\delta / m)$  on average.

Don't have to pay for m in the recursion, so can make  $m \gg q!$ 

### **Definition** (Improving Set):

 $f_1, ..., f_m$  is a below  $\boldsymbol{\delta}$ , factor  $\eta$  improving set if for any w and C(x) with  $Pr_i[C(x)_i \neq w_i] \leq \boldsymbol{\delta}$  we have

 $\Pr_{i,i}[C(x)_{i} \neq f_{i}(w)_{i}] \leq \eta \Pr_{i}[C(x)_{i} \neq w_{i}]$ 



Still recursive, but fewer levels if q  $\ll$  m.

### Can We Find such an Improving Set?

Yes, (for typical LCC).

For any q query LCC and  $\eta$ , there is a O(qlog(n)) query improving set with size

 $m = O(\log(n)^2/\eta).$ 

If q = n<sup>o(1)</sup>, then setting  $\eta$  appropriately gives space n<sup>o(1)</sup> time n<sup>1+o(1)</sup>.

### Uniform Decoding for Reed-Muller

### Second Result: Efficient Uniform Decoders

### **Theorem** (Deterministic, Uniform Decoders):

There is a good code with a **uniform**, deterministic decoder running in space  $n^{o(1)}$  and time  $n^{1+o(1)}$ .

The code is based on Lifted Reed-Solomon codes.

Also applies to the specific case of Reed-Muller codes.

### Samplers

Family of subsets of N, S.

We say  $\mathscr{S}$  is a sampler if:

For all sets A (let  $\mu = |A|/|N|$ ).

The probability  $S \in \mathscr{S}$  oversamples A is low.



**Definition** (Sampler):  $\mathscr{S} = (S_1, ..., S_k)$  where  $S_i \subseteq N$  is a sampler if for some accuracy error  $\varepsilon > 0$  and strong confidence error  $\delta$ , for all  $A \subseteq N$ , and  $\mu = |A|/|N|$  we have

 $\mathsf{Pr}_{\mathsf{i}}[|\mathsf{S}_{\mathsf{i}} \cap \mathsf{A}| / |\mathsf{S}_{\mathsf{i}}| \geq \mu + \varepsilon] \leq \delta \mu.$ 

### **Curve Samplers**

Need samplers with special structure to allow decoding.

- Lines (Line samplers).
- Subspaces (Space Samplers).
- Curves (Curve Samplers).

Prior curve samplers by Ta-Shma and Umans (and later by Guo) exist, but they:

- Had too many samples, more than  $n^4$ , while we need  $n^{1+o(1)}$ .
- Only proved a weaker notion of confidence error.



### How good are line samplers?

For q queries, the probability they oversample is about  $\eta \cong 1/q$ .

Comes from pairwise independence.

#### **NOT GOOD ENOUGH!** Need $\eta \ll 1/q$ .

This is the best lines (or subspaces) can do!

Solutions?

Use curves (works, but gives much worse rate).

Use several lines through a point

(extends to lifted Reed-Solomon codes).

### Third Result: New Curve Samplers

### Theorem (Curve Sampler):

For appropriate degree t, dimension d, and any  $\varepsilon > 0$  there is a degree t-curve sampler for  $\mathbb{F}^d$  of size n  $|\mathbb{F}|^{\text{poly}(t)}$  with accuracy error  $\varepsilon$  and strong confidence error:

 $\delta = O_t(1/(\varepsilon |\mathbb{F}|)^{\Box(t)})$ 

The number of samples is close to  $n = |\mathbb{F}|^d$  when  $t \ll d$ .

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The number of queries is q = |\mathbb{F}|.
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For large t, confidence error is less than 1/q.

### Sampler Construction

First sample a subspace.

Epsilon biased sets in extension field. Gives a line sampler, which is a subspace sampler over original field.

#### Sub-sample with curves.

Since subspace is small, use all low degree curves as a sampler.

Choose one curve.

Do low degree correction on that curve.

Or a sample a few lines through a point in that subspace.

Choose a few lines.

Correct on each line and take a majority.



### **Some Technical Notes**

### **Subspace Samplers**

Subspace samplers come from line samplers in extension fields.

Line samplers through  $\varepsilon$ -biased sets.

 $\varepsilon$ -biased sets (Jalan, Moshkovitz using techniques from Ta-Shma).

Lines through extension field are subspaces of base field.

Prior curve samplers also use extension fields (Ta-Shma and Umans).

Uses curves, not lines over extension field.

Doesn't let us subsample lines (needed for good rate).

Not as randomness efficient ( $\Box$ (n<sup>2</sup>) samples).

### Getting Better Rate with Fewer Queries.

Reed-Muller gives bad rate for few queries.

Use a closely related code called Lifted Reed-Solomon.

Low degree only when restricted to lines.

Can't use curve samplers, we use samplers with many lines.

For high degree and low characteristic, more general than Reed-Muller.

Lifted Reed-Solomon with high rate (and few queries) has low distance.

Use distance amplification: Kopparty, Saraf, and Yekhanin.

### **Open Problems**

- 1. Find a single code that is encodable and decodable in space  $n^{o(1)}$ , time  $n^{1+o(1)}$ .
- 2. Extend to list decoding.
  - a. Already did this in a follow up work *for Reed-Muller* codes.
    - i. Constants are huge, 10<sup>20</sup>. Give better constants.
  - b. Doesn't have constant rate when achieving space  $n^{o(1)}$ , time  $n^{1+o(1)}$ .
- 3. Give time/space efficient **uniform** decoders for more codes (like multiplicity codes).
  - a. Only gave non-uniform decoders for multiplicity codes.
- 4. Find a deterministic decoder running in space polylog(n) and time n polylog(n).

## Thanks for Listening