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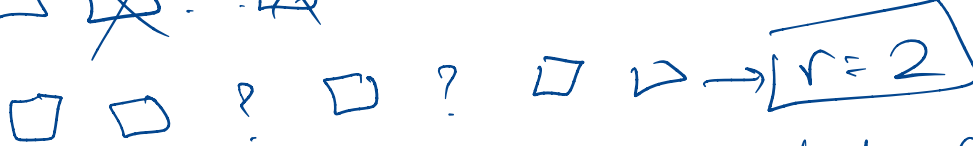
## Lecture 12 - Reed-Solomon Coding

Today we will describe a classical, and widely used and popular method to cope with errors that occur in storage/communication of digital data  
- a glimpse into the rich field of CODING THEORY

Send packets on a channel that can drop/erase up to  $r$  packets



We know the indices of the erased pkts



$$r \geq 1$$

How can you send one packet of info on this channel?

Answer: Easy - replicate pkt  $(r+1)$  times and send all copies



Can also see this is the best possible

Ok, what if you want to send  $k$  pkts at once?

Naive repetition scheme:  $k(r+1)$  pkts.

Factor  $(r+1)$  redundancy.

Q: Can one do better?

Yes .. by "coding" pkts together  $r=1$



→ optimal solution for  $k \geq 2, r=1$

Best soln for any  $k, r$ ?

Observe: Need to send at least  $(k+r)$  pkts  
i.e. add at least  $r$  redundant pkts

□ □ □ ... □ □  $(k+r)$   
↓ erase  $r$  of them

□ ? □ ? □ ... ? □

Remarkably, there is a simple scheme that achieves redundancy  $r$

$k$  pkts  $\mapsto (k+r)$  pkts

s.t. any  $k$  of the received pkts suffice to recover the original  $k$  pkts

OPTIMAL!! How? Algebra/polynomials

Assume pkts are elements in  $\{0, 1, 2, \dots, q-1\} = \mathbb{F}_q$

( $q$  prime)

$\mathbb{F}_q$  is a "field" with addition & multiplication & subtraction & division ( $\neq 0$ ) ( $q=257$ )

Example fields:  $\mathbb{R}$  (reals) modulo  $q$ ,  $\mathbb{Q}$  (rationals),  $\mathbb{C}$  (complex no.)

Only "non-obvious" fact: inverses of nonzero els. exist modulo a prime  $q$ .

i.e.  $a \neq 0 \quad \exists b$  s.t.  $ab \equiv 1 \pmod{q}$   
( $q$  prime)

# Polynomials over a field $\mathbb{F}$

( $d = \text{degree}$ )

Expression of form

Non  
zero  
polynomial

$$P(x) = a_0 + a_1x + a_2x^2 + \dots + a_dx^d$$

( $a_d \neq 0$ )

Also 0 is a polynomial

$$1 + 2x + 4x^3$$

Coefficients  
 $a_i \in \mathbb{F}$

Evaluate Poly  $P(x)$  at pt.  $\alpha \in \mathbb{F}$

$$P(\alpha) = a_0 + a_1\alpha + a_2\alpha^2 + \dots + a_d\alpha^d$$

$\in \mathbb{F}$

$\alpha$  is a root of  $P(x)$  if  $P(\alpha) = 0$

(equivalently  $(x - \alpha)$  divides  $P(x)$ )

A fundamental theorem: A degree  $d$  (nonzero) polynomial over any field  $\mathbb{F}$  has at most  $d$  roots

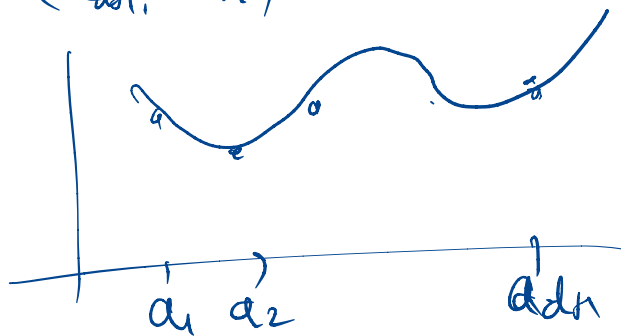
Proof ~~is~~ is not hard, by induction on degree

Using the "division with remainder" property of polys over a field  $\mathbb{F}$

$$A(x) = \underset{\substack{\uparrow \\ \text{quotient}}}{Q(x)} B(x) + \underset{\substack{\downarrow \\ \text{remainder}}}{R(x)}$$

$\deg(R(x)) < \deg(B(x))$

Theorem: Let  $a_1, a_2, \dots, a_{d+1} \in \mathbb{F}$  be distinct  
 and  $b_1, b_2, \dots, b_{d+1} \in \mathbb{F}$  be arbitrary.  
 There is a unique polynomial  $Q$   
 of degree  $\leq d$  st  
 $Q(a_i) = b_i$  for  $i=1, 2, \dots, d+1$



Proof:

Existence: Lagrange interpolation ✓

Uniqueness: Follows from the fundamental thm.

Suppose  $Q_1, Q_2$  both explain the data  
 $\tilde{Q} := Q_1 - Q_2$   
 $\deg(\tilde{Q}) \leq d$  (of  $\deg \leq d$ )  $\Rightarrow \tilde{Q} = 0$   
 $\Rightarrow Q_1 = Q_2$   $\square$

~~Back~~ Back to "erasure" correction

$(p_0, p_1, \dots, p_{k-1})$  are the  $k$  pks ( $p_i \in \mathbb{F}$ )  $\mathbb{F}_q$   
 Pick  $a_1, a_2, \dots, a_{k+r} \in \mathbb{F}$ ,  $a_i$  distinct

$$P(x) := p_0 + p_1 x + p_2 x^2 + \dots + p_{k-1} x^{k-1}$$

(deg  $\leq k-1$ )

[Reed-Solomon Coding]

$(p_0, p_1, \dots, p_{k-1}) \mapsto (P(a_1), P(a_2), \dots, P(a_{k+r}))$

Encoding  $\equiv$  polynomial evaluation [can also speed up using Fast Fourier Transform]

(1960)

$P(a_1) P(a_2) \dots P(a_{k+r})$

↓  $r$  erasures

$P(a_1) ? P(a_3) P(a_4) ? \dots ? P(a_{k+r})$

data:  $(a_i, P(a_i))$   $i$  is increased

→  $\geq k$  pairs  
Use theorem to find the unique  $\deg < k$   
poly that interpolate this data.

Erasures recovery  $\equiv$  polynomial interpolation

Comment:

$\boxed{P_1 P_2} \mapsto \boxed{P_1 P_2 \dots P_{k+r}}$

Original pkts  
appear as  $k$  of the  
coded pkts

Above scheme doesn't have this feature  
Exer: How will you modify the encoding  
to have this property & still guarantee  
tolerance to  $r$  erasures?

What about pkts that are corrupted (and that goes undetected)  
Error-correction?

$(P_0, P_1 \dots P_{k-1}) \mapsto \langle P(a_1), P(a_2) \dots P(a_{k+r}) \rangle$   
↓  $e$  errors  
 $\langle y_1 y_2 \dots y_{k+r} \rangle$   
 $e$  errors for up to  
 $y_i \neq P(a_i)$   $e$  indices  $i$

Would like to correct these & recover  $P(X)$

~~de~~ identifiable from the noisy evaluations ( $y_i^j$ 's)

Pr: If two poly P & Q diff degree from  
 $y$  in  $\leq$  places  $(ds < k \text{ poly})$   
 Rail - Rail

$P(a_i) \neq y_i$  for  $\leq e$  vals of  $i$   $\Rightarrow$   $P(a_i) \neq Q(a_i)$   
 $Q(a_i) = y_i$  — " ——— for at most  $2e$  vals. of  $i$

$$2e \leq r \Rightarrow P(a_i) = Q(a_i) \text{ for } \geq k$$

values of  $a_i$

$$\Rightarrow P = Q$$

~~Q~~ Challenge: Find  $P(x)$  efficiently

Approach: To locate the errors  
(also find  $P(x)$  together with that)

Error-locator polynomial:  $E(x) := \prod_{i: p(a_i) \neq y_i} (x - a_i)$

(the  $P$  that's uniquely identifiable)

## Observation

Define  $Q(X, Y) := (Y - P(X)) E(X)$

Note:  $Q(a_i, y_i) = (y_i - P(a_i)) E(a_i)$   
 $= 0$

Idea of algo

① Forget  $N(X)$  factor  
as  $P(X) \in \mathbb{F}$  and simply  
find  $\tilde{E}(X) \neq 0, \tilde{N}(X)$  s.t.  
 $\deg \tilde{E} \leq e \quad \deg \tilde{N} \leq e + k - 1$   
s.t.  $\forall i, \tilde{E}(a_i) y_i - \tilde{N}(a_i) = 0$

② If  $\frac{\tilde{N}(X)}{\tilde{E}(X)}$  is a  
 $\deg(k-1)$  poly, output it.

We don't know  $Q(X, Y)$

$$Q(X, Y) = E(X) Y - P(X) E(X)$$

$$= E(X) Y - \tilde{N}(X)$$

$$\deg(E) \leq e = \lfloor \frac{n}{2} \rfloor$$

$$\deg(N) \leq e + k - 1$$

→ This is a  
linear system  
in coeffs of  $\tilde{E}$   
&  $\tilde{N}$ .

Cruz: Any  $\tilde{N}, \tilde{E}$  output by  
step ① must satisfy

$$\tilde{N}(X) = \tilde{E}(X) P(X)$$

if  $P(a_i) \neq y_i$  for at most  
 $e = \lfloor \frac{n}{2} \rfloor$  vals of  $a_i$

[This part not covered during lecture but included as notes]

Two things to establish about algorithm:

- Efficiency
- Correctness

Efficiency: Step 2 is easy, just polynomial division  
Step 1 amounts to finding a nonzero solution to a homogeneous linear system with unknowns being coefficients of  $\tilde{E}$  &  $\tilde{N}$ . Can be done in polytime using Gaussian elimination

### CORRECTNESS

① A solution  $\tilde{E}(x), \tilde{N}(x)$  subject to stipulated degree constraints exists.

- If: Indeed can take  $\tilde{E}(x) = E(x)$  (the error locator poly)  
and  $\tilde{N}(x) = E(x)P(x)$

② If  $P(a_i) \neq y_i$  for at most  $e = \lfloor \frac{r}{2} \rfloor$  locations, then any  $\tilde{N}$  &  $\tilde{E}$  found in Step 1 must satisfy  $\tilde{N}(x) = \tilde{E}(x)P(x)$

[So Step 2 correctly outputs  $P(x)$ ]

Proof: Observe that  $\tilde{N}(a_i) - \tilde{E}(a_i)P(a_i) = 0$   
for every  $i$  s.t.  $P(a_i) \neq y_i$

Define  $R(x) := \tilde{N}(x) - \tilde{E}(x)P(x)$

• degree of  $R \leq e + k - 1 = k + \lfloor \frac{r}{2} \rfloor - 1$

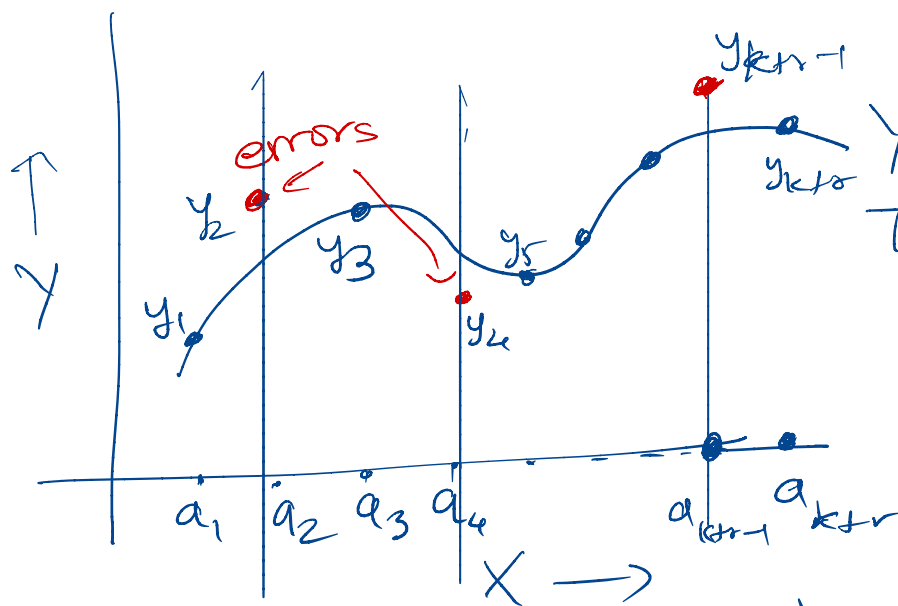
•  $R$  has  $\geq k + r - e$  roots (all pts  $a_i$  s.t.  $P(a_i) = y_i$ )  
 $= k + r - \lfloor \frac{r}{2} \rfloor = k + \lceil \frac{r}{2} \rceil$

Thus  $R(x)$  has more roots than its degree

$\Rightarrow R(x) = 0 \Rightarrow \tilde{N}(x) = \tilde{E}(x) P(x)$   
as desired  $\square$

Geometric view

$E(x) = (x - a_2)(x - a_4)(x - a_{k+r-1})$



$Y - P(x) = 0$

The curve  $(Y - P(x)) E(x) = 0$  passes through all pairs  $(a_i, y_i)$

The correct curve  $Y - P(x) = 0$ , which explains a lot ( $\geq k + \lceil \frac{r}{2} \rceil$ ) of the points, "emerges" as a factor in the picture when we interpolate a curve  $Q(x, Y) = 0$  (with specific degree restrictions) through all the pairs  $(a_i, y_i)$ ,  $i = 1, 2, \dots, k+r$ .