Unique Decoding of Explicit *\epsilon*-balanced Codes near the Gilbert–Varshamov Bound

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Goal of the Talk

Goal

Present an efficient unique decoding algorithm for Ta-Shma's binary codes

Goal of the Talk

Outline

- Notation and Context ($\approx 25\%$)
- Direct Sum and Ta-Shma's Codes (\approx 25%)
- Our Decoding Techniques (\approx 50%)

Code

A binary code is a subset $\mathcal{C} \subseteq \mathbb{F}_2^n$



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Two Fundamental Properties

Distance

The distance $\Delta(\mathcal{C})$ of \mathcal{C} is

$$\Delta(\mathcal{C}) \coloneqq \min_{z, z' \in \mathcal{C}: \ z \neq z'} \Delta(z, z'),$$

where $\Delta(z, z')$ is the (normalized) Hamming distance.

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where $\Delta(z, z')$ is the (normalized) Hamming distance.

Rate

Fraction of information symbols
$$\frac{\log_2(|\mathcal{C}|)}{n}$$
 aka the rate $r(\mathcal{C})$ of \mathcal{C}



Question

How large can we take $p \in [0, 1)$?

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How large can we take $p \in [0, 1)$? Information theoretically, any $p \in [0, \Delta(\mathcal{C})/2)$ is valid for unique decoding



Error Model

This adversarial error model was introduced by Hamming in 1950



Figure: Richard W. Hamming (source: mathshistory.st-andrews.ac.uk).

Tension

- Increasing the rate $r(\mathcal{C})$ may reduce the distance $\Delta(\mathcal{C})$
- Increasing the distance $\Delta(\mathcal{C})$ may reduce the rate $r(\mathcal{C})$









Question

What is the best trade-off between rate $r(\mathcal{C})$ and distance $\Delta(\mathcal{C})$?

Gilbert'52, Varshamov'57 (abridged)

For every distance $\rho \in (0, 1/2)$, there exists C of size $2^n/\text{Vol}(\text{Ball}(\rho))$, or equivalently $r(C) \approx 1 - H_2(\rho)$

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Why is the Gilbert-Varshamov bound interesting?

The Gilbert-Varshamov (GV) bound is "nearly" optimal



McEliece-Rodemich-Rumsey-Welch'77 impossibility bound





For distance $1/2 - \epsilon$

- rate $\Omega(\epsilon^2)$ is achievable (Gilbert–Varshamov bound)
- rate better than $O(\epsilon^2 \log(1/\epsilon))$ is impossible (McEliece *et al.*)

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Ta-Shma's Codes (60 years later!)

First explicit binary codes near the GV are due to Ta-Shma'17

- ullet these codes have distance $1/2-\epsilon/2$ (actually $\epsilon\mbox{-balanced}),$ and
- rate $\Omega(\epsilon^{2+o(1)})$.

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lssue

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Theorem (this work)

Ta-Shma's codes are polynomial time unique decodable

Our Contribution

Theorem (Unique Decoding)

For every $\epsilon > 0$, \exists explicit binary linear Ta-Shma codes $\mathcal{C}_{N,\epsilon,\beta} \subseteq \mathbb{F}_2^N$ with

- distance at least $1/2 \epsilon/2$ (actually ϵ -balanced),
- 2 rate $\Omega(\epsilon^{2+\beta})$ where $\beta = O(1/(\log_2(1/\epsilon))^{1/6})$, and

3 a unique decoding algorithm with running time $N^{O_{\epsilon,\beta}(1)}$.

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- distance at least $1/2 \epsilon/2$ (actually ϵ -balanced),
- 2 rate $\Omega(\epsilon^{2+eta})$ where $eta=O(1/(\log_2(1/\epsilon))^{1/6})$, and
- **③** a unique decoding algorithm with running time $N^{O_{\epsilon,\beta}(1)}$.

Furthermore, if instead we take $\beta > 0$ to be an arbitrary constant, the running time becomes $(\log(1/\epsilon))^{O(1)} \cdot N^{O_{\beta}(1)}$ (fixed polynomial time).

Our Contribution

Theorem (Gentle List Decoding)

For every $\epsilon > 0$, \exists explicit binary linear Ta-Shma codes $\mathcal{C}_{N,\epsilon,\beta} \subseteq \mathbb{F}_2^N$ with

- distance at least $1/2 \epsilon/2$ (actually ϵ -balanced),
- **3** rate $\Omega(\epsilon^{2+eta})$ where $\beta = O(1/(\log_2(1/\epsilon))^{1/6})$, and
- **3** a list decoding algorithm that decodes within radius $1/2 2^{-\Theta((\log_2(1/\epsilon))^{1/6})}$ in time $N^{O_{\epsilon,\beta}(1)}$.

Related Work

All based on code concatenation starting from larger alphabet codes

Theorem (Guruswami–Indyk'04)

Efficiently decodable **non-explicit** *binary codes at the Gilbert–Varshamov bound*

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All based on code concatenation starting from larger alphabet codes

Theorem (Guruswami–Indyk'04)

Efficiently decodable **non-explicit** binary codes at the Gilbert–Varshamov bound

Theorem (Hemenway–Ron-Zewi–Wootters'17)

Near-linear time decodable non-explicit binary codes at the Gilbert–Varshamov bound

All based on code concatenation starting from larger alphabet codes

Theorem (Guruswami–Rudra'06)

There are explicit binary codes list decodable from radius $1/2-\epsilon$ and rate $\Omega(\epsilon^3)$ (Zyablov bound)

All based on code **concatenation** starting from larger alphabet codes

Theorem (Guruswami–Rudra'06)

There are explicit binary codes list decodable from radius $1/2 - \epsilon$ and rate $\Omega(\epsilon^3)$ (Zyablov bound)

GR'06 results can now also be obtained from some later capacity achieving codes

Towards Ta-Shma's Codes

Expander Graphs and Codes

Expanders can amplify the distance of a not so great base code $\mathcal{C}_{\mathbf{0}}$

Expansion and Distance Amplification

Fix a bipartite graph between [n] and $W(k) \subseteq [n]^k$. Let $z \in C_0 \subseteq \mathbb{F}_2^n$.



Direct Sum

[*n*]

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Direct Sum



[*n*]

rate loss factor n/|W(k)|

distance amplification needs to be worth this loss

Alon-Brooks-Naor-Naor-Roth & Alon-Edmonds-Luby style distance

Direct Sum

Let $z \in \mathbb{F}_2^n$ and $W(k) \subseteq [n]^k$. The *direct sum* of z is $y \in \mathbb{F}_2^{W(k)}$ defined as

$$y_{(i_1,\ldots,i_k)}=\mathsf{z}_{\mathsf{i}_1}\oplus\cdots\oplus\mathsf{z}_{\mathsf{i}_k},$$

for every $(i_1, \ldots, i_k) \in W(k)$. We denote $y = \operatorname{dsum}_{W(k)}(z)$.

Bias

- Let $z \in \mathbb{F}_2^n$. Define bias $(z) \coloneqq |\mathbf{E}_{i \in [n]}(-1)^{z_i}|$.
- Let $\mathcal{C} \subseteq \mathbb{F}_2^n$. Define $bias(\mathcal{C}) := max_{z \in \mathcal{C} \setminus \{0\}} bias(z)$.

Definition (Parity Sampler, c.f. Ta-Shma'17)

Let $W \subseteq [n]^k$. We say that dsum_W is (ϵ_0, ϵ) -parity sampler iff

 $(\forall z \in \mathbb{F}_2^n) (\operatorname{bias}(z) \le \epsilon_0 \implies \operatorname{bias}(\operatorname{dsum}_W(z)) \le \epsilon).$

Parity Samplers

Where to look for good parity samplers $W(k) \subseteq [n]^k$?

A Dream Parity Sampler

Let $z \in \mathbb{F}_2^n$ with $bias(z) \le \beta_0 < 1$. Let $W(k) = [n]^k$. Then $bias (dsum_{W(k)}(z)) \le |\mathbf{E}_{i \in [n]}(-1)^{z_i}|^k \le \beta_0^k$.

A Dream Parity Sampler

Let $z \in \mathbb{F}_2^n$ with $bias(z) \le \beta_0 < 1$. Let $W(k) = [n]^k$. Then

$$\mathsf{bias}\left(\mathsf{dsum}_{W(k)}(z)\right) \leq |\mathbf{E}_{i \in [n]}(-1)^{z_i}|^k \leq \beta_0^k.$$

Issue: Vanishing Rate

W(k) is "too dense" so distance amplified code has rate $\leq 1/n^{k-1}$

Another Dream Parity Sampler

Sample a uniformly random $W(k) \subseteq [n]^k$ of size $\Theta_{\epsilon_0}(n/\epsilon^2)$. Then w.h.p. dsum_W is (ϵ_0, ϵ) -parity sampler.

Another Dream Parity Sampler

Sample a uniformly random $W(k) \subseteq [n]^k$ of size $\Theta_{\epsilon_0}(n/\epsilon^2)$. Then w.h.p. dsum_W is (ϵ_0, ϵ) -parity sampler.

Issue: Non-explicit

Now W(k) has near optimal size but it is non-explicit

Solution 1 (good but not near optimal)

Take $W(k) \subseteq [n]^k$ to be the collection of all length-(k-1) walks on a sparse expander graph G = (V = [n], E)

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Take $W(k) \subseteq [n]^k$ to be the collection of **all** length-(k - 1) walks on a sparse expander graph G = (V = [n], E) (suggested by Rozenman–Wigderson and analyzed by Ta-Shma'17)

Solution 1 (good but not near optimal)

This solution yields codes of distance $1/2 - \epsilon$ and rate $\Omega(\epsilon^{4+o(1)})$

Solution 2 (near optimal) Ta-Shma'17

Take $W(k) \subseteq [n]^k$ to be a **carefully chosen** collection of length-(k-1) walks on a sparse expander graph G = (V = [n], E)

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Solution 2 (near optimal) Ta-Shma'17

Take $W(k) \subseteq [n]^k$ to be a **carefully chosen** collection of length-(k - 1) walks on a sparse expander graph G = (V = [n], E) (beautiful breakthrough of Ta-Shma'17 based on generalizations of the Zig-Zag product Reingold–Vadhan-Wigderson)

Solution 2 (near optimal) Ta-Shma'17

This solution yields codes of distance $1/2 - \epsilon$ and rate $\Omega(\epsilon^{2+o(1)})$

Decoding Direct Sum

What does decoding look like for direct sum?

Setup

- $\mathcal{C}_0 \subseteq \mathbb{F}_2^n$ an ϵ_0 -balanced code with $\Delta(\mathcal{C}_0) = 1/2 \epsilon_0/2$
- $W = W(k) \subseteq [n]^k$ for direct sum
- $C = \operatorname{dsum}_W(C_0)$ an ϵ -balanced code with $\Delta(C) = 1/2 \epsilon/2$

[*n*]

Suppose $y^* \in C$ is corrupted into some $\tilde{y} \in \mathbb{F}_2^W$ in the unique decoding ball centered at y^* .



k-XOR

Unique Decoding Scenario: k-XOR

Unique decoding $\tilde{\mathbf{y}}$ amounts to solving

$$\operatorname*{arg\,max}_{z\in\mathcal{C}_0}\mathrm{E}_{(i_1,\ldots,i_k)\in W}\mathbf{1}[z_{i_1}\oplus\cdots\oplus z_{i_k}=\tilde{y}_{(i_1,\ldots,i_k)}]$$

which is a MAX *k*-XOR instance \mathfrak{I} with the additional constraint that the solution *z* must lie in C_0 .

Let
$$z^* \in \mathcal{C}_0$$
 be s.t. $y^* = \mathsf{dsum}_W(z^*)$

Optimal Value

Since \tilde{y} is in the unique decoding ball centered at y^* , we have

$$\mathbb{E}_{(i_1,\ldots,i_k)\in W}\mathbf{1}[z^*_{i_1}\oplus\cdots\oplus z^*_{i_k}\neq \tilde{y}_{(i_1,\ldots,i_k)}]=\Delta(y^*,\tilde{y})<\Delta(\mathcal{C})/2$$

Thus,

$$\mathsf{OPT}(\mathfrak{I}) \geq \mathrm{E}_{(i_1, \dots, i_k) \in W} \mathbf{1}[\mathbf{z}^*_{i_1} \oplus \dots \oplus \mathbf{z}^*_{i_k} = \tilde{\mathbf{y}}_{(i_1, \dots, i_k)}] > 1 - \Delta(\mathcal{C})/2$$

Optimal Solution

Suppose that we can find $\tilde{z} \in \mathbb{F}_2^n$ (rather than in \mathcal{C}_0) satisfying

 $\mathbf{E}_{(i_1,\ldots,i_k)\in W}\mathbf{1}[\tilde{z}_{i_1}\oplus\cdots\oplus\tilde{z}_{i_k}=\tilde{y}_{(i_1,\ldots,i_k)}]=\mathsf{OPT}(\mathfrak{I})>1-\Delta(\mathcal{C})/2$

Thus, $\Delta(\operatorname{dsum}_W(\tilde{z}), \tilde{y}) < \Delta(\mathcal{C})/2$

By triangle inequality,

$$\begin{array}{ll} \Delta(\operatorname{dsum}_W(\tilde{z}),\operatorname{dsum}_W(z^*)) &\leq & \Delta(\operatorname{dsum}_W(\tilde{z}),\tilde{y}) + \\ & & \Delta(\tilde{y},\operatorname{dsum}_W(z^*)) < \Delta(\mathcal{C}) = 1/2 - \epsilon/2, \end{array}$$

implying

$$\mathsf{bias}(\mathsf{dsum}_W(\tilde{z}) \oplus \mathsf{dsum}_W(z^*)) = \mathsf{bias}(\mathsf{dsum}_W(\tilde{z} \oplus z^*)) > \epsilon$$

"Nontrivial bias"

Claim

If dsum_W is a "strong enough" parity sampler, then either \tilde{z} or $\tilde{z} \oplus 1$ lie in the unique decoding ball of C_0 centered at z^* .

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If dsum_W is a $(1/2 + \epsilon_0/2, \epsilon)$ -parity sampler, then either \tilde{z} or $\tilde{z} \oplus 1$ lie in the unique decoding ball of C_0 centered at z^* .

Moral

- Find solution $\tilde{z} \in \mathbb{F}_2^n$ (rather than in \mathcal{C}_0) is enough
- Use unique decoder of C_0 to correct \tilde{z} into z^*

Need to resolve the following assumption.

Optimal SolutionSuppose that we can find $\tilde{z} \in \mathbb{F}_2^n$ (rather than $\tilde{z} \in C_0$) satisfying $E_{(i_1,...,i_k)\in W}\mathbf{1}[\tilde{z}_{i_1}\oplus\cdots\oplus\tilde{z}_{i_k}=\tilde{y}_{(i_1,...,i_k)}] = \mathsf{OPT}(\mathfrak{I})$

Need to resolve the following assumption.

Optimal Solution

Suppose that we can find $\tilde{z} \in \mathbb{F}_2^n$ (rather than $\tilde{z} \in C_0$) satisfying

$$\mathbb{E}_{(i_1,\ldots,i_k)\in W}\mathbf{1}[\tilde{z}_{i_1}\oplus\cdots\oplus\tilde{z}_{i_k}=\tilde{y}_{(i_1,\ldots,i_k)}]=\mathsf{OPT}(\mathfrak{I})$$

Possible issue?

MAX k-XOR is NP-hard, right?

Possible issue?

MAX k-XOR is NP-hard, right?

Not an issue

Right, it can be NP-hard in general. However, for some **expanding** instances we can find an **approximate** solution (and that is enough).

Using the Sum-of-Squares (SOS) semi-definite programming hierarchy:

Theorem (Alev-J-Quintana-Srivastava-Tulsiani'20)

Let $W(k) \subseteq [n]^k$ be σ -splittable (notion of tuple expansion). Suppose \Im is a k-XOR instance on W(k). If $\sigma \leq \text{poly}(\gamma/2^k)$, then we can find a solution $z \in \mathbb{F}_2^n$ satisfying

 $\mathsf{OPT}(\mathfrak{I}) - \boldsymbol{\gamma},$

fraction of the constraints of \mathfrak{I} in time $n^{\text{poly}(2^k/\gamma)}$.

(building on Alev-J-Tulsiani'19 which builds on Barak-Raghavendra-Steurer'11)

Let $W(k) \subseteq [n]^k$. Define W[a, b] for $1 \le a \le b \le k$ as $W[a, b] = \{(i_a, \dots, i_b) \mid (i_1, \dots, i_k) \in W(k)\}.$

Let $W(k) \subseteq [n]^k$. Define W[a, b] for $1 \le a \le b \le k$ as

$$W[a, b] = \{(i_a, \ldots, i_b) \mid (i_1, \ldots, i_k) \in W(k)\}.$$

Definition (Splittability (informal))

A collection $W(k) \subseteq [n]^k$ is said to be σ -splittable, if k = 1 (base case) or there exists $k' \in [k-1]$ such that:

3 The collections W[1, k'] and W[k' + 1, k] are σ -splittable.

Lemma (AJQST'20)

The collection $W(k) \subseteq [n]^k$ of **all** walks on σ -two-sided spectral expander graph G = (V = [n], E) is σ -splittable.

What about the code parameters?

What parameters do we get putting these pieces together?

Well... Our parameters in AJQST'20...

With this approach we obtain binary codes with

- distance $1/2 \epsilon$
- rate $\Theta(2^{-(\log(1/\epsilon))^2}) \ll \operatorname{poly}(\epsilon)$
- polynomial time unique decoding algorithm

Leveraging Unique Decoding to List Decoding AJQST'20

Maximizing an entropic function Ψ while "solving" the Sum-of-Squares program of unique decoding yields a list decoding algorithm

(independently used by Raghavendra-Yau & Karmalkar-Klivans-Kothari to ML)

Well... Again our parameters in AJQST'20...

With this entropic approach we obtain binary codes with

- list decoding radius $1/2-\epsilon$
- rate $\Theta(2^{-(\log(1/\epsilon))^2}) \ll \operatorname{poly}(\epsilon)$
- polynomial time list decoding algorithm

On one side

There is this refined near optimal code construction of Ta-Shma

On the other side

There is this far from optimal parameter hungry decoding machinery
What are the techniques?

We will just mention the techniques at a very high-level

Splittability

First, we modify Ta-Shma's direct sum construction W(k) to make it *splittable* so that our decoding tools can be used



A few extra words about SOS

Sum-of-Squares (SOS)

Sum-of-Squares is a semi-definite programming hierarchy

- It generalizes linear programming
- It captures the state-of-the-art approximation guarantees for many problems (MAX-CUT and other CSPs)
- Roughly speaking, level d of SOS runs in time n^{O(d)} where n is the number of variables





First Hammer Effect

As in AJQST'20, we can only decode explicit binary codes C satisfying

•
$$\Delta(\mathcal{C}) \geq 1/2 - \epsilon$$
, and

• rate $r(\mathcal{C}) = 2^{-\text{polylog}(1/\epsilon)} \ll \epsilon^{2+o(1)}$ (not even polynomial rate)

List decoding via SOS	
Unique decoding via SOS	

Killing a Fly With a Bazooka

Use list decoding to perform unique decoding! Also considered in some previous work (e.g. Guruswami–Indyk'04).



Second Hammer Effect

Some parameters are better but r(C) still not even polynomial



Ta-Shma's walks admit a recursive structure. In short,

- walks over walks are larger walks,
- walks over larger walks are even larger walks,
- walks over even larger walks are...
- and so on...

Taking advantage of this recursive structure we can define a sequence of codes. Decoding takes places between consecutive levels and requires much weaker parameters now.



Figure: Code cascading: recursive construction of codes.

Remark

Some form of cascading was present in the work of Guruswami–Indyk'01 to the so-called *direct product*. The details here and in their setting are quite different.



Second and Third Hammers Effect

Decode Ta-Shma's codes with nearly optimal rate

That's all.

Thank you!