

Finish Welsh-Berlekamp.



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P(i) = R(i) for at least n+k points i,
 P(x) is unique degree n-1 polynomial that contains ≥ n+k received points.

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Reconstructs P(x) and only P(x)!!

## Error Locater Polynomial.

$$(p_{n-1} + \cdots p_0) \equiv R(1) \pmod{p}$$

$$\vdots$$

$$(p_{n-1}i^{n-1} + \cdots p_0) \equiv R(i) \pmod{p}$$

$$\vdots$$

$$(p_{n-1}(n+2k)^{n-1} + \cdots p_0) \equiv R(m) \pmod{p}$$

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$$E(x)=x^k+b_{k-1}x^{k-1}\cdots b_0.$$

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Equations:

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and linear in  $a_i$  and coefficients of  $b_i$ !

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► *E*(*x*) has degree *k* 

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For all points  $1, \ldots, i, n+2k = m$ ,

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 $a_{n+k-1}(m)^{n+k-1}+\ldots a_0 \equiv R(m)((m)^k+b_{k-1}(m)^{k-1}\cdots b_0) \pmod{p}$ 

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..and n+2k unknown coefficients of Q(x) and E(x)! Solve for coefficients of Q(x) and E(x).

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,  $R(2) = 1$ ,  $R(3) = 6$ ,  $R(4) = 0$ ,  $R(5) = 3$ 

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$$a_3 + a_2 + a_1 + a_0 \equiv 3(1 - b_0) \pmod{7}$$

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 $a_3 = 1$ ,  $a_2 = 6$ ,  $a_1 = 6$ ,  $a_0 = 5$  and  $b_0 = 2$ .

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 $E(x) = x - 2.$ 

x - 2)  $x^3 + 6x^2 + 6x + 5$ 

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$
  

$$E(x) = x - 2.$$

$$x - 2 ) x^{3} + 6 x^{2} + 6 x + 5$$

$$x^{3} - 2 x^{2}$$

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$

$$E(x) = x - 2.$$

$$1 x^{2} + 1 x + 1$$

$$x - 2) x^{3} + 6 x^{2} + 6 x + 5$$

$$x^{3} - 2 x^{2}$$

$$1 x^{2} + 6 x + 5$$

$$1 x^{2} - 2 x$$

$$x + 5$$

$$x - 2$$

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$

$$E(x) = x - 2.$$

$$x - 2 ) x^{3} + 6 x^{2} + 6 x + 5$$

$$x^{3} - 2 x^{2}$$

$$1 x^{2} + 6 x + 5$$

$$1 x^{2} - 2 x$$

$$x + 5$$

$$x + 5$$

$$x - 2$$

$$0$$

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$

$$E(x) = x - 2.$$

$$1 x^{2} + 1 x + 1$$

$$x - 2 ) x^{3} + 6 x^{2} + 6 x + 5$$

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$$1 x^{2} + 6 x + 5$$

$$1 x^{2} - 2 x$$

$$x + 5$$

$$x - 2$$

$$0$$

 $P(x) = x^2 + x + 1$ 

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$

$$E(x) = x - 2.$$

$$1 x^{2} + 1 x + 1$$

$$x - 2 ) x^{3} + 6 x^{2} + 6 x + 5$$

$$x^{3} - 2 x^{2}$$

$$------$$

$$1 x^{2} + 6 x + 5$$

$$1 x^{2} - 2 x$$

$$------$$

$$x + 5$$

$$x - 2$$

$$-----$$

$$0$$

$$R(x) = x^{2} + x + 1$$

$$P(x) = x^2 + x + 1$$
  
Message is  $P(1) = 3, P(2) = 0, P(3) = 6.$ 

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$

$$E(x) = x - 2.$$

$$1 x^{2} + 1 x + 1$$

$$x - 2 ) x^{3} + 6 x^{2} + 6 x + 5$$

$$x^{3} - 2 x^{2}$$

$$------$$

$$1 x^{2} + 6 x + 5$$

$$1 x^{2} - 2 x$$

$$------$$

$$x + 5$$

$$x - 2$$

$$------$$

$$0$$

$$P(x) = x^{2} + x + 1$$
Message is  $P(1) = 3, P(2) = 0, P(3) = 6.$ 

What is  $\frac{x-2}{x-2}$ ?

$$Q(x) = x^{3} + 6x^{2} + 6x + 5.$$

$$E(x) = x - 2.$$

$$1 x^{2} + 1 x + 1$$

$$x - 2 ) x^{3} + 6 x^{2} + 6 x + 5$$

$$x^{3} - 2 x^{2}$$

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$$1 x^{2} + 6 x + 5$$

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What is  $\frac{x-2}{x-2}$ ? 1

What is  $\frac{x-2}{x-2}$ ? 1 Except at x = 2?

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$$E(x) = x - 2.$$

$$1 \quad x^{2} + 1 \quad x + 1$$

$$x - 2 \quad ) \quad x^{3} + 6 \quad x^{2} + 6 \quad x + 5$$

$$x^{3} - 2 \quad x^{2}$$

$$------$$

$$1 \quad x^{2} + 6 \quad x + 5$$

$$1 \quad x^{2} - 2 \quad x$$

$$------$$

$$x + 5$$

$$x - 2$$

$$-----$$

$$0$$

$$P(x) = x^{2} + x + 1$$
Message is  $P(1) = 3, P(2) = 0, P(3) = 6.$ 
What is  $\frac{x - 2}{2} = 1$ 

What is  $\frac{x-z}{x-2}$ ? 1 Except at x = 2? Hole there?

## Error Correction: Berlekamp-Welsh

Message:  $m_1, \ldots, m_n$ . Sender:

- 1. Form degree n-1 polynomial P(x) where  $P(i) = m_i$ .
- 2. Send  $P(1), \ldots, P(n+2k)$ .

#### **Receiver:**

- 1. Receive R(1), ..., R(n+2k).
- 2. Solve n+2k equations, Q(i) = E(i)R(i) to find Q(x) = E(x)P(x)and E(x).
- 3. Compute P(x) = Q(x)/E(x).
- 4. Compute *P*(1),...,*P*(*n*).

You have error locator polynomial!

You have error locator polynomial!

Where oh where have my packets gone wrong?

You have error locator polynomial! Where oh where have my packets gone wrong? Factor?

You have error locator polynomial! Where oh where have my packets gone wrong? Factor? Sure.

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values?

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values? Sure.

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values? Sure.

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values? Sure.

Efficiency?

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values? Sure.

Efficiency? Sure.

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values? Sure.

Efficiency? Sure. Only n + 2k values.

You have error locator polynomial!

Where oh where have my packets gone wrong?

Factor? Sure. Check all values? Sure.

Efficiency? Sure. Only n+2k values. See where it is 0.

#### Hmmm...

#### Is there one and only one P(x) from Berlekamp-Welsh procedure?

#### Hmmm...

# Is there one and only one P(x) from Berlekamp-Welsh procedure? **Existence:** there is a P(x) and E(x) that satisfy equations.

**Uniqueness:** any solution Q'(x) and E'(x) have

$$\frac{Q'(x)}{E'(x)} = \frac{Q(x)}{E(x)} = P(x).$$
 (1)

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Proof: We claim

$$Q'(x)E(x) = Q(x)E'(x) \text{ on } n+2k \text{ values of } x. \tag{2}$$

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Q'(x)E(x) and Q(x)E'(x) are degree n+2k-1

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Equation 2 implies 1:

Q'(x)E(x) and Q(x)E'(x) are degree n+2k-1and agree on n+2k points

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Proof: We claim

$$Q'(x)E(x) = Q(x)E'(x) \text{ on } n+2k \text{ values of } x. \tag{2}$$

Equation 2 implies 1:

Q'(x)E(x) and Q(x)E'(x) are degree n+2k-1and agree on n+2k points E(x) and E'(x) have at most k zeros each.

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Equation 2 implies 1:

Q'(x)E(x) and Q(x)E'(x) are degree n+2k-1and agree on n+2k points E(x) and E'(x) have at most k zeros each. Can cross divide at n points.

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 equal on *n* points.

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#### Last bit.

**Fact:** Q'(x)E(x) = Q(x)E'(x) on n+2k values of x.

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for  $i \in \{1, ..., n+2k\}$ .

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Q(i) = R(i)E(i)Q'(i) = R(i)E'(i)

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Cross multiplying gives equality in fact for these points.

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Points to polynomials, have to deal with zeros!

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Cross multiplying gives equality in fact for these points.

Points to polynomials, have to deal with zeros!

Example: dealing with  $\frac{x-2}{x-2}$  at x = 2.



Berlekamp-Welsh algorithm decodes correctly when k errors!

Communicate *n* packets, with *k* erasures. How many packets?

Communicate *n* packets, with *k* erasures. How many packets? n+k

Communicate *n* packets, with *k* erasures.

How many packets? n+kHow to encode?

Communicate *n* packets, with *k* erasures. How many packets? n+kHow to encode? With polynomial, P(x).

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How many packets? n+kHow to encode? With polynomial, P(x). Of degree?

```
How many packets? n+k
How to encode? With polynomial, P(x).
Of degree? n-1
```

```
How many packets? n+k
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Recover?
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```
How many packets? n+k
How to encode? With polynomial, P(x).
Of degree? n-1
Recover? Reconstruct P(x) with any n points!
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How many packets? n+k
How to encode? With polynomial, P(x).
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How many packets? n+2k Why?
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Communicate n packets, with k erasures.

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Communicate *n* packets, with *k* errors.

How many packets? n+2kWhy? k changes to make diff. messages overlap

Communicate n packets, with k erasures.

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How many packets? n+k
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*k* changes to make diff. messages overlap How to encode? With polynomial, P(x). Of degree? n-1. Recover?

```
Reconstruct error polynomial, E(X), and P(x)!
```

Communicate n packets, with k erasures.

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Nonlinear equations.

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Nonlinear equations.

Reconstruct E(x) and Q(x) = E(x)P(x).

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How to encode? With polynomial, P(x).
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*k* changes to make diff. messages overlap How to encode? With polynomial, P(x). Of degree? n-1. Recover?

Reconstruct error polynomial, E(X), and P(x)!

Nonlinear equations.

Reconstruct E(x) and Q(x) = E(x)P(x). Linear Equations.

Communicate n packets, with k erasures.

```
How many packets? n+k
How to encode? With polynomial, P(x).
Of degree? n-1
Recover? Reconstruct P(x) with any n points!
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*k* changes to make diff. messages overlap How to encode? With polynomial, P(x). Of degree? n-1. Recover?

Reconstruct error polynomial, E(X), and P(x)!

Nonlinear equations.

Reconstruct E(x) and Q(x) = E(x)P(x). Linear Equations. Polynomial division!

Communicate *n* packets, with *k* erasures.

```
How many packets? n+k
How to encode? With polynomial, P(x).
Of degree? n-1
Recover? Reconstruct P(x) with any n points!
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Communicate *n* packets, with *k* errors.

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Reconstruct error polynomial, E(X), and P(x)!

Nonlinear equations.

Reconstruct E(x) and Q(x) = E(x)P(x). Linear Equations. Polynomial division! P(x) = Q(x)/E(x)!

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Reed-Solomon codes. Welsh-Berlekamp Decoding. Perfection!

Next up: how big is infinity.

# Next up: how big is infinity.

- Countable
- Countably infinite.
- Enumeration

How big are the reals or the integers?

Infinite!

How big are the reals or the integers?

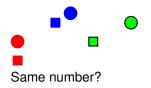
Infinite!

Is one bigger or smaller?

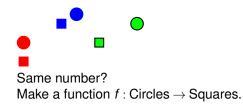


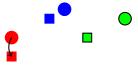
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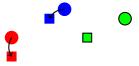




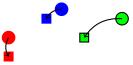




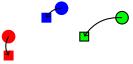
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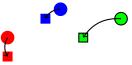
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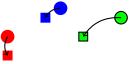
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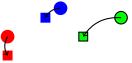
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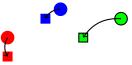
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**Isomorphism principle:** If there is  $f : D \to R$  that is one to one and onto, then, |D| = |R|.

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If there is a bijection  $f: D \rightarrow R$  then |D| = |R|.



How to count?



How to count?

0,

How to count?

0, 1,

How to count?

0, 1, 2,

How to count?

0, 1, 2, 3,

How to count?

0, 1, 2, 3, ...

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0, 1, 2, 3, ...

The Counting numbers.

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0, 1, 2, 3, ...

The Counting numbers. The natural numbers! *N* 

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Definition: *S* is **countable** if there is a bijection between *S* and some subset of *N*.

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Definition: *S* is **countable** if there is a bijection between *S* and some subset of *N*.

If the subset of *N* is finite, *S* has finite **cardinality**.

If the subset of *N* is infinite, *S* is **countably infinite**.

Which is bigger?

Which is bigger? The positive integers,  $\mathbb{Z}^+,$  or the natural numbers,  $\mathbb{N}.$ 

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Natural numbers. 0,

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More natural numbers!

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**Bijection!** 

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Bijection!  $\implies |\mathbb{Z}^+| = |\mathbb{N}|.$ 

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But.. but Where's zero? "Comes from 1."

Notice that there is a bijection between *N* and  $Z^+$  as well.

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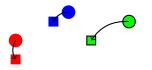
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Bijection from A to  $B \implies$  a bijection from B to A.

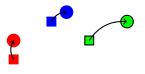
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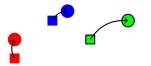
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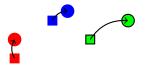


Inverse function!

Can prove equivalence either way.

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Inverse function!

Can prove equivalence either way.

Bijection to or from natural numbers implies countably infinite.

E - Even natural numbers?

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 $f: N \rightarrow E.$ 

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Evens are countably infinite.

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Evens are countably infinite. Evens are same size as all natural numbers.

What about Integers, Z?

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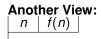
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# Another View: $n \mid f(n) \mid$

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0	0
1	-1

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n	<i>f</i> ( <i>n</i> )
0	0
1	-1
2	1

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n	<i>f</i> ( <i>n</i> )
0	0
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2	1
3	-2

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61A

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61A --- streams!

## Countably infinite subsets.

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There is a bijection with the natural numbers.

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All countably infinite sets have the same cardinality.

All binary strings.

All binary strings.  $B = \{0, 1\}^*$ .

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B = \{\phi; 0,00,000,0000,...\}
Never get to 1.
```