

## Some math for embedded algorithms

- CRC (Cyclic Redundancy Check) is often used to check integrity of transmitted messages
- Hamming codes can correct one error
- BCH codes can correct more
- LFSRs (Linear Feedback Shift Registers) are used to generate pseudo-random sequences, used in communications and other apps

What do these algorithms have in common?

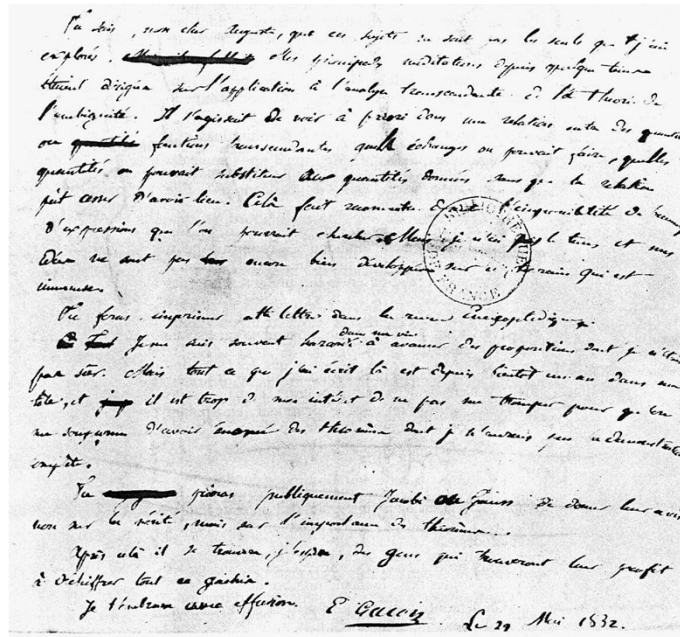
They are all based on ***finite field arithmetic***, specifically Galois Fields, which use polynomial algebra

Historical interlude

# Evariste Galois

From his last letter:

“Ask Jacobi or Gauss publicly to give their opinion, not as to the truth, but as to the importance of these theorems. Later there will be, I hope, some people who will find it to their advantage to decipher all this mess...”



Killed in a duel at age 20

Galois theory addresses the question of which polynomial equations can be solved by formulas with radicals (there are quadratic, cubic, quartic formulas; quintic, only sometimes). Also shows which polygons can be constructed with ruler and compass.

The machinery of polynomial algebra and “Galois Fields” turns out to be very useful for certain embedded algorithms!

See *Galois Theory*, 3<sup>rd</sup> Ed., I. Stewart

---

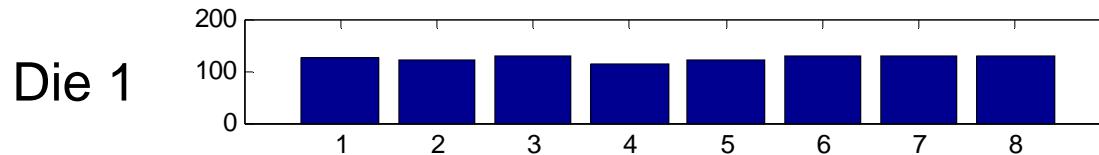
## Why the \*&^!@ does everyone talk about polynomials whenever codes come up?

- ***Finite fields***, are a good idea for encoding digital data (e.g. for implementing linear codes): inputs and outputs to/from a computer or channel are discrete & finite; linear codes are defined in terms of addition and multiplication operations
  - Informally, a ***field*** is a set that supports addition, multiplication, and the distributive property
  - And why do we need Galois Fields (based on polynomial algebra) for coding?
  - What's wrong with integer arithmetic mod  $N$ ? That's linear and finite. Shouldn't that work for coding?
  - Let's see what happens!
    - Consider a bunch of addition and multiplication operations on random data, mod 8!
-

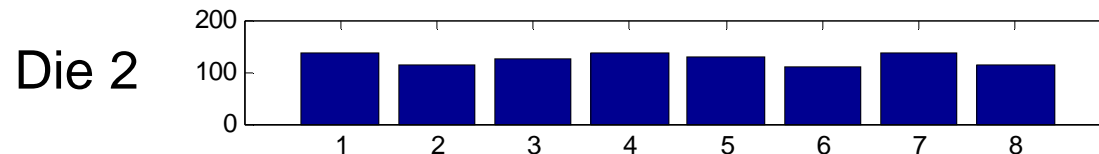
# Adding a pair of 8-sided dice, mod 8

Histograms for 1000 rolls of the dice

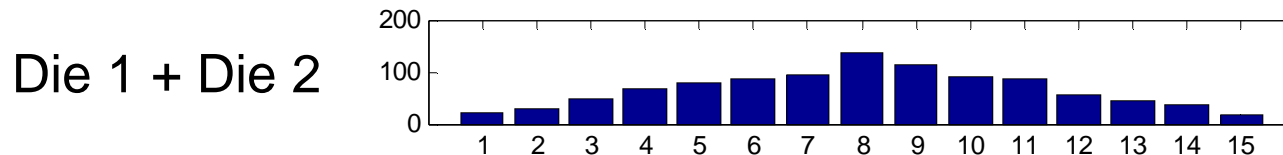
Die 1. Ndice = 1000 Nsides = 8



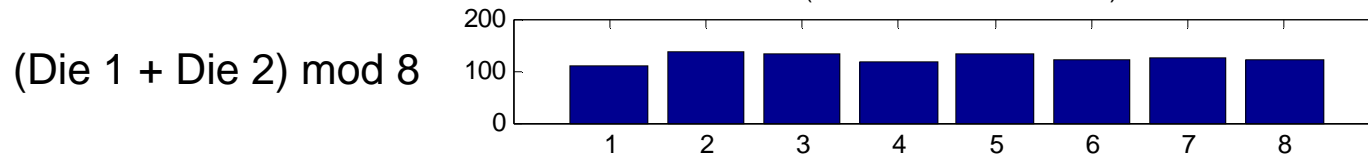
Die 2. Ndice = 1000 Nsides = 8



Die 1 + Die 2

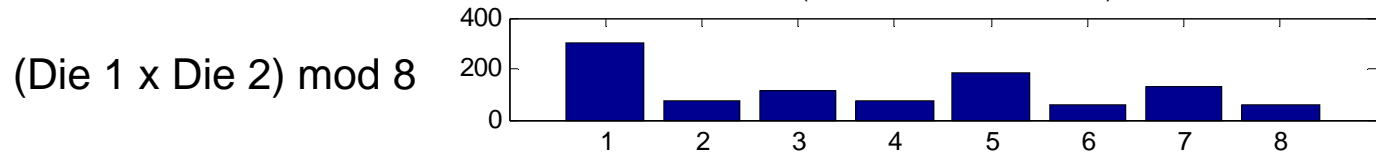
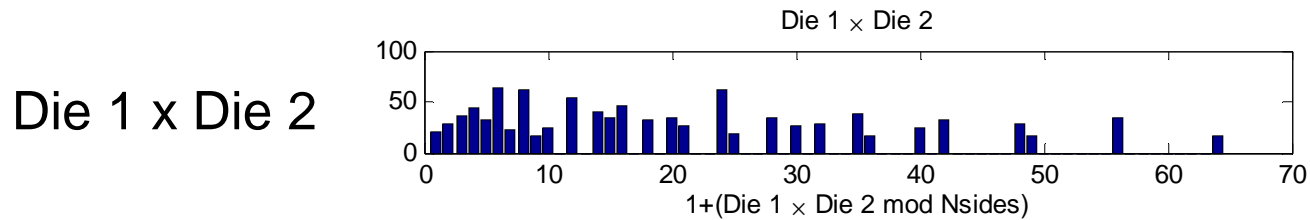
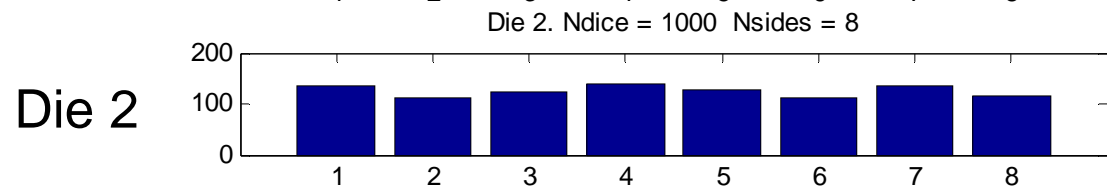
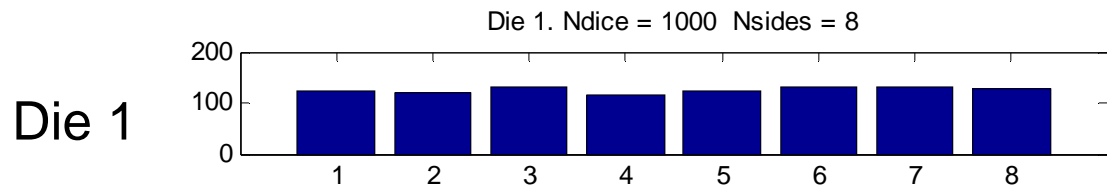


1+(Die 1 + Die 2 mod Nsides)



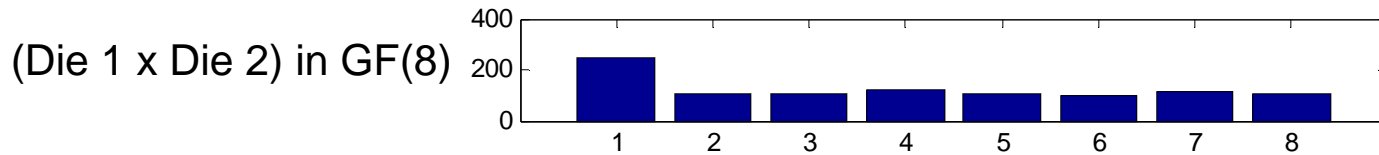
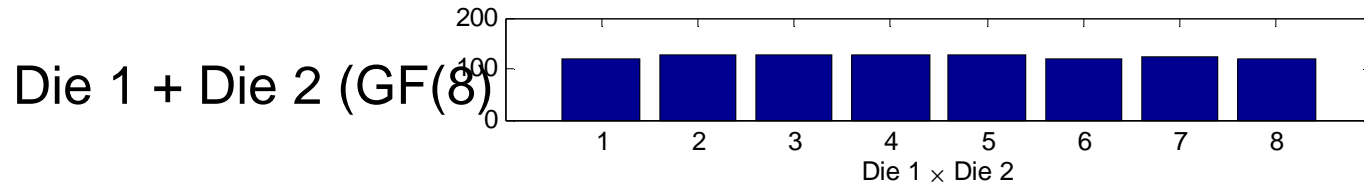
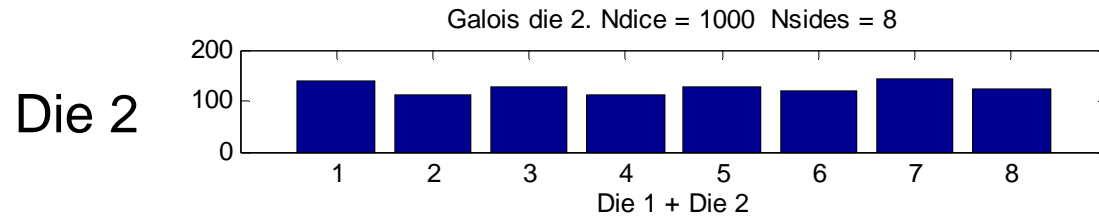
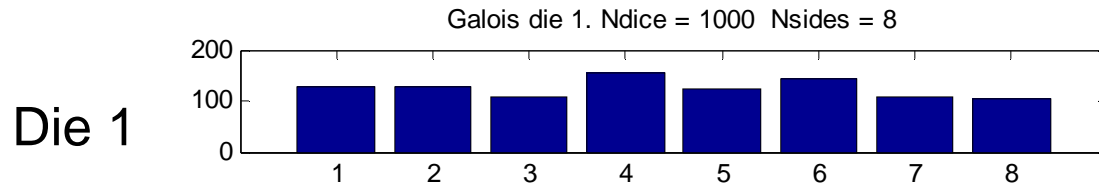
← Pretty Uniform!

# Multiplying a pair of 8-sided dice, mod 8



← guck!  
Big  
mess!

# Adding & Multiplying a pair of 8-sided dice, in GF(8)



Wow!  
Very  
Uniform!

# Comparing the multiplication tables

Mod 8

| X | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|---|---|---|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| 2 | 0 | 2 | 4 | 6 | 0 | 2 | 4 | 6 |
| 3 | 0 | 3 | 6 | 1 | 4 | 7 | 2 | 5 |
| 4 | 0 | 4 | 0 | 4 | 0 | 4 | 0 | 4 |
| 5 | 0 | 5 | 2 | 7 | 4 | 1 | 6 | 3 |
| 6 | 0 | 6 | 4 | 2 | 0 | 6 | 4 | 2 |
| 7 | 0 | 7 | 6 | 5 | 4 | 3 | 2 | 1 |



↑ some rows have repeated elements

GF(8)

| X | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|---|---|---|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| 2 | 0 | 2 | 4 | 6 | 3 | 1 | 7 | 5 |
| 3 | 0 | 3 | 6 | 5 | 7 | 4 | 1 | 2 |
| 4 | 0 | 4 | 3 | 7 | 6 | 2 | 5 | 1 |
| 5 | 0 | 5 | 1 | 4 | 2 | 7 | 3 | 6 |
| 6 | 0 | 6 | 7 | 1 | 5 | 3 | 2 | 4 |
| 7 | 0 | 7 | 5 | 2 | 1 | 6 | 4 | 3 |

↑ Each # appears ONCE per row

---

What is the rule for constructing this magic multiplication table?

- Interpret the bits as coefficients (1 or 0) of a polynomial
  - Interpret coefficients as mod 2
  - Multiply the polynomials
  - Take result mod  $x^3+x+1$
-



| X | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|---|---|---|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| 2 | 0 | 2 | 4 | 6 | 3 | 1 | 7 | 5 |
| 3 | 0 | 3 | 6 | 5 | 7 | 4 | 1 | 2 |
| 4 | 0 | 4 | 3 | 7 | 6 | 2 | 5 | 1 |
| 5 | 0 | 5 | 1 | 4 | 2 | 7 | 3 | 6 |
| 6 | 0 | 6 | 7 | 1 | 5 | 3 | 2 | 4 |
| 7 | 0 | 7 | 5 | 2 | 1 | 6 | 4 | 3 |

Check the table!

| Elt. | Binary Rep. | Polynomial          |
|------|-------------|---------------------|
| 0    | 000         | 0                   |
| 1    | 001         | 1                   |
| 2    | 010         | x                   |
| 3    | 011         | x+1                 |
| 4    | 100         | x <sup>2</sup>      |
| 5    | 101         | x <sup>2</sup> +1   |
| 6    | 110         | x <sup>2</sup> +x   |
| 7    | 111         | x <sup>2</sup> +x+1 |

| Elt. | Polynomial                                  | Raw product  | Coefs mod 2                                       |
|------|---|--|---|
| 2*2  | x*x   | x <sup>2</sup>   | x <sup>2</sup>                                    |
| 2*3  | x*(x+1)                                     | x <sup>2</sup> +x                                      | x <sup>2</sup> +x                                 |
| 2*4  | x*x <sup>2</sup>                            | x <sup>3</sup>   | x <sup>3</sup>                                    |
| 2*5  | x*(x <sup>2</sup> +1)                       | x <sup>3</sup> +x                                      | x <sup>3</sup> +x                                 |
| 2*6  | x*(x <sup>2</sup> +x)                       | x <sup>3</sup> +x <sup>2</sup>                         | x <sup>3</sup> +x <sup>2</sup>                    |
| 2*7  | x*(x <sup>2</sup> +x+1)                     | x <sup>3</sup> +x <sup>2</sup> +x                      | x <sup>3</sup> +x <sup>2</sup> +x                 |
| 3*3  | (x+1)*(x+1)                                 | x <sup>2</sup> +2x+1                                   | x <sup>2</sup> +1                                 |
| 3*4  | (x+1)*x <sup>2</sup>                        | x <sup>3</sup> +x <sup>2</sup>                         | x <sup>3</sup> +x <sup>2</sup>                    |
| 3*5  | (x+1)*(x <sup>2</sup> +1)                   | x <sup>3</sup> +x <sup>2</sup> +x+1                    | x <sup>3</sup> +x <sup>2</sup> +x+1               |
| 3*6  | (x+1)*(x <sup>2</sup> +x)                   | x <sup>3</sup> +2x <sup>2</sup> +x                     | x <sup>3</sup> +x                                 |
| 3*7  | (x+1)*(x <sup>2</sup> +x+1)                 | x <sup>3</sup> +2x <sup>2</sup> +2x+1                  | x <sup>3</sup> +1                                 |
| 4*4  | x <sup>2</sup> *x <sup>2</sup>              | x <sup>4</sup>   | x <sup>4</sup>                                    |
| 4*5  | x <sup>2</sup> *(x <sup>2</sup> +1)         | x <sup>4</sup> +x <sup>2</sup>                         | x <sup>4</sup> +x <sup>2</sup>                    |
| 4*6  | x <sup>2</sup> *(x <sup>2</sup> +x)         | x <sup>4</sup> +x <sup>3</sup>                         | x <sup>4</sup> +x <sup>3</sup>                    |
| 4*7  | x <sup>2</sup> *(x <sup>2</sup> +x+1)       | x <sup>4</sup> +x <sup>3</sup> +x <sup>2</sup>         | x <sup>4</sup> +x <sup>3</sup> +x <sup>2</sup>    |
| 5*5  | (x <sup>2</sup> +1)*(x <sup>2</sup> +1)     | x <sup>4</sup> +2x <sup>2</sup> +1                     | x <sup>4</sup> +1                                 |
| 5*6  | (x <sup>2</sup> +1)*(x <sup>2</sup> +x)     | x <sup>4</sup> +x <sup>3</sup> +x <sup>2</sup> +x      | x <sup>4</sup> +x <sup>3</sup> +x <sup>2</sup> +x |
| 5*7  | (x <sup>2</sup> +1)*(x <sup>2</sup> +x+1)   | x <sup>4</sup> +x <sup>3</sup> +2x <sup>2</sup> +x+1   | x <sup>4</sup> +x <sup>3</sup> +x+1               |
| 6*6  | (x <sup>2</sup> +x)*(x <sup>2</sup> +x)     | x <sup>4</sup> +2x <sup>3</sup> +x <sup>2</sup>        | x <sup>4</sup> +x <sup>2</sup>                    |
| 6*7  | (x <sup>2</sup> +x)*(x <sup>2</sup> +x+1)   | x <sup>4</sup> +2x <sup>3</sup> +2x <sup>2</sup> +x    | x <sup>4</sup> +x                                 |
| 7*7  | (x <sup>2</sup> +x+1)*(x <sup>2</sup> +x+1) | x <sup>4</sup> +2x <sup>3</sup> +3x <sup>2</sup> +2x+1 | x <sup>4</sup> +x <sup>2</sup> +1                 |

| Elt.  | Coefs mod 2     | Mod $x^3+x+1$ |
|-------|-----------------|---------------|
| $2^2$ | $x^2$           | $x^2$         |
| $2^3$ | $x^2+x$         | $x^2+x$       |
| $2^4$ | $x^3$           | $x+1$         |
| $2^5$ | $x^3+x$         | 1             |
| $2^6$ | $x^3+x^2$       | $x^2+x+1$     |
| $2^7$ | $x^3+x^2+x$     | $x^2+1$       |
| $3^3$ | $x^2+1$         |               |
| $3^4$ | $x^3+x^2$       |               |
| $3^5$ | $x^3+x^2+x+1$   |               |
| $3^6$ | $x^3+x$         |               |
| $3^7$ | $x^3+1$         |               |
| $4^4$ | $x^4$           |               |
| $4^5$ | $x^4+x^2$       |               |
| $4^6$ | $x^4+x^3$       |               |
| $4^7$ | $x^4+x^3+x^2$   |               |
| $5^5$ | $x^4+1$         |               |
| $5^6$ | $x^4+x^3+x^2+x$ |               |
| $5^7$ | $x^4+x^3+x+1$   |               |
| $6^6$ | $x^4+x^2$       |               |
| $6^7$ | $x^4+x$         |               |

Check the table!

Handwritten polynomial divisions:

- Red:**  $x^3 + x + 1 \overline{) x^3}$  with quotient 1 and remainder  $x+1$ . An arrow points from this to the row  $2^4$  in the table.
- Red:**  $x^3 + x + 1 \overline{) x^3 + x^2}$  with quotient 1 and remainder  $x^2 + x + 1$ . An arrow points from this to the row  $2^6$  in the table.
- Blue:**  $x^3 + x + 1 \overline{) x^3 + x}$  with quotient 1 and remainder 1. An arrow points from this to the row  $2^5$  in the table.
- Blue:**  $x^3 + x + 1 \overline{) x^3 + x^2 + x}$  with quotient 1 and remainder  $x^2 + 1$ . An arrow points from this to the row  $2^7$  in the table.

Check the table!

| Elt. | Coefs mod 2     | Mod $x^3+x+1$ | = Elt. |
|------|-----------------|---------------|--------|
| 2*2  | $x^2$           | $x^2$         | 4      |
| 2*3  | $x^2+x$         | $x^2+x$       | 6      |
| 2*4  | $x^3$           | $x+1$         | 3      |
| 2*5  | $x^3+x$         | 1             | 1      |
| 2*6  | $x^3+x^2$       | $x^2+x+1$     | 7      |
| 2*7  | $x^3+x^2+x$     | $x^2+1$       | 5      |
| 3*3  | $x^2+1$         |               |        |
| 3*4  | $x^3+x^2$       |               |        |
| 3*5  | $x^3+x^2+x+1$   |               |        |
| 3*6  | $x^3+x$         |               |        |
| 3*7  | $x^3+1$         |               |        |
| 4*4  | $x^4$           |               |        |
| 4*5  | $x^4+x^2$       |               |        |
| 4*6  | $x^4+x^3$       |               |        |
| 4*7  | $x^4+x^3+x^2$   |               |        |
| 5*5  | $x^4+1$         |               |        |
| 5*6  | $x^4+x^3+x^2+x$ |               |        |
| 5*7  | $x^4+x^3+x+1$   |               |        |
| 6*6  | $x^4+x^2$       |               |        |
| 6*7  | $x^4+x$         |               |        |

| Elt. | Binary Rep. | Polynomial |
|------|-------------|------------|
| 0    | 000         | 0          |
| 1    | 001         | 1          |
| 2    | 010         | $x$        |
| 3    | 011         | $x+1$      |
| 4    | 100         | $x^2$      |
| 5    | 101         | $x^2+1$    |
| 6    | 110         | $x^2+x$    |
| 7    | 111         | $x^2+x+1$  |

| X | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|---|---|---|---|---|---|---|---|---|
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| 2 | 0 | 2 | 4 | 6 | 3 | 1 | 7 | 5 |
| 3 | 0 | 3 | 6 | 5 | 7 | 4 | 1 | 2 |
| 4 | 0 | 4 | 3 | 7 | 6 | 2 | 5 | 1 |
| 5 | 0 | 5 | 1 | 4 | 2 | 7 | 3 | 6 |
| 6 | 0 | 6 | 7 | 1 | 5 | 3 | 2 | 4 |
| 7 | 0 | 7 | 5 | 2 | 1 | 6 | 4 | 3 |

---

# Discussion

- Finite fields exist for sets of size  $p^n$  where  $p$  is prime
- We are very lucky that 2 is a prime number! Otherwise this wouldn't make sense.

---

To be continued soon...

With how Galois Field arithmetic used in embedded systems for CRC, LFSR, and other algorithms...

# More info

Copyright Cambridge University Press 2003. On-screen viewing permitted. Printing not permitted. <http://www.cambridge.org/0521642981>  
You can buy this book for 30 pounds or \$50. See <http://www.inference.phy.cam.ac.uk/mackay/titla/> for links.

## C

### *Some Mathematics*

#### ► C.1 Finite field theory

*Most linear codes are expressed in the language of Galois theory*

Why are Galois fields an appropriate language for linear codes? First, a definition and some examples.

A field  $F$  is a set  $F = \{0, F'\}$  such that

1.  $F$  forms an Abelian group under an addition operation '+', with 0 being the identity; [Abelian means all elements commute, i.e., satisfy  $a + b = b + a$ .]
2.  $F'$  forms an Abelian group under a multiplication operation '·'; multiplication of any element by 0 yields 0;
3. these operations satisfy the distributive rule  $(a + b) \cdot c = a \cdot c + b \cdot c$ .

For example, the real numbers form a field, with '+' and '·' denoting ordinary addition and multiplication.

A Galois field  $GF(q)$  is a field with a finite number of elements  $q$ .

A unique Galois field exists for any  $q = p^m$ , where  $p$  is a prime number and  $m$  is a positive integer; there are no other finite fields.

$GF(2)$ . The addition and multiplication tables for  $GF(2)$  are shown in ta-

|   |   |   |
|---|---|---|
| + | 0 | 1 |
| 0 | 0 | 1 |
| 1 | 1 | 0 |

|   |   |   |
|---|---|---|
| · | 0 | 1 |
| 0 | 0 | 0 |
| 1 | 0 | 1 |

Table C.1. Addition and multiplication tables for  $GF(2)$ .

|   |   |   |   |   |
|---|---|---|---|---|
| + | 0 | 1 | A | B |
| 0 | 0 | 1 | A | B |
| 1 | 1 | 0 | B | A |
| A | A | B | 0 | 1 |
| B | B | A | 1 | 0 |

|   |   |   |   |   |
|---|---|---|---|---|
| · | 0 | 1 | A | B |
| 0 | 0 | 0 | 0 | 0 |

Try the math dept, or

D.J.C. MacKay

“Information Theory,  
Inference, and Learning  
Algorithms”

Cambridge U. Press, 2003

Appendix C,

Some Mathematics

I. Stewart

Galois Theory, 3<sup>rd</sup> Ed

Chapman & Hall / CRC, 2004



# CRC example

| Data                              | CRC-CCITT<br>Poly:<br>0x1021 | CRC-16<br>Poly:<br>0x8005 | CRC-32<br>Poly:<br>0x4C11DB7 |
|-----------------------------------|------------------------------|---------------------------|------------------------------|
| The quick<br>brown fox<br>jumped  | 0x1C20                       | 0x10C2                    | 0x7E9D4E99                   |
| The quick<br>brown fox<br>jumped! | 0xC7FE                       | 0x8951                    | 0x17C6497D                   |
| The quick fox<br>brown jumped     | 0xB5B9                       | 0x7A20                    | 0x114792B3                   |

Computed using

<http://zorc.breitbandkatze.de/crc.html>



# CRC

- CRC is a set of  $u$  parity bits appended to a message
- Treat data bits as polynomial,  $d(x)$  (“data”)
- Pad data with  $u$  zeros (multiply data poly by  $x^u$ )
- Our magic checking polynomial is  $g(x)$  (“generator”)
- CRC  $r(x)$  (“remainder”) defined implicitly by

$$m(x) = \frac{d(x)x^u + r(x)}{g(x)}$$

$r(x)$  added to padded data makes it divisible by  $g(x)$ . We don't care about  $m(x)$

- Solve above equation to get explicit expression for  $r(x)$

$$r(x) = g(x)m(x) - d(x)x^u = d(x)x^u - g(x)m(x)$$

# Common CRC polynomials

- CCITT CRC-16  $x^{16} + x^{12} + x^5 + 1$
- CRC-5-USB  $x^5 + x^2 + 1$  (USB token packets)
- CRC-8-CCITT  $x^8 + x^2 + x + 1$  ISDN Header Error Control
- CRC-32  $x^{32} + x^{26} + x^{23} + x^{22} + x^{16} + x^{12} + x^{11} + x^{10} + x^8 + x^7 + x^5 + x^4 + x^2 + x + 1$   
Ethernet, SATA, MPEG-2, Gzip, PKZIP, PNG
- CRC-40-GSM  $x^{40} + x^{26} + x^{23} + x^{17} + x^3 + 1$   
GSM Control Channel

And many more...see

[http://en.wikipedia.org/wiki/Cyclic\\_redundancy\\_check](http://en.wikipedia.org/wiki/Cyclic_redundancy_check)

# CRC example

```
11010011101100 000 <---input, padded 3 bits
1011 <--- divisor
01100011101100 000 <--- result
 1011 <--- divisor
00111011101100 000
 1011
00010111101100 000
 1011
00000001101100 000
 1011
00000000110100 000
 1011
00000000011000 000
 1011
00000000001110 000
 1011
00000000000101 000
 101 1
00000000000000 100 <---remainder (3 bits)
```