

TODAY: LIST DECODING ALGORITHM
FOR REED SOLOMON CODES

[Reminder: No Lecture Monday 3/31]

Recall from last time

Johnson Bound: $(n, k, d)_q$ code is

$(1 - \sqrt{1 - \frac{d}{n}}, \text{poly})$ - list decodable



fraction errors, list size

Specializing to RS code: $[n, k, n-k]_q$ code

is combinatorially list decodable from
 $n - \sqrt{kn}$ errors.

Algorithmic Problem / Challenge

Given: \mathbb{F} , $\alpha_1, \dots, \alpha_n$, k , y_1, \dots, y_n

& agreement parameter t

Find: list of all poly P of degree k st.
 $P(\alpha_i) = y_i$ for at least t values of
 $i \in [n]$.

[Johnson Bound \Rightarrow should be doable in polytime
for $t \geq \sqrt{kn}$]

Today: [Sudan '96] $t \geq \sqrt{2kn}$

[Guruswami + S. '98] $t \geq \sqrt{kn}$

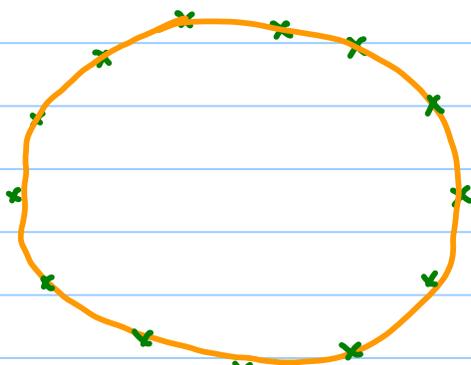
Algebra \leftrightarrow Geometry

Idea: (1) Get algebraic "explanation" of
 n points $\{(x_i, y_i)\}_{i=1}^n$

(2) Throw away points & "stare"
at algebraic "explanation"

Algebraic Explanation?

Example  below is an alg. explanation of



In general some small degree curve $Q(x, y) \neq 0$
s.t. $Q(x_i, y_i) = 0 \quad \forall i, j$

Lemma 1: Given n points a low-degree
($\deg_x(Q), \deg_y(Q) \leq \sqrt{n}$) algebraic
explanation exists, and can be found
in poly time.

Proof: Let $Q(x,y) = \sum_{i,j} q_{ij} x^i y^j$

$\{q_{ij}\}$ unknown. # unknown's = $(\sqrt{n+1})^2 > n$.

Constraints: ① $Q(x_e, y_e) = 0$

$$\Rightarrow \sum_{i,j} q_{ij} x_e^i y_e^j = 0$$



homogenous, linear, equation

② $Q \neq 0 \Rightarrow$ want non-trivial solution.

variables $>$ # equations \Rightarrow solution exists, can be computed

Questions: Isn't this overfitting the points?

($> n$ q_{ij} 's explaining y_1, \dots, y_n)

Answer: YES & NO.

YES \Leftarrow This is why Lemma 1 holds.

NO Doesn't overfit nice data...

Example: if $\exists \sqrt{n}$ deg poly p s.t.

$$y_i = p(x_i) \quad \forall i, \text{ then } Q(x, y) \\ = y - p(x).$$

But if $\exists \sqrt{n} - 1$ deg p s.t.

$$y_i = p(x_i) \quad \forall i, \text{ then}$$

$$Q(x, y) \text{ can be } (ax + by + c)(y - p(x))$$

for any (a, b, c) . Is this all that
an go wrong?

Lemma 2: if $Q \neq 0$,

① $Q(\alpha_i, y_i) = 0 = y_i - p(\alpha_i)$ for t
points $\{(\alpha_i, y_i)\}_{i=1}^t$, $\deg(p) \leq k$

② $\deg_x Q, \deg_y Q \leq D$

③ $t > (k+1)D$

thus $y - p(x)$ divides $Q(x, y)$

Proof: • How to prove $y - p(x) \mid Q(x, y)$?

• Think $Q(x, y) \in \underbrace{F(x)}_{\substack{\uparrow \\ \text{field of} \\ \text{rational functions in } x}}[y]$

• Trying to prove β root of $Q_x(y)$,

where $\beta = p(x) \in \mathbb{F}(x)$.

• Holds iff $Q_x(\beta) = 0$. Is it?

• $Q_x(\beta) = Q(x, p(x)) = g(x)$

↑

some poly in x

$$\deg(g) \leq (k+1)D$$

• $g(\alpha_i) = Q(\alpha_i, p(\alpha_i))$

$$= Q(\alpha_i, y_i) \quad (\text{since } y_i = p(\alpha_i))$$

$$= 0 \quad (\text{since } Q(\alpha_i, y_i) = 0)$$

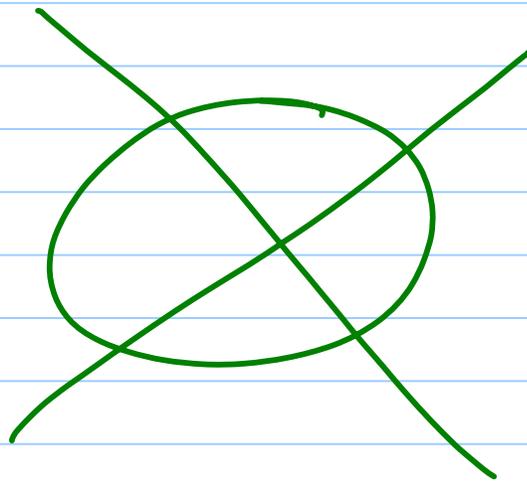
$\Rightarrow g$ has $t > (k+1)D$ roots $\Rightarrow g = 0$.

"Starting at Algebraic Explanation"

E.g. $Q(x,y) = x^4 - y^4 - x^2 + y^2$

Plot all zeroes.....

Zeros =



Split naturally into three sets....

Algebraically ... factor

$$x^4 - y^4 - x^2 + y^2 = (x^2 + y^2 - 1)(x + y)(x - y).$$

Lemma 2 \Rightarrow Such factors have useful information.

[Kaltofen, von Zur Gathen, Chistov, Grigoriev, Jenstra]
 \Rightarrow factorize in polynomials.

Putting it together

Algorithm 1:

1. find $Q \neq 0$, $\deg_x Q \leq \sqrt{n}$,

$$Q(\alpha_i, y_i) = 0 \quad \forall i$$

2. Factor $Q(x, y)$; report all p s.t.

$$y - p(x) \text{ divides } Q(x, y)$$

Theorem: Algorithm 1 recovers all poly with

$$\text{agreement } t > (k+1)\sqrt{n}$$

(follows from Lemma 1 + Lemma 2;)

(not great if $k > \sqrt{n}$;

great if $k = o(\sqrt{n}).$)

Easy Improvements

① let $\deg_x Q \leq \sqrt{kn}$, $\deg_y Q \leq \sqrt{\frac{n}{k}}$

Lemma 1' : Such Q also exists.

Lemma 2' : $t > 2\sqrt{kn} \Rightarrow$

$$y - p(x) \mid Q(x, y).$$

Theorem' : Agreement $2\sqrt{kn}$ suffices.

(Great if $k = o(n)$; but doesn't

dominate [Peterson, ... Welch-Berlekamp])

② Choosing degree of Q even more carefully..

$$Q(x, y) = \sum_{\substack{i, j \\ i + kj \leq \sqrt{2kn}}} q_{ij} x^i y^j$$

$(1, k)$ -weighted degree of $Q \leq \sqrt{2kn}$..

Lemma 1' } --- \Rightarrow Agreement $t > \sqrt{2kn}$
Lemma 2' } suffices.

Using minimal wtd. degree of Q leads to algorithm that dominates W-B.

Theorem [S'96]: Can list-encode RS from $t > \sqrt{2kn}$ agreement.

Going Beyond?

$$t \rightarrow \sqrt{kn} ?$$

no factor of 2
↓

Example: Take l lines in general position.

$$n = \binom{l}{2} \text{ points of intersection.}$$

Then n points have $\approx \sqrt{2n}$ lines passing through $\sqrt{2n}$ points each.

Each point has 2 lines through it
(by construction).

Can we hope to find all such lines by our approach?

- Careful calculations \Rightarrow just miss all lines.

- Uncareful explanation \Rightarrow

if we had found "all lines" or even
"most lines"

...

- would have asked Q to pass through every point once

- would have found Q that passes through most points twice

- We're counting on too much luck!

... lets not ... & lets require

Q to pass through every point twice.

Multiplicity of Zeros

$Q(x, y)$ has zero of multiplicity m
at (x_i, y_i) if

(1) Pictorially



Q goes through pt. m
times.

(2) Analytically $Q(x_i, y_i) = 0$

$$\frac{\partial Q}{\partial x}(x_i, y_i) = 0$$

\vdots

$$\frac{\partial^2 Q}{\partial x^i \partial y^l}(x_i, y_i) = 0 \quad \forall i+l \leq m$$

Correct definition for we.

③ Algebraically

$$\bar{Q}(x, y) \stackrel{\Delta}{=} Q(x + \alpha_i, y + \beta_i)$$

has no support on monomials of degree $\leq m$.

[Guruswami + S' 98]

Algorithm 2 : /* Set parameters $m, l \neq 1$ */

① find $Q \neq 0$, (l, k) -wtd. $\deg(Q) \leq l$

s.t. Q has zeroes of mult. m at $\{\alpha_i, \beta_i\}_{i=1}^n$

② Factor Q ; report p s.t. $y^{-p}(x) \mid Q(x, y)$

Theorem : As $m \rightarrow \infty$, needs $l \rightarrow \sqrt{3n}$.

Proof Omitted

Rough Idea :

$m=1$

n constraints

$\text{deg} = l$

require $l+1$ zeroes
to find P

\sim

$m=2$

$3n$ constraints

$\Rightarrow \text{deg} \approx \sqrt{3l}$

require $\frac{\sqrt{3l}}{2}$ zeroes
to find P

(Every zero counts
twice).