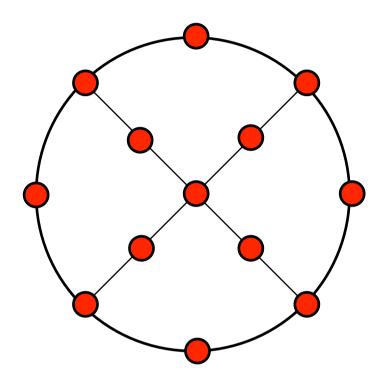


# Algebraic Decoding Algorithms



## Amin Shokrollahi





## **Reed-Solomon Codes**

 $\alpha_1, \ldots, \alpha_n$  distinct elements of  $\mathbb{F}_q$ 

$$\mathbb{F}_{q}[x]_{< k} \longrightarrow \mathbb{F}_{q}^{n}$$

$$(f_{0}, \dots, f_{k-1}) \longmapsto (f(\alpha_{1}), \dots, f(\alpha_{k-1}))$$

Image is a code of length *n*, dimension *k*, and minimum distance n-k+1. (If *k* is at most *n*.)

Proof: Polynomial of degree <*k* has at most *k*-1 roots.

(n))



# Encoding/Decoding

## Encoding is trivial (multiple evaluation of a polynomial).

## Decoding problem:

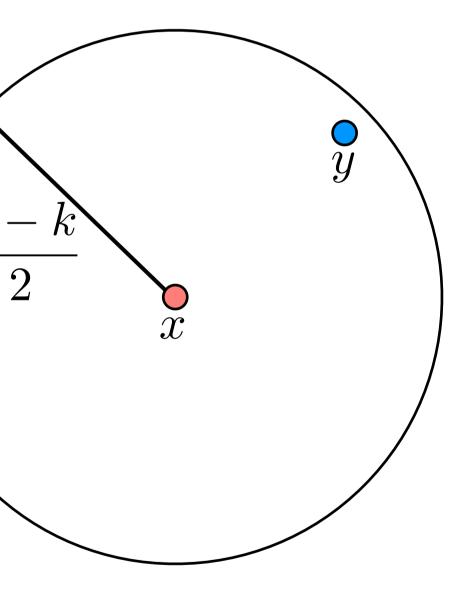
$$x = (f(\alpha_1), \dots, f(\alpha_n)) \text{ sent.}$$
  

$$y = (y_1, \dots, y_n) \text{ received.}$$
  
Promise:  $\#\{i \mid f(\alpha_i) \neq y_i\} \leq \frac{n-k}{2}$ 

## Problem: Reconstruct *f* from *y*.



 ${\mathcal N}$ 





## Welch-Berlekamp Decoder

 $E = \{i \mid f(\alpha_i) \neq y_i\}$  Error set

 $h \in \mathbb{F}_q[x]_{\leq \frac{n-k}{2}}$  Error locator polynomial:

$$h(x) = \prod_{i \in E} (x - \alpha_i)$$

0 if *i* not in error  $\forall i: \quad h(\alpha_i)(f(\alpha_i) - y_i) = 0.$ 0 if *i* in error



## Welch-Berlekamp Decoder

Find  $(0,0) \neq (g,h) \in \mathbb{F}_q[x]_{<\frac{n+k}{2}} \times \mathbb{F}_q[x]_{<\frac{n-k}{2}}$  such that

 $\forall i : g(\alpha_i) - h(\alpha_i)y_i = 0$ 

Then: 
$$f = \frac{g}{h}!$$

g(x) - f(x)h(x) has degree less than  $\frac{n+k}{2}$  but has at least  $\frac{n+k}{2}$ roots, so is zero.

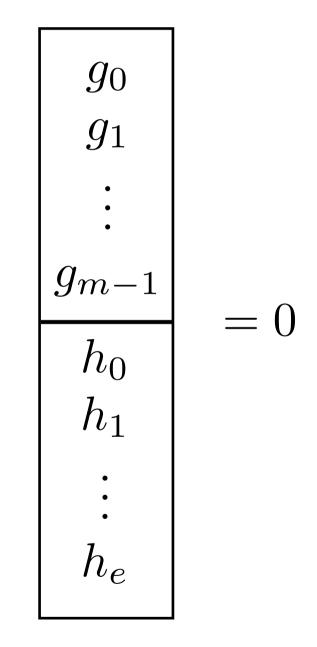


## **Existence and Computation**

$$m = \frac{n+k}{2}, \qquad e = \frac{n-k}{2}$$

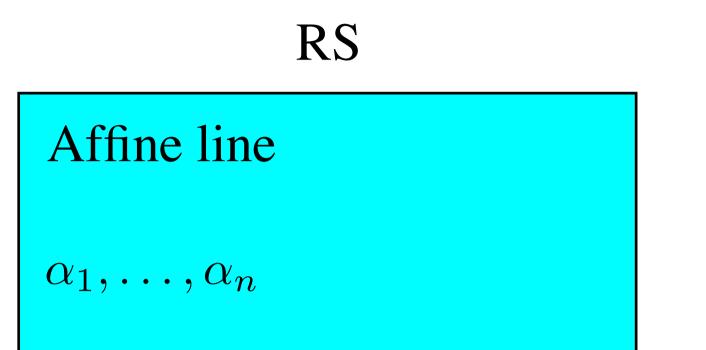
1	$lpha_1$	• • •	$\alpha_1^{m-1}$	-1	$-y_1 \alpha_1$	•••	$-y_1 \alpha_1^e$
1	$lpha_2$	• • •	$lpha_2^{m-1}$	-1	$-y_1\alpha_1\\-y_2\alpha_2$	• • •	$-y_2 \alpha_2^{e}$
•	• •	•	• •	• •	• •	•	• •
1	$lpha_n$	• • •	$\alpha_n^{m-1}$	-1	$-y_n \alpha_n$	• • •	$-y_n \alpha_n^e$

## *n* rows, *n*+1 columns, nonzero solution exists!





## **AG-Codes**



Polynomials of degree < k

$$\mathcal{L}(dQ) \longrightarrow \mathbb{F}_q^n$$
$$f \longmapsto (f(P_1), \dots, f(P_n))$$

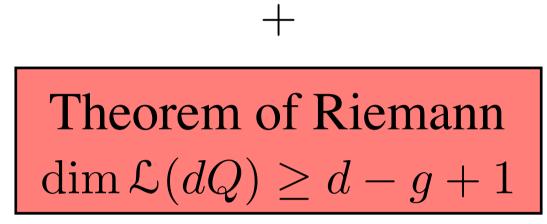
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# Smooth algebraic curve $\mathcal{X}$ $P_1,\ldots,P_n\in\mathcal{X}(\mathbb{F}_q)$ $\mathcal{L}(dQ), Q \in \mathcal{X}(\mathbb{F}_q)$



## Parameters

Nonzero function in  $\mathcal{L}(dQ)$  can have at most d zeros



Dimension  $\geq d - g + 1$ 

Minimum distance  $\geq n - d$ 





## WB-Decoder (S-Wasserman)

$$e = \frac{n-d+g-1}{2}$$

Find  $(0,0) \neq (u,v) \in \mathcal{L}((e+d)Q) \times \mathcal{L}(eQ)$  such that  $\forall i: \quad u(P_i) - y_i v(P_i) = 0$ 

If number of errors  $\leq \frac{n-d-g-1}{2}$ , then correct codeword is given by  $f = \frac{u}{v}$ 



## WB-Decoder (S-Wasserman)

Proof:

$$u, v \text{ exist: } \deg(eQ - \sum_{i \in E} P_i) \ge g$$

$$u - fv = 0: \operatorname{deg}((e+d)Q - \sum_{i \notin E} P_i) < 0$$



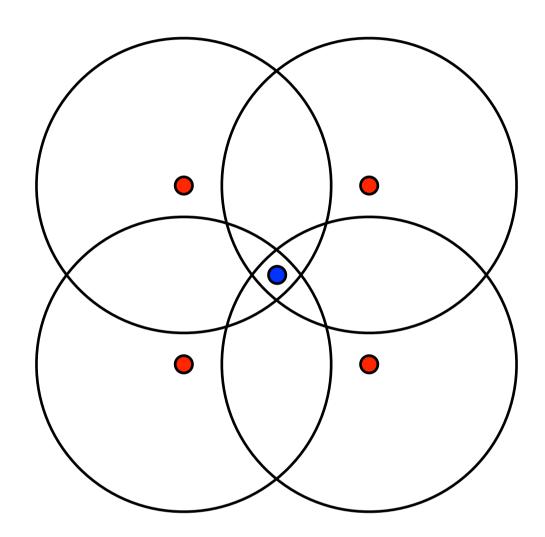
## Facit

Most algorithms for decoding RS-codes can be generalized appropriately to the case of AG-codes.

Will concentrate on RS-codes in the following.



# Decoding More Errors?



# List-decoding Probabilistic decoding

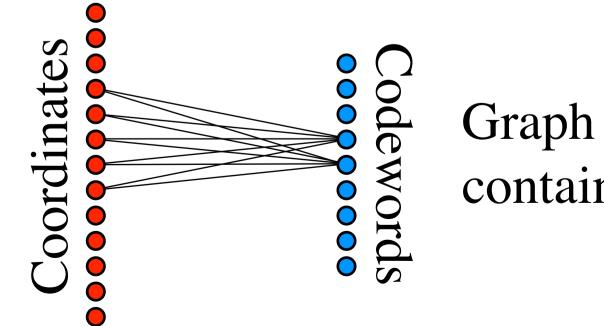


# List-Decoding

## Given *e* find all codewords of distance at most *e*.

Limits for RS-codes?

Johnson bound: If *e* is at most  $1 - \sqrt{R}$  then the list size is O(n).



## Graph should not contain a $K_{k,2}$



## Practical List-Decoding

# Sudan, 1996: extend the WB-decoder! Find

$$(h_0, h_1, \dots, h_\ell) \in \mathbb{F}_q[x]_{< e} \times \mathbb{F}_q[x]_{< e+(k-1)} \times \cdots$$

not all zero, such that

$$\forall i: \quad h_0(\alpha_i) y_i^{\ell} + h_1(\alpha_i) y_i^{\ell-1} + \dots + h_\ell(\alpha_i) y_\ell^{\ell-1} + \dots + h_\ell(\alpha_i) y_\ell^{\ell-1}$$

If number of correctly transmitted positions is  $> e - 1 + \ell(k - 1)$ then all correct polynomials f are y-zeros of

$$Q(x,y) = h_0(x)y^{\ell} + h_1(x)y^{\ell-1} + \dots +$$

## $\times \mathbb{F}_q[x]_{e+\ell(k-1)}$

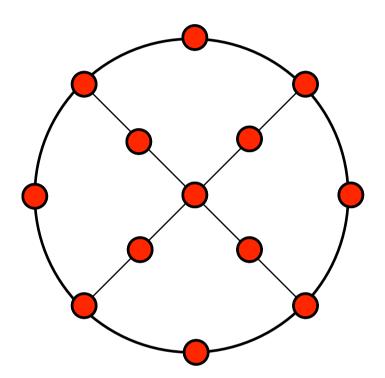
## $\alpha_i) = 0$

 $h_\ell(x)$ 



## Example

Find all lines that pass through at least 5 points:

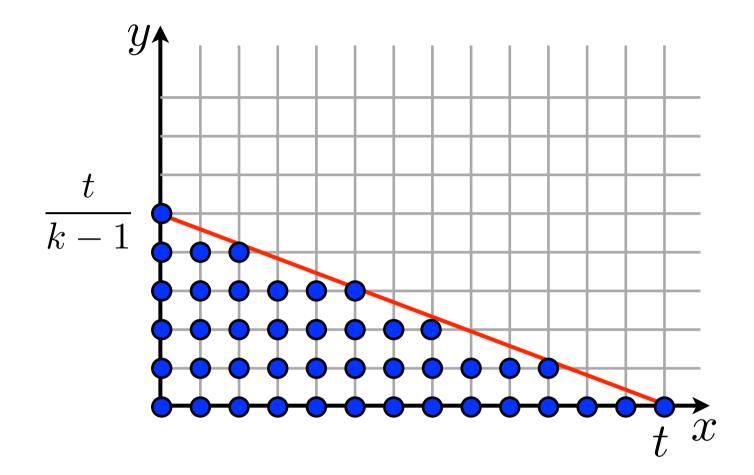


$$Q(x, y) = x^4 - y^4 - 2x^2 + 2y^2$$
$$Q(x, y) = (x - y)(x + y)(x^2 + y^2 - y^2)(x - y)(x - y)($$

2)



# Analysis



$$t \simeq \sqrt{2kn}$$

## Fraction of correctable errors = $1 - \sqrt{2R}$

# t = number of correct positions (1, k - 1)-weighted degree of Q < tNumber of monomials in Q > nNumber of monomials in $Q \simeq \frac{t^2}{2k}$





## AG-Codes

This algorithm was generalized to the case of AG-codes by S-Wasserman.

generalization introduced a "dictionary" with which The generalizations of other types of algebraic algorithms were made possible.



## Better Algorithm? Guruswami-Sudan, 1998

We require that Q(x, y) vanishes at  $(\alpha_i, y_i)$  M times.

Number of monomials 
$$\simeq \frac{t^2}{2k} \implies t \leq N$$
  
Number of constraints  $\simeq \frac{M^2}{2}n$ 

 $\deg Q(x, f(x)) < t$ 

Each correct position contributes M zeros to Q(x, f(x))

If #correct positions M > t then Q(x, f(x)) = 0

Fraction of correctable errors:  $1 - \sqrt{R}$ 

 $\simeq M\sqrt{kn}$ 





## Even Better?

Probably not with full length RS-codes (or AG-codes).

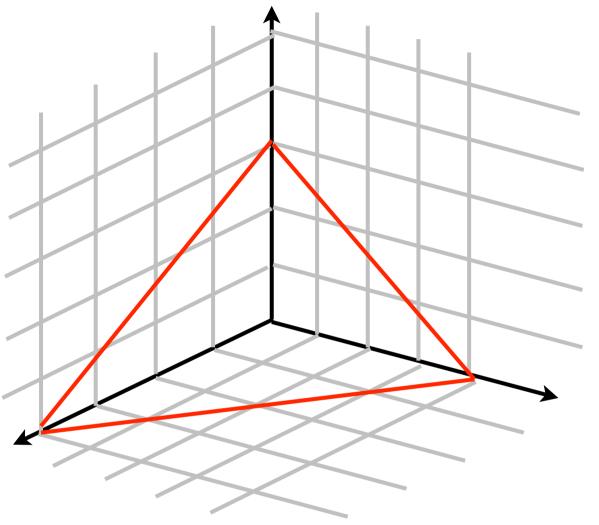
What if we use trivariate, or more generally *m*-variate polynomials?

Find polynomial Q(x, y, z) of (1, k - 1, k - 1) -weighted degree < tsuch that

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



## Even Better? Parvaresh and Vardy



 $t \simeq M \sqrt[3]{nk^2}$ 

If  $y_i$  and  $z_i$  are either both in error or both not in error, then for

fraction of errors 
$$\leq 1 - R^{2/3} \rightarrow 1$$
 -

then Q(x, f(x), g(x)) = 0. But what can be done with it?

Number of constraints  $> n \frac{M^3}{6}$ Number of monomials in  $Q \simeq \frac{t^3}{6k^2}$ 

- errors are "interleaved"

  - $-R^{\frac{m-1}{m}}$



## Even Better? Parvaresh and Vardy

Problem: only one polynomial relation.

another polynomial relation, and form the resultant of the Find multivariate polynomials.

Reduces to the old case if resultant nonzero.

Find Groebner basis of all the corresponding polynomials.

May not lead to the full decoding capability.



## Probabilistic Algorithms?

Best fraction of errors to expect: 1 - R

Assume that errors are "interleaved."

Coppersmith and Sudan: Correct a fraction of  $1 - R - R^{\frac{m}{m+1}}$  errors with error probability  $O\left(\frac{n^{O(m)}}{\alpha}\right)$ 

Bleichenbacher et al.: Correct a fraction of  $\frac{m}{m+1}(1-R)$  errors with error probability  $O\left(\frac{n}{a}\right)$ 

Brown et al.: Correct a fraction of  $\frac{m}{m+1}(1-R) - \epsilon$  errors

with error probability  $O\left(\frac{1}{q^{\epsilon n}}\right)$ 



## Key Observation

Bleichenbacher et al.

If interleaved errors are assumed, then the error locator polynomial is the same for all the component codes.

Number of constraints: nm

Number of monomials: (e + 1) + m(e + k) = nm + 1

$$\implies e = \frac{m}{m+1}(n-k)$$

Guarantees existence of nontrivial solution, but is that any good? (Probabilistic analysis)



## **AG-Codes**

## Brown et al.

All this (and more) can be generalized to AG-codes as well.

Can correct *e* errors with an error probability of

$$\left(\frac{1}{q-1}\right)^{\frac{m}{m+1}n(1-R)-\frac{2m-1}{m+1}g-\frac{m-1}{m+1}-e}$$



# Algorithmic Issues

The matrix solution step can be done efficiently using the *displacement method*. (Olshevsky-S.)

The factorization step can be done efficiently using modifications of standard methods (Roth-Ruckenstein, Gao-S.)

All the algorithmic modifications can be generalized to AG-codes.



## **Further Results**

The method of Guruswami-Sudan can be used to do soft-decision decoding of RS-codes (Koetter-Vardy).

Guruswami and co-authors have found a number of other codes which are list-decodable; it seems though that the list-decodability radius can only be increased when the alphabet size increases.

Still question remains whether the GS-bound can be improved for RScodes (or even related codes).