

# Efficient List–Decoding with Constant Alphabet and List Sizes

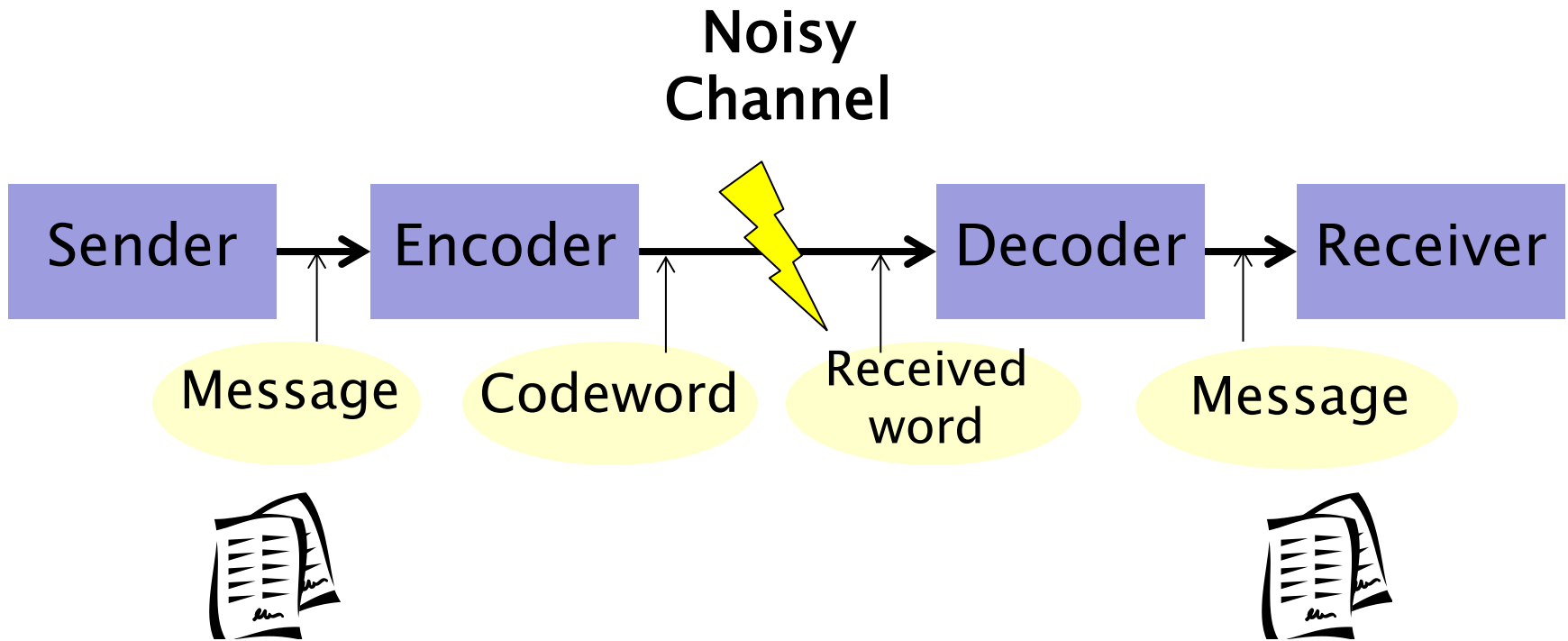
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# Error-Correcting Codes

[Hamming, Shannon '40s]



# Error–Correcting Codes

**Code:**  $C: \Sigma^k \rightarrow \Sigma^n$ , maps messages to codewords

- Alphabet  $\Sigma$ , message length  $k$ , codeword length  $n$

**Rate:**  $R = \frac{k}{n} \sim$  redundancy in encoding

**Minimum distance:**

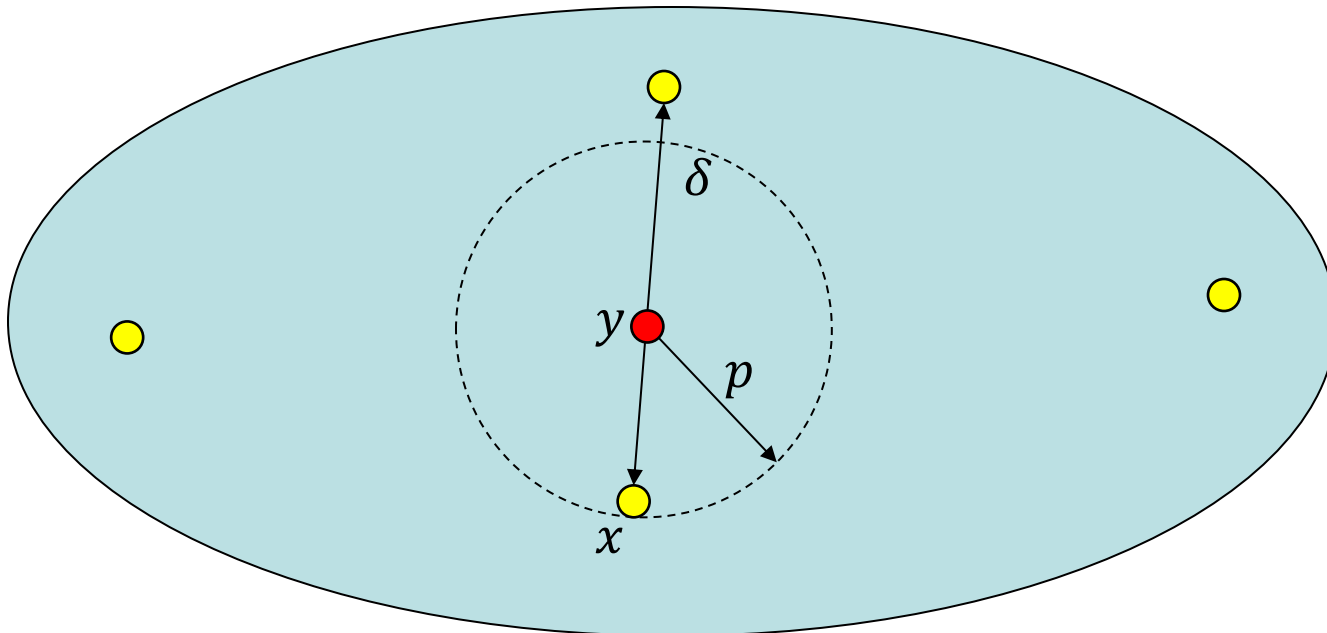
- For  $x, y \in \Sigma^n$ , the (relative) distance  $\text{dist}(x, y)$  is the fraction of coordinates where  $x$  and  $y$  differ
- The (relative) minimum distance of  $C$  is

$$\delta = \min(\text{dist}(x, y): x, y \in C, x \neq y)$$

# Unique Decoding

## Unique decoding:

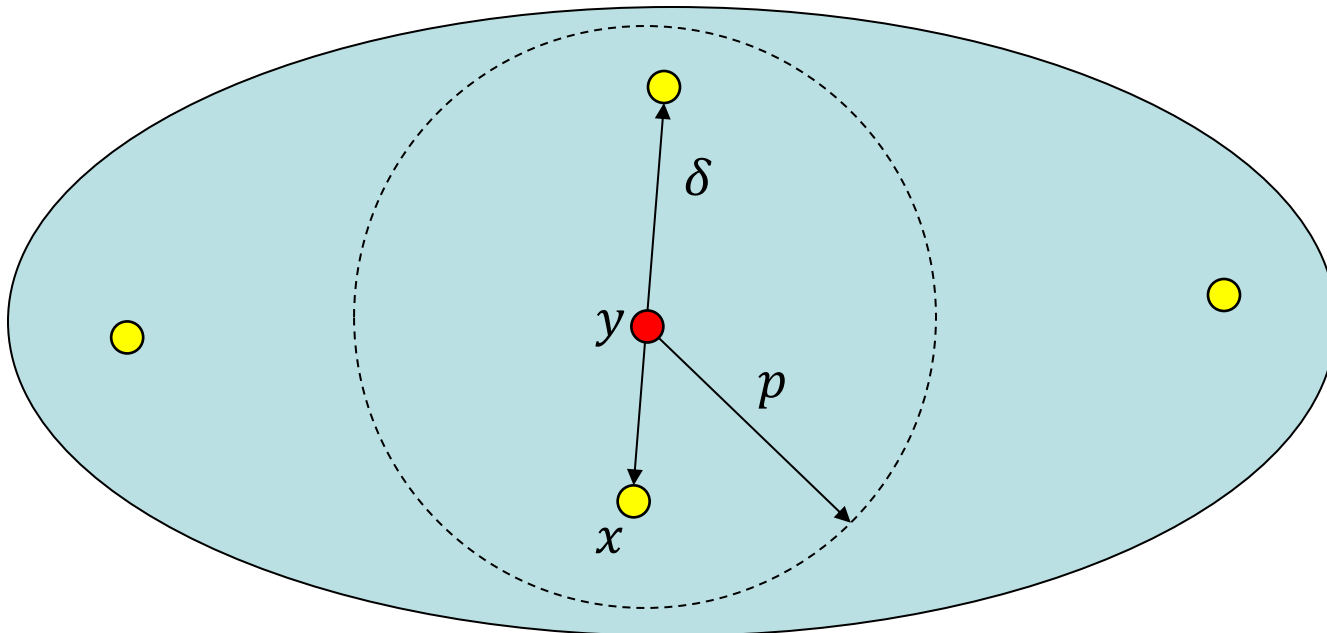
- Adversary corrupts  $p$  fraction of coordinates
- Given  $y \in \Sigma^k$ , decoder finds the **unique**  $x \in \mathcal{C}$  such that  $\text{dist}(x, y) \leq p$
- Must have  $p \leq \delta/2$



# List Decoding

List decoding [Elias, Wozencraft '50s]:

- Adversary corrupts  $p$  fraction of coordinates
- Given  $y \in \Sigma^k$ , decoder finds a **short list** of  $x \in \mathcal{C}$  such that  $\text{dist}(x, y) \leq p$  for every  $x$  in the list
- Can correct more than  $\delta/2$  fraction of errors



# Advantages of List Decoding

## In coding theory:

- Bridge between Hamming Channel & Shannon Channel
- Sometimes can use **context / side information** even if list size  $> 1$

## In TCS:

Define the (relative) agreement  $\text{agr}(x, y) = 1 - \text{dist}(x, y)$

For **unique decoding**,  $\text{dist}(x, y) \leq \delta/2 \leq 1/2$

- Can recover  $x$  from  $y$  only if  $\text{agr}(x, y) \geq 1/2$

For **list decoding**, can have  $\text{dist}(x, y)$  close to 1

- Can find a short list of candidates  $x$  from  $y$  even if  $\text{agr}(x, y)$  is **small**

# Advantages of List Decoding

TCS apps:

1. **Cryptography:** Hard-core predicates [Goldreich–Levin’89]
2. **Learning:**
  - Boolean functions [Goldreich–Levin’89]
  - Decision trees [Kushilevitz–Mansour’91]
  - CNFs / DNFs [Jackson’94]
3. **Complexity theory:**
  - Average-to-worst-case reductions  
[Lipton’89, Cai–Pavan–Sivakumar’99, Goldreich–Rubinfeld–Sudan’99]
  - Derandomization / Construction of PRGs  
[Babai–Fortnow–Nisan–Wigderson’93, Sudan–Trevisan–Vadhan’99]

# List Decodable Codes

- Ideally, we want a code of rate  $R$  that is
- list decodable up to radius  $\approx 1 - R$
  - with **small list size** and **small alphabet size**
  - explicit and efficiently list decodable

List decoding capacity

## List Decoding Capacity Theorem:

For  $R, \varepsilon \in (0,1)$ , there exist (*non-explicit*) codes of rate  $R$  that are list decodable up to radius  $1 - R - \varepsilon$  with **list size**  $O(1/\varepsilon)$  and **alphabet size**  $2^{O(1/\varepsilon)}$

Are there **explicit** capacity-achieving list decodable codes with similar parameters?



# Reed–Solomon codes

- A Reed–Solomon code over  $F_q$  is given by the encoding map  $F_q^k \rightarrow F_q^n$  defined by

$$f \mapsto (f(\alpha_1), f(\alpha_2), \dots, f(\alpha_n))$$

where  $f$  is a univariate polynomial of degree  $< k$  and  $\alpha_1, \alpha_2, \dots, \alpha_n \in F_q$  are  $n$  distinct evaluation points

- Guruswami and Sudan proved that RS codes are efficiently list decodable up to radius  $1 - \sqrt{R}$  (known as the Johnson bound) [Sudan'97, Guruswami–Sudan'99]
- Most RS codes are list decodable beyond the Johnson bound [Rudra–Wootters'14, GLSTW'20]
- However, it is not known if RS codes can achieve the capacity  $1 - R$

# Folded Reed–Solomon codes

- Folded Reed–Solomon codes [Guruswami–Rudra’05] are the first explicit codes that achieve the rate  $1 - R - \varepsilon$
- It is obtained by combining  $m = O(1/\varepsilon^2)$  symbols into one

$$f \mapsto \begin{pmatrix} f(\alpha_1) & f(\alpha_2) & \dots & f(\alpha_n) \\ f(\gamma\alpha_1) & f(\gamma\alpha_2) & \dots & f(\gamma\alpha_n) \\ f(\gamma^2\alpha_1) & f(\gamma^2\alpha_2) & \dots & f(\gamma^2\alpha_n) \\ \vdots & \vdots & \ddots & \vdots \\ f(\gamma^{m-1}\alpha_1) & f(\gamma^{m-1}\alpha_2) & \dots & f(\gamma^{m-1}\alpha_n) \end{pmatrix}$$

- Alphabet size  $n^{O(1/\varepsilon^2)}$
- List size  $(1/\varepsilon)^{O(1/\varepsilon)}$  [Kopparty–Ron–Zewi–Saraf–Wooters’18]

# Other Constructions

- Subcodes of AG codes [Guruswami–Xing’13]
  - Alphabet size  $2^{\tilde{O}(1/\varepsilon^2)}$
  - List size  $2^{\text{poly}(1/\varepsilon)} \cdot 2^{2^{2^{O(\log^* n)}}$
- Multi-level concatenation of FRS codes + expander-based amplification [Kopparty–Ron–Zewi–Saraf–Wooters’18]
  - Alphabet size  $2^{\text{poly}(1/\varepsilon)}$
  - List size  $2^{2^{2^{2^{O(1/\varepsilon)}}}}$
  - Encoding time  $2^{\text{poly}(1/\varepsilon)} \cdot \text{poly}(n)$

# Our Result

There exist codes  $C: \Sigma^k \rightarrow \Sigma^n$  of rate  $R$  that are list decodable up to radius  $1 - R - \varepsilon$  with list size  $2^{\text{poly}(1/\varepsilon)}$  and alphabet size  $2^{\tilde{O}(1/\varepsilon^2)}$ . Moreover:

- The encoding time is  $\text{poly}(n, 1/\varepsilon)$
  - The list is contained in a subspace of dimension  $\text{poly}(1/\varepsilon)$ , whose basis can be found in time  $\text{poly}(n, 1/\varepsilon)$
  - Outputting the list takes time  $2^{\text{poly}(1/\varepsilon)} \cdot \text{poly}(n)$
- Our proof heavily depends on [Guruswami–Xing’13]. One key new idea is the use of BTT subspaces.

# BTT matrix/subspace

- A  $(k, m, r)$  block-triangular-Toeplitz (BTT) matrix over  $F$  is a  $km \times kr$  full rank matrix over  $F$  that is both block-lower-triangular and block-Toeplitz as a  $k \times k$  block matrix

$$k = 4: \begin{bmatrix} M_1 & 0 & 0 & 0 \\ M_2 & M_1 & 0 & 0 \\ M_3 & M_2 & M_1 & 0 \\ M_4 & M_3 & M_2 & M_1 \end{bmatrix}$$

- A subspace of  $F^{km}$  is a  $(k, m, r)$  BTT subspace if it is the image of  $v \mapsto Mv$

# Overview of Our Construction

- Let  $\Sigma = F_q^m$  where  $q = \text{poly}(1/\varepsilon)$  and  $m = O(1/\varepsilon^2)$ 
  - 1) We first construct a list decodable code  $C': \Sigma^k \rightarrow \Sigma^n$  such that the list of candidate messages is contained in a small **BTT subspace** of  $\Sigma^k \cong F_q^{km}$
  - 2) Then we construct an explicit subspace  $W \subseteq F_q^{km}$  of low codimension that **evades** any BTT subspace
- The final code is obtained by restricting the message space of  $C'$  to  $W$ , which reduces the list size to constant

# RS code with subfield evaluations

- The code  $C'$  is a “AG code with subfield evaluations” [Guruswami-Xing'13]
- We explain the idea using “RS codes with subfield evaluations”
- An RS code over  $F_q$  is defined by the encoding map

$$f \mapsto C_f := (f(\alpha_1), f(\alpha_2), \dots, f(\alpha_n))$$

where  $\alpha_1, \alpha_2, \dots, \alpha_n \in F_q$  are  $n$  distinct evaluation points

- An “RS code with subfield evaluations” is simply an RS code over an extension field  $F_{q^m}$  with  $\alpha_1, \alpha_2, \dots, \alpha_n \in F_q$

# Finding the BTT subspace

- Given  $y$ , we want to find a BTT subspace containing the list of all  $f$  satisfying  $\text{dist}(C_f, y) \leq 1 - R - \varepsilon$
- We can find a low degree multivariate polynomial  $Q(Y_1, Y_2, \dots, Y_s)$  over  $F_{q^m}[X]$  such that

$$Q^*(f) := Q(f, f^q, \dots, f^{q^{s-1}}) = 0$$

- As  $Q^*(f) \in F_{q^m}[X]$ , we get a collection of equations by equating the coefficients of  $Q^*(f)$  with zero
- This system of linear equations is represented by a BTT matrix  $M$
- So  $f$  is contained in  $\ker(M)$  whose basis can be found efficiently
- Finally, we show that the kernel of a BTT matrix is a BTT subspace, so  $\ker(M)$  is a BTT subspace



# Algebraic–Geometric Codes

- For Reed–Solomon codes, we need  $q \geq n$  to get  $n$  evaluation points
- To make the alphabet size independent of  $n$ , we use **AG codes** (with subfield evaluations)
- AG codes are generalizations of Reed–Solomon codes, where lines are generalized by **algebraic curves**
- Can have **arbitrarily many** # evaluation points over  $F_q$  for fixed  $q$  by using more and more complicated algebraic curves
- We use explicit curves from the **Garcia–Stichtenoth tower** [Garcia-Stichtenoth'96], following [Guruswami-Xing'13]

# Algebraic–Geometric Codes

- Two properties used for RS codes:
  - 1) Let  $V$  be the space of degree- $d$  polynomials. Then any nonzero  $f \in V$  has at most  $d$  zeros
  - 2) Dimension of  $V$  is  $d + 1$
- They are generalized for AG codes
  - 1) There is an analogous space  $V$  for “degree- $d$  polynomials” (called a **Riemann–Roch space**), and any nonzero  $f \in V$  has at most  $d$  zeros
  - 2) Dimension of  $V$  is in  $[d - g + 1, d + 1]$ , where  $g \geq 0$  is called the **genus**
- In the GS tower, there is a good upper bound for  $g$

# BTT Evasive Subspace

- A  $(k, m, r, s)$  BTT evasive subspace is a subspace  $W \subseteq F_q^{km}$  such that for any  $(k, m, r)$  BTT subspace  $V$ ,  
$$\dim(V \cap W) \leq s$$

Theorem: [GR'20]

There exists an explicit  $(k, m, \varepsilon m, s)$  BTT evasive subspace  $W \subseteq F_q^{km}$  of codimension  $O(\varepsilon km)$ , where  $s = \text{poly}(1/\varepsilon)$

- Restricting the message space  $\Sigma^k \cong F_q^{km}$  to  $W$  reduces the list size to  $q^s = 2^{\tilde{O}(1/\varepsilon^2)}$ , and yields the desired code

# Periodic Subspace

- Periodic subspaces are relaxations of BTT subspaces

$$\begin{bmatrix} M_1 & 0 & 0 & 0 \\ M_2 & M_1 & 0 & 0 \\ M_3 & M_2 & M_1 & 0 \\ M_4 & M_3 & M_2 & M_1 \end{bmatrix}$$

BTT matrix

$$\begin{bmatrix} M_1 & 0 & 0 & 0 \\ ? & M_1 & 0 & 0 \\ ? & ? & M_1 & 0 \\ ? & ? & ? & M_1 \end{bmatrix}$$

periodic matrix

- A  $(k, m, r, s)$  periodic evasive subspace is also a  $(k, m, r, s)$  BTT evasive subspace

**Theorem:** [Guruswami–Kopparty'13] (based on subspace designs)

For  $k \leq q^{O(\varepsilon m/r)}$ , there exists an explicit  $(k, m, r, s)$  periodic evasive subspace of codimension  $O(\varepsilon km)$ , where  $s = O(1/\varepsilon^2)$

- However, this yields  $(k, m, \varepsilon m, s)$  BTT evasive subspace only for  $k = \text{poly}(1/\varepsilon)$  which is too small

# Composition

Composition Lemma: [Guruswami–Xing'13]

Let  $W$  be  $(k, m, r, s)$  periodic evasive inner subspace  
Let  $W'$  be  $(k', km, s, s')$  periodic evasive. outer subspace  
Then  $W \circ W' := W^k \cap W'$  is  $(k'k, m, r, s')$  periodic evasive

- One can use [Guruswami–Kopparty'13] to construct an outer subspace, so that it remains to construct an inner subspace
- This reduces  $k$  to  $k' = O(\log k)$ , but increase  $s$  to  $\text{poly}(s)$
- [Guruswami–Xing'13] applied composition  $O(\log^* n)$  times
  - List size  $2^{\text{poly}(1/\varepsilon)} \cdot 2^{2^{2^{O(\log^* n)}}$

# Better Construction

## Ideas:

- We observe that if  $W$  is BTT evasive, then  $W \circ W'$  is also BTT evasive
- Apply composition twice to reduce  $k$  to
$$k' = O(\log \log k)$$
- Use brute-force search to find a good non-explicit inner BTT evasive subspace
- **Existence** of such a BTT evasive subspace follows from the **probabilistic method**
  - It is crucial to use **BTT evasiveness** — there are too many **period subspaces**

# Summary

- We first construct an **AG code with subfield evaluations**
- Then we construct a BTT evasive subspace  $W$  and restrict the message space to  $W$  to obtain the final code
- $W$  is constructed using repeated composition of periodic evasive subspaces [Guruswami–Kopparty’13] and an inner subspace found by brute-force search
- The “**repeated composition**” structure also appears elsewhere in coding theory and TCS
  - Construction of **asymptotically good codes**
  - First proof of the **PCP theorem**

# Open Problems & Directions

- Reduce our list size  $2^{\text{poly}(1/\varepsilon)}$  to  $O(1/\varepsilon)$  or even subexponential in  $1/\varepsilon$ 
  - For explicit codes, best known bound is  $(1/\varepsilon)^{O(1/\varepsilon)}$  for FRS codes
- For an absolute constant  $q$ , achieve the list decoding capacity  $h_q^{-1}(1 - R)$  over a  $q$ -ary alphabet
- Are our methods useful for constructing other pseudorandom objects?
  - E.g., lossless dimension expanders [[Guruswami-Resch-Xing'18](#)]

