

What is a number?

# TDDE25

Fö 2

Chap 1: Data Storage

Types of Numbers

Number Systems

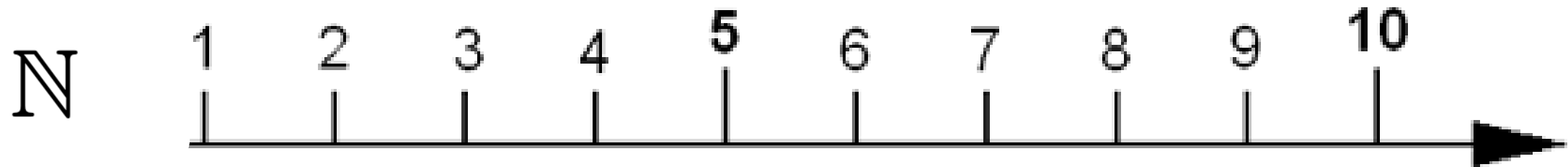
Representation in Computers

# Types of Numbers



**N**ine **Z**ulu **Q**ueens **R**uled **C**hina

# Natural Numbers – Counting



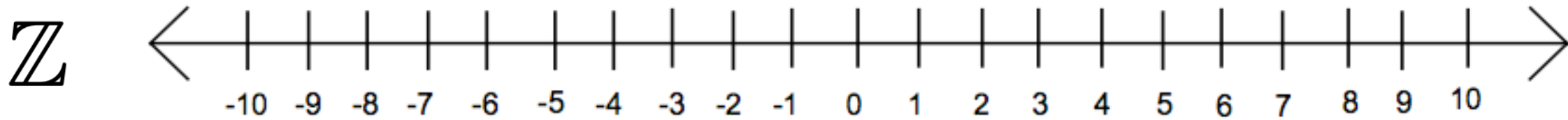
- Addition - Closed
- Multiplication - Closed
- Subtraction - **Not** Closed
- Division - **Not** Closed

## Solving the Subtraction Problem:

- Discovery of Zero
- Discovery of negative numbers
  - Han Dynasty 220 BCE - 202 CE
  - Europe: 17th century

CE - Common era

# Integers

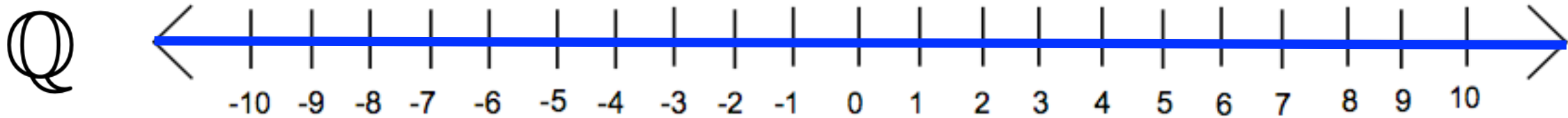


- Addition - Closed
- Multiplication - Closed
- Subtraction - Closed
- Division - **Not** Closed

## Solving the Division Problem:

- Discovery of rational numbers
  - Ratios between two integers

# Rational Numbers



- Addition – Closed
- Multiplication – Closed
- Subtraction – Closed
- Division – Closed

$$\frac{\text{Numerator}}{\text{Denominator}}$$

Numerator, Denominator are integers  
The denominator can not be 0

Rational numbers are dense. Between any two of them, you can always find another!

- Between 0 and 1 there are an infinite number of rationals!

# Decimal Representation of Fractions

Rational numbers are simple quantities:

- They can be understood in finite terms;
- Yet they can be used to represent quantities as small or as large as we please

$$\frac{1}{3} = 0.3333333333 \dots,$$

$$\frac{29}{12} = 2.4166666666 \dots,$$

$$\frac{9}{7} = 1.\underline{285714} \underline{285714} \underline{285} \dots,$$

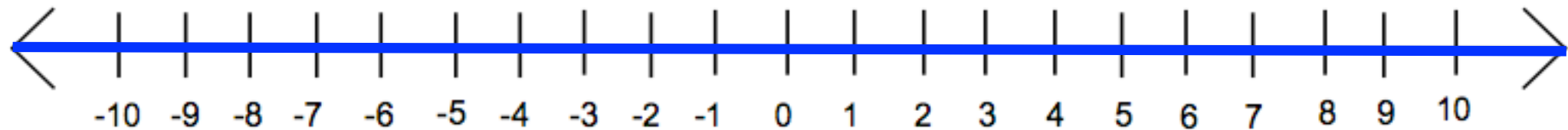
$$\frac{237}{148} = 1.60135135135 \dots$$

## Decimal Representation

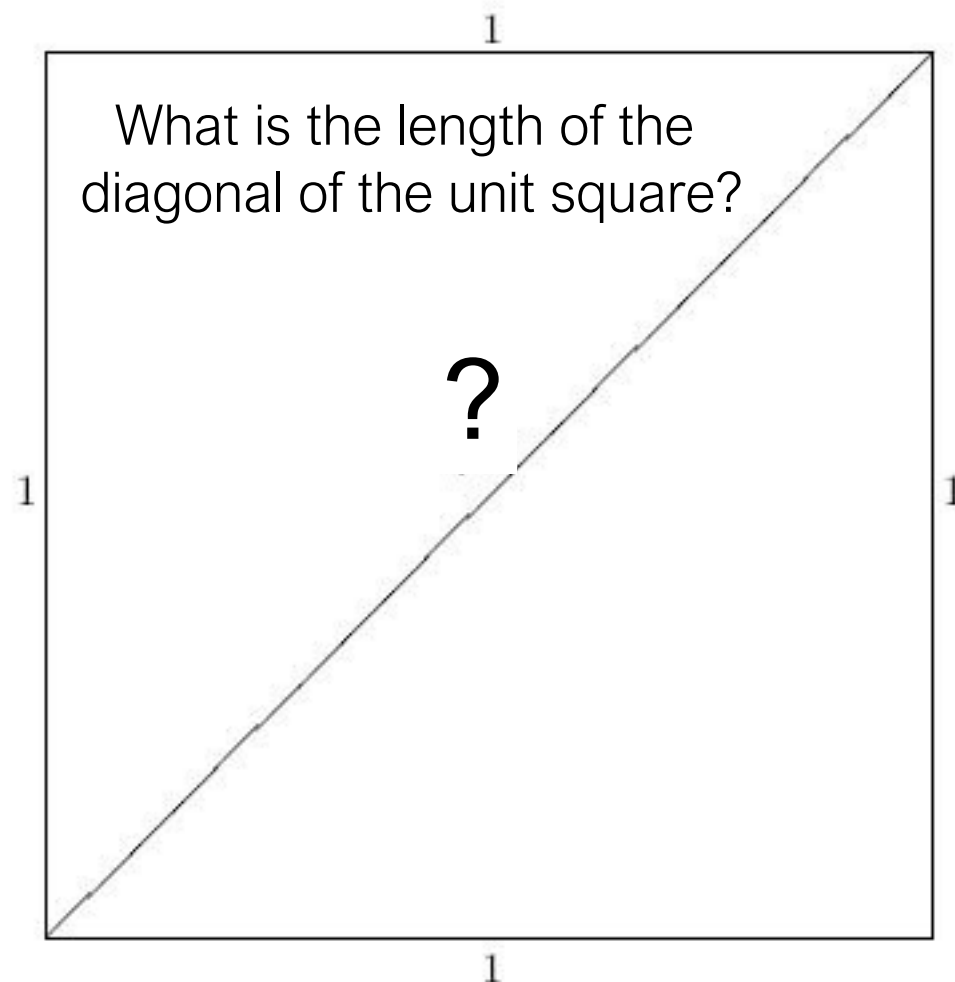
Fractions are ultimately periodic:  
after a certain point the infinite  
sequence of digits consists of some  
finite sequence of digits repeated  
indefinitely!

# Are the Rational Numbers Adequate?

$\mathbb{Q}$



Since the rationals are dense, do we need any other quantity or can we even fit anything more on the number line?



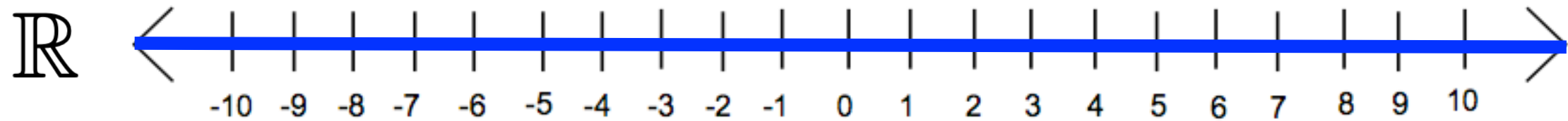
$$\begin{aligned}c^2 &= a^2 + b^2 \\&= 1^2 + 1^2 \\&= 1 + 1 = 2\end{aligned}$$

$$\begin{aligned}c^2 &= 2 \\c &= \sqrt{2}\end{aligned}$$

Can **not** be expressed as the ratio of two integers!

Not irrational →  
an irrational number!

# Real Numbers



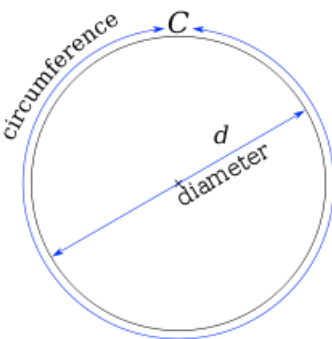
Real Numbers = Rational Numbers + Irrational Numbers

$$\sqrt{2} = 1.4142135623730950488016887 \dots$$

In decimal notation, an irrational number can not be represented as terminating or with eventually repeating decimals.

# Some Special Real Numbers

Some important irrational numbers in engineering!

$$\pi = \frac{C}{d}$$
A diagram of a circle. A blue line segment passes through the center of the circle, with arrows at both ends pointing to the top and bottom edges. This segment is labeled 'd' and 'diameter'. A blue curved arrow follows the outer edge of the circle, starting from the top and ending at the top, labeled 'C' and 'circumference'.

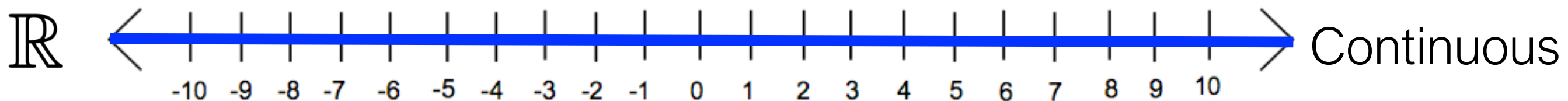
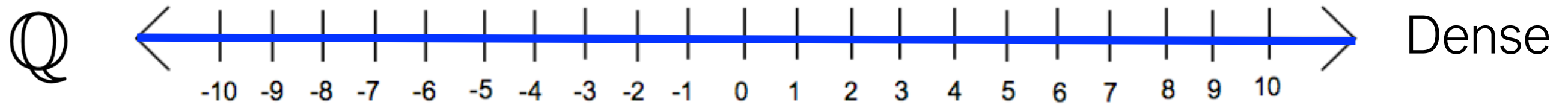
$$\pi = 3.141592653589793238462643383279 \dots$$

$$e^{\ln(x)} = x \quad \ln(e^x) = x \quad \text{Euler's number}$$

$$e = 2.7182818284590452353602874713526 \dots$$

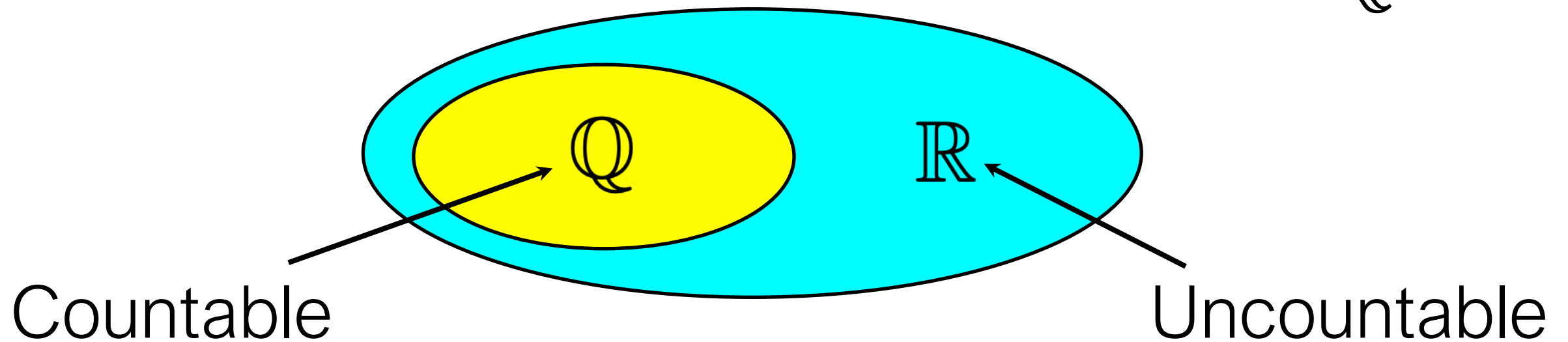
Since they are important numbers, we will want to  
represent them in a computer...  
*but can we? Let's get back to that later!*

# Countability



Are some infinite sets bigger than others?

$$\mathbb{N} \subseteq \mathbb{Q} \subset \mathbb{R}$$



# **Number Systems and Bases**

# Number Systems: Bases

The base of a system specifies the number of digits used

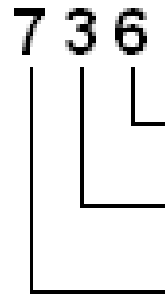
Base-10: Decimal number system: Digits 0-9

|                                     |                           |
|-------------------------------------|---------------------------|
| Base-2: Binary number system:       | Digits: 0-1               |
| Base-8: Octal number system:        | Digits: 0-7               |
| Base-16: Hexadecimal number system: | Digits: 0-9, Letters: A-F |

# Number Systems: Positional Notation

Numbers are written and manipulated using [positional notation](#).

|                                                                                               |           |
|-----------------------------------------------------------------------------------------------|-----------|
| Radix Point  |           |
| $10^3$                                                                                        | $10^2$    |
| $10^1$                                                                                        | $10^0$    |
| $10^{-1}$                                                                                     | $10^{-2}$ |
| $10^{-3}$                                                                                     |           |
| $10^3 = 10 \times 100, \text{ or } 1000$                                                      |           |
| $10^2 = 10 \times 10, \text{ or } 100$                                                        |           |
| $10^1 = 10 \times 1, \text{ or } 10$                                                          |           |
| $10^0 = 1$ ( <i>any</i> number raised to the power of 0 equals 1)                             |           |
| $10^{-1} = 1 \div 10, \text{ or } .1$                                                         |           |
| $10^{-2} = 1 \div 100, \text{ or } .01$                                                       |           |
| $10^{-3} = 1 \div 1000, \text{ or } .001$                                                     |           |


$$\begin{aligned} 6 \times 10^0 &= 6 \times 1 = 6 \\ 3 \times 10^1 &= 3 \times 10 = 30 \\ 7 \times 10^2 &= 7 \times 100 = 700 \end{aligned}$$

Each position represents a power of 10

# Positional Notation, Base 10

Decimal: Base-10:

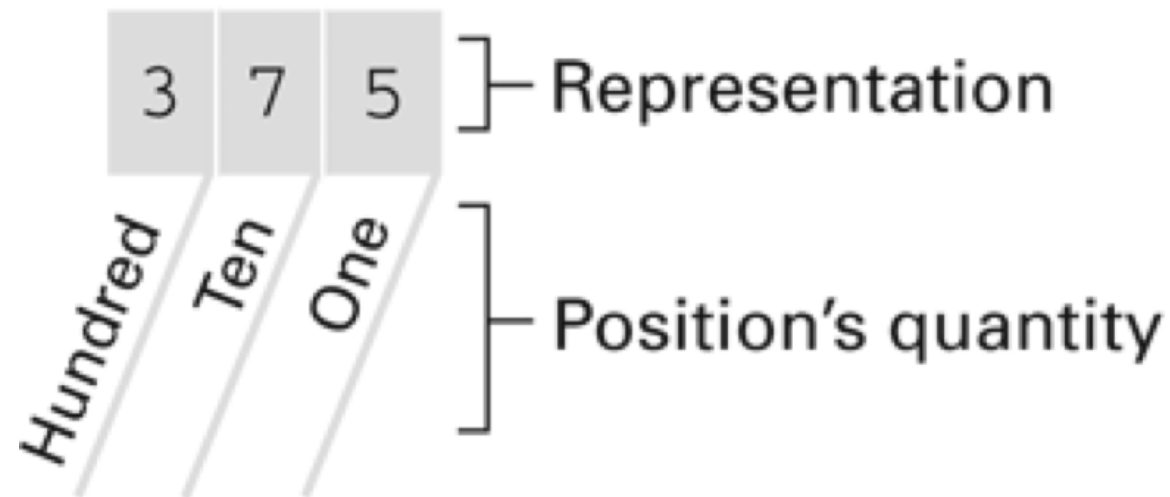
$$7365 = 7 \times 10^3 + 3 \times 10^2 + 6 \times 10^1 + 5 \times 10^0$$

$$d_n \times 10^{n-1} + d_{n-1} \times 10^{n-2} + \dots + d_2 \times 10^1 + d_1$$

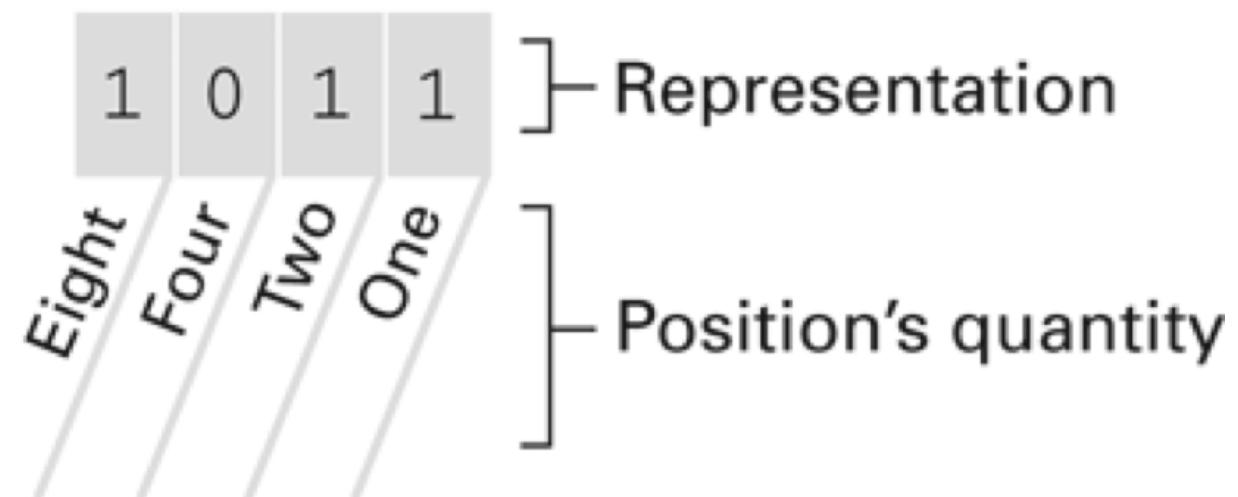
# Number Systems

## How about base 2?

### a. Base ten system



### b. Base two system



$$1101 = 1 \times 2^3 + 1 \times 2^2 + 0 \times 2^1 + 1$$

$$d_n \times 2^{n-1} + d_{n-1} \times 2^{n-2} + \dots + d_2 \times 2^1 + d_1$$

# Number Systems

How about any base?

$$d_n \times 10^{n-1} + d_{n-1} \times 10^{n-2} + \dots + d_2 \times 10^1 + d_1$$

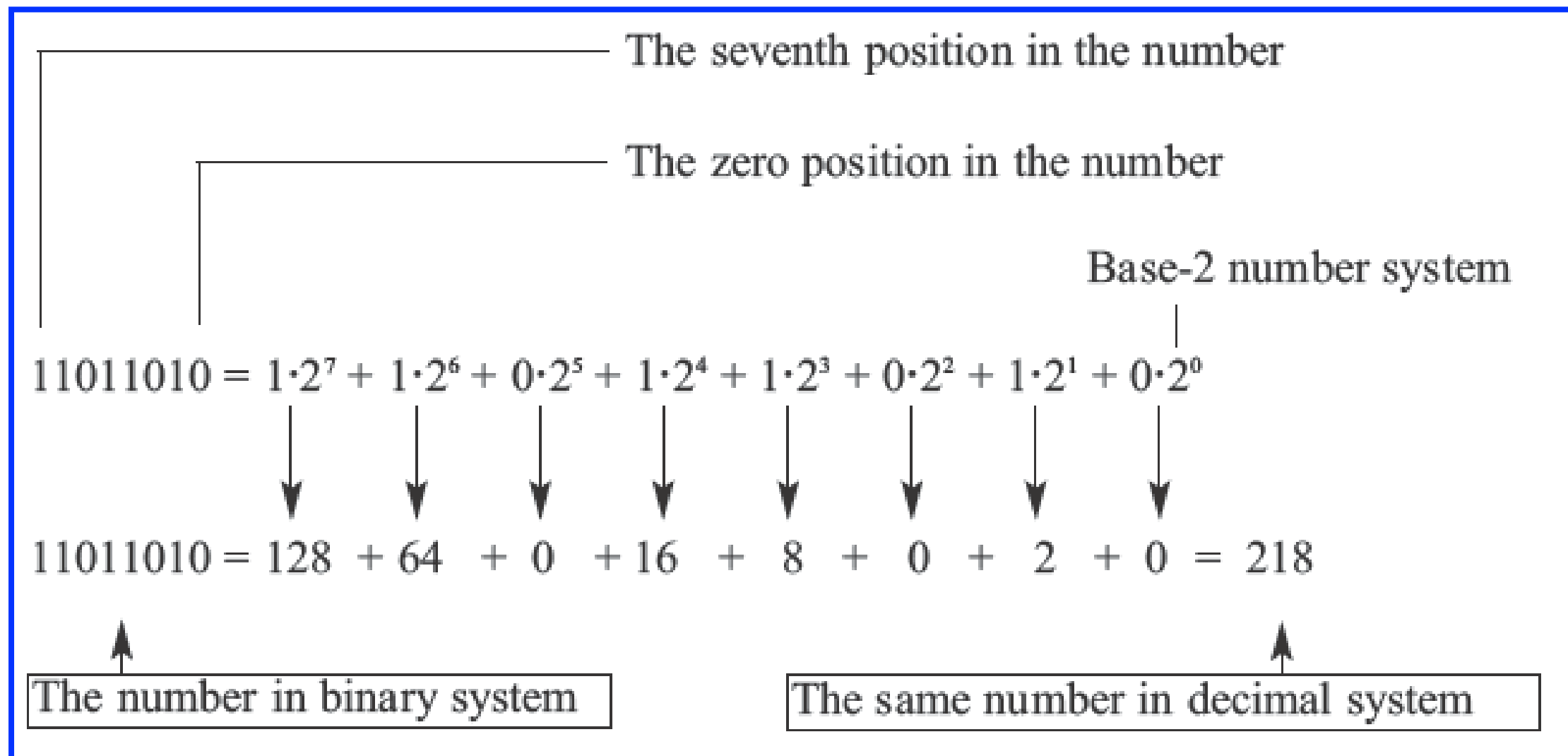
$$d_n \times 2^{n-1} + d_{n-1} \times 2^{n-2} + \dots + d_2 \times 2^1 + d_1$$

If a number in the base- $B$  number system has  $n$  digits, it is represented as the following polynomial, where  $d_i$  represents the digit in the  $i$ -th position

$$d_n \times B^{n-1} + d_{n-1} \times B^{n-2} + \dots + d_2 \times B^1 + d_1$$

# From Binary to Decimal

$$d_n \times 2^{n-1} + d_{n-1} \times 2^{n-2} + \dots + d_2 \times 2^1 + d_1$$



How about from Decimal to Binary?

# From Decimal to Binary

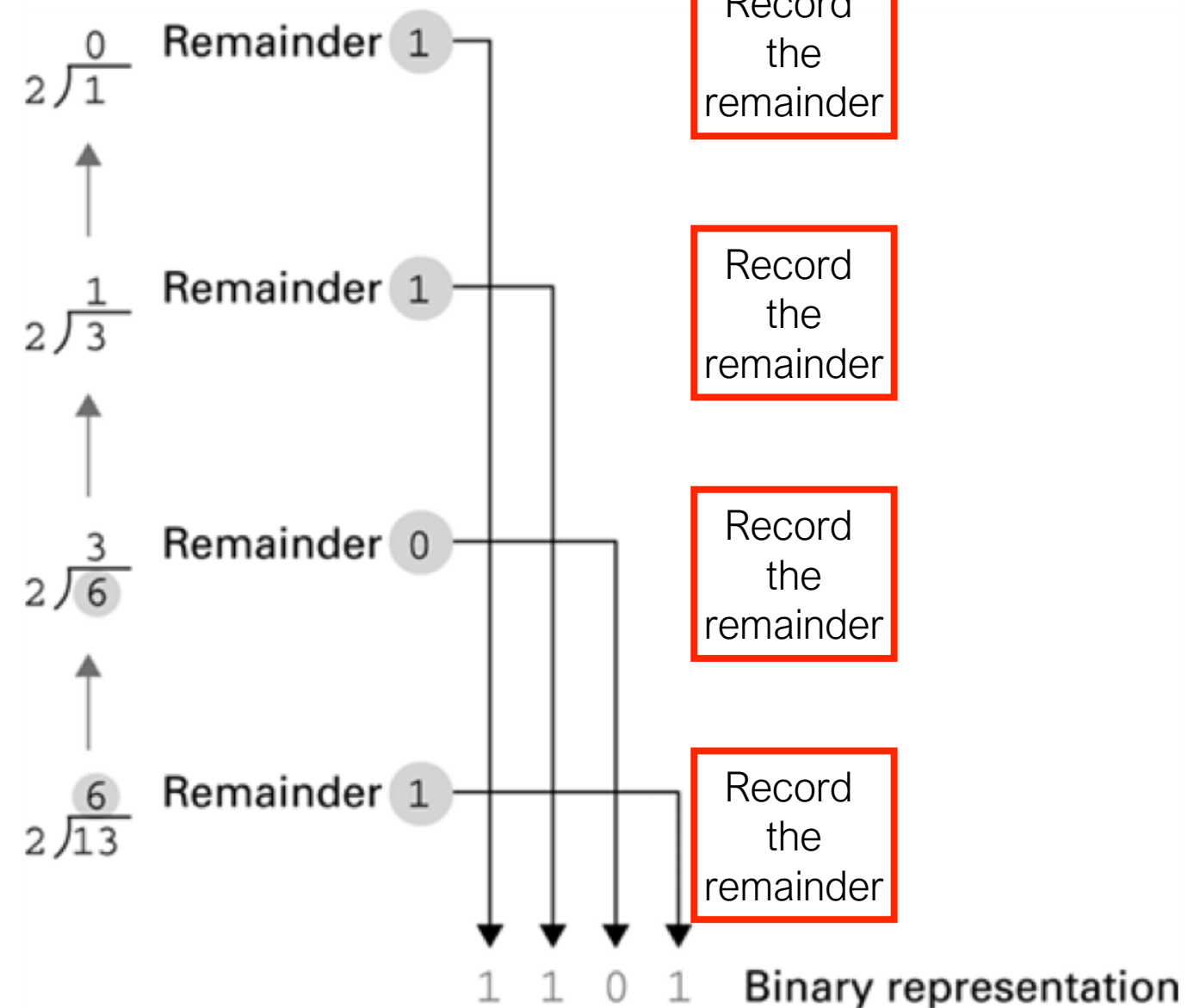
Translate 13 to binary:

Divide by 2  
quotient is 0  
**Stop**

Divide by 2  
quotient is 1  
Continue

Divide by 2  
quotient is 3  
Continue

Divide by 2  
quotient is 6  
Continue



1. Divide the value by 2 and record the remainder.
2. As long as the quotient obtained is not 0, repeat step 1
3. When the quotient of 0 has been obtained, the binary representation of the original value consists of the remainders listed from right to left in the order they were recorded.

# Hexadecimal System: Base 16

$$d_n \times 16^{n-1} + d_{n-1} \times 16^{n-2} + \dots + d_2 \times 16^1 + d_1$$

- Since there are only 10 decimal digits but the base is 16, we need additional digits: A,B,C,D,E,F
- Can be used as shorthand notation for long patterns of bits:  
Each group of 4 bits can be represented by a single symbol.
- 8 bits: 2 digits, 16 bits: 4 digits, 32 bits: 8 digits

$\overset{8}{1} \overset{+}{0} \overset{2}{0} \overset{+}{0} \overset{2}{0} \overset{+}{0} \overset{1}{1} \overset{+}{1}$   
1010 0011 becomes A3  
A 3

| Hex | Decimal | Binary |
|-----|---------|--------|
| 0   | 0       | 0000   |
| 1   | 1       | 0001   |
| 2   | 2       | 0010   |
| 3   | 3       | 0011   |
| 4   | 4       | 0100   |
| 5   | 5       | 0101   |
| 6   | 6       | 0110   |
| 7   | 7       | 0111   |
| 8   | 8       | 1000   |
| 9   | 9       | 1001   |
| A   | 10      | 1010   |
| B   | 11      | 1011   |
| C   | 12      | 1100   |
| D   | 13      | 1101   |
| E   | 14      | 1110   |
| F   | 15      | 1111   |

# Some Examples

What is 11000011 in hexadecimal notation?  
C 3

What is 11111101 in hexadecimal notation?  
F D

What is E6 in decimal notation?

$$2^7 + 2^6 + 2^5 + 2^2 + 2^1 = 230$$

1110 0110

$$E * 16^1 + 6 * 16^0 = 230$$

$$14 * 16^1 + 6 * 16^0 = 230$$

| Hex | Decimal | Binary |
|-----|---------|--------|
| 0   | 0       | 0000   |
| 1   | 1       | 0001   |
| 2   | 2       | 0010   |
| 3   | 3       | 0011   |
| 4   | 4       | 0100   |
| 5   | 5       | 0101   |
| 6   | 6       | 0110   |
| 7   | 7       | 0111   |
| 8   | 8       | 1000   |
| 9   | 9       | 1001   |
| A   | 10      | 1010   |
| B   | 11      | 1011   |
| C   | 12      | 1100   |
| D   | 13      | 1101   |
| E   | 14      | 1110   |
| F   | 15      | 1111   |

# Information Storage and Processing

Goal: To understand how all modern computing systems and computation using such systems are based on binary numbers and operations on them!

Computers execute binary computations. Any information we process is ultimately encoded and stored as binary numbers!

## Images



## Video

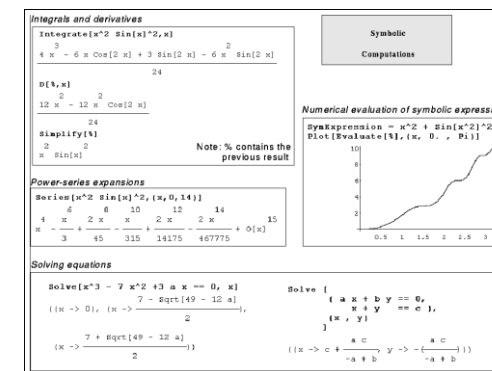


## Text

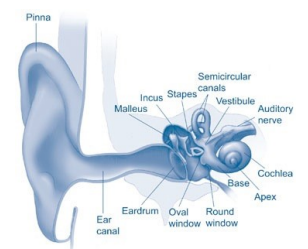
Text Text TEXT TEXT  
TEXT Text Text Text  
text Text Text Text  
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TEXT Text



## Symbols



## Sound



Any process on data is ultimately encoded and stored as binary numbers!

# BITS - Binary Digits

Information in a computer is encoded as patterns of 1's and 0's.

Information = Bits + Context

The context provides an interpretation of the bit patterns!  
The same bit pattern can mean different things.

*For instance, a numerical value, character or a program instruction!*

## Logical Computations

1 = true

0 = false

And, Or

Not

Context: Logic

## Numerical Computations

1

Addition, Subtraction

0

Multiplication, Division

Context: Numbers

# BITS and BYTES

Most computers use blocks of 8 bits, called [bytes](#), as the smallest addressable unit of memory

**Byte = 8 bits**

Binary  $00000000_2$  to  $11111111_2$

Decimal:  $0_{10}$  to  $255_{10}$

Hexadecimal  $00_{16}$  to  $FF_{16}$

| Hex | Decimal | Binary |
|-----|---------|--------|
| 0   | 0       | 0000   |
| 1   | 1       | 0001   |
| 2   | 2       | 0010   |
| 3   | 3       | 0011   |
| 4   | 4       | 0100   |
| 5   | 5       | 0101   |
| 6   | 6       | 0110   |
| 7   | 7       | 0111   |
| 8   | 8       | 1000   |
| 9   | 9       | 1001   |
| A   | 10      | 1010   |
| B   | 11      | 1011   |
| C   | 12      | 1100   |
| D   | 13      | 1101   |
| E   | 14      | 1110   |
| F   | 15      | 1111   |

# Memory Size: Using Metric Prefixes

| $1000^m$      | $10^n$     | Prefix | Symbol | Short scale   | Long scale    | Decimal                           |
|---------------|------------|--------|--------|---------------|---------------|-----------------------------------|
| $1000^8$      | $10^{24}$  | yotta- | Y      | Septillion    | Quadrillion   | 1 000 000 000 000 000 000 000 000 |
| $1000^7$      | $10^{21}$  | zetta- | Z      | Sextillion    | Trilliard     | 1 000 000 000 000 000 000 000     |
| $1000^6$      | $10^{18}$  | exa-   | E      | Quintillion   | Trillion      | 1 000 000 000 000 000 000         |
| $1000^5$      | $10^{15}$  | peta-  | P      | Quadrillion   | Billiard      | 1 000 000 000 000 000             |
| $1000^4$      | $10^{12}$  | tera-  | T      | Trillion      | Billion       | 1 000 000 000 000                 |
| $1000^3$      | $10^9$     | giga-  | G      | Billion       | Milliard      | 1 000 000 000                     |
| $1000^2$      | $10^6$     | mega-  | M      | Million       |               | 1 000 000                         |
| $1000^1$      | $10^3$     | kilo-  | k      | Thousand      |               | 1 000                             |
| $1000^{2/3}$  | $10^2$     | hecto- | h      | Hundred       |               | 100                               |
| $1000^{1/3}$  | $10^1$     | deca-  | da     | Ten           |               | 10                                |
| $1000^0$      | $10^0$     | (none) | (none) | One           |               | 1                                 |
| $1000^{-1/3}$ | $10^{-1}$  | deci-  | d      | Tenth         |               | 0.1                               |
| $1000^{-2/3}$ | $10^{-2}$  | centi- | c      | Hundredth     |               | 0.01                              |
| $1000^{-1}$   | $10^{-3}$  | milli- | m      | Thousandth    |               | 0.001                             |
| $1000^{-2}$   | $10^{-6}$  | micro- | $\mu$  | Millionth     |               | 0.000 001                         |
| $1000^{-3}$   | $10^{-9}$  | nano-  | n      | Billionth     | Milliardth    | 0.000 000 001                     |
| $1000^{-4}$   | $10^{-12}$ | pico-  | p      | Trillionth    | Billionth     | 0.000 000 000 001                 |
| $1000^{-5}$   | $10^{-15}$ | femto- | f      | Quadrillionth | Billiardth    | 0.000 000 000 000 001             |
| $1000^{-6}$   | $10^{-18}$ | atto-  | a      | Quintillionth | Trillionth    | 0.000 000 000 000 000 001         |
| $1000^{-7}$   | $10^{-21}$ | zepto- | z      | Sextillionth  | Trilliardth   | 0.000 000 000 000 000 000 001     |
| $1000^{-8}$   | $10^{-24}$ | yocto- | y      | Septillionth  | Quadrillionth | 0.000 000 000 000 000 000 000 001 |

What is a Googol?

$$10^{100}$$

What is a current estimate of atoms in the “observable” universe?

$$10^{80}$$

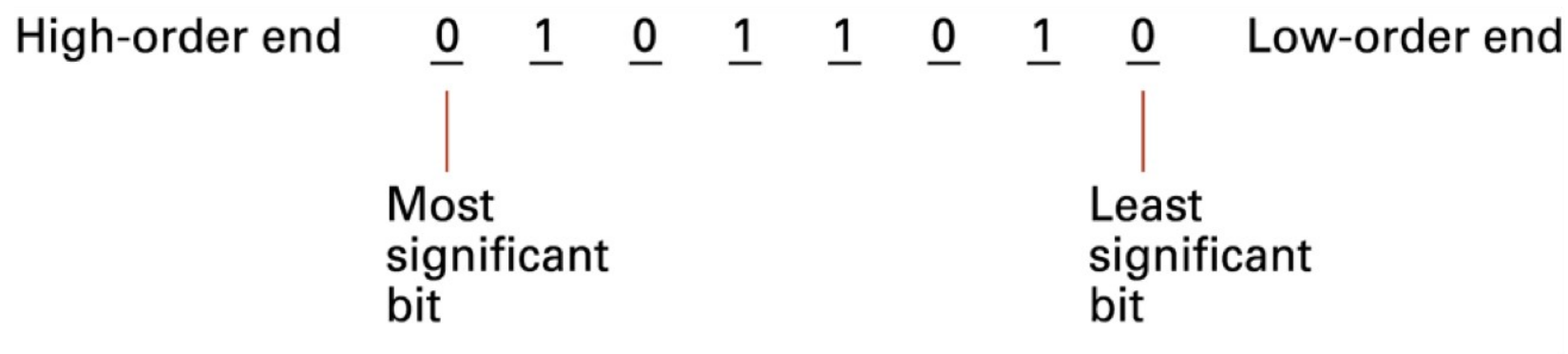
# Bytes and Words

A Machine has “Word Size”

- Nominal size of integer data
- For a time, 16-bit words (2 bytes) were common
  - Numbers: 0 to 65535 (if positive)
  - Want to add larger numbers? Do multiple additions...
- Then for a long time, 32-bit words (4 bytes) were common
  - Hardware instructions processed 8, 16 or at most 32 bits at a time
- Most current machines, including phones, use 64-bit words (8 bytes)
  - Still support 8, 16, 32 bits; now also 64-bit numbers
- (And there are can be special instructions handling larger numbers; not covered here!)

# Storage: Main Memory

**Memory Cell:** is a unit of memory (usually a byte), organized in a bit order:



**Address:** A number that uniquely identifies one cell in the computer's main memory

- Simple case: These numbers are assigned consecutively starting at zero.
- Associates an order with the memory cells

Byte Oriented  
Memory Organization

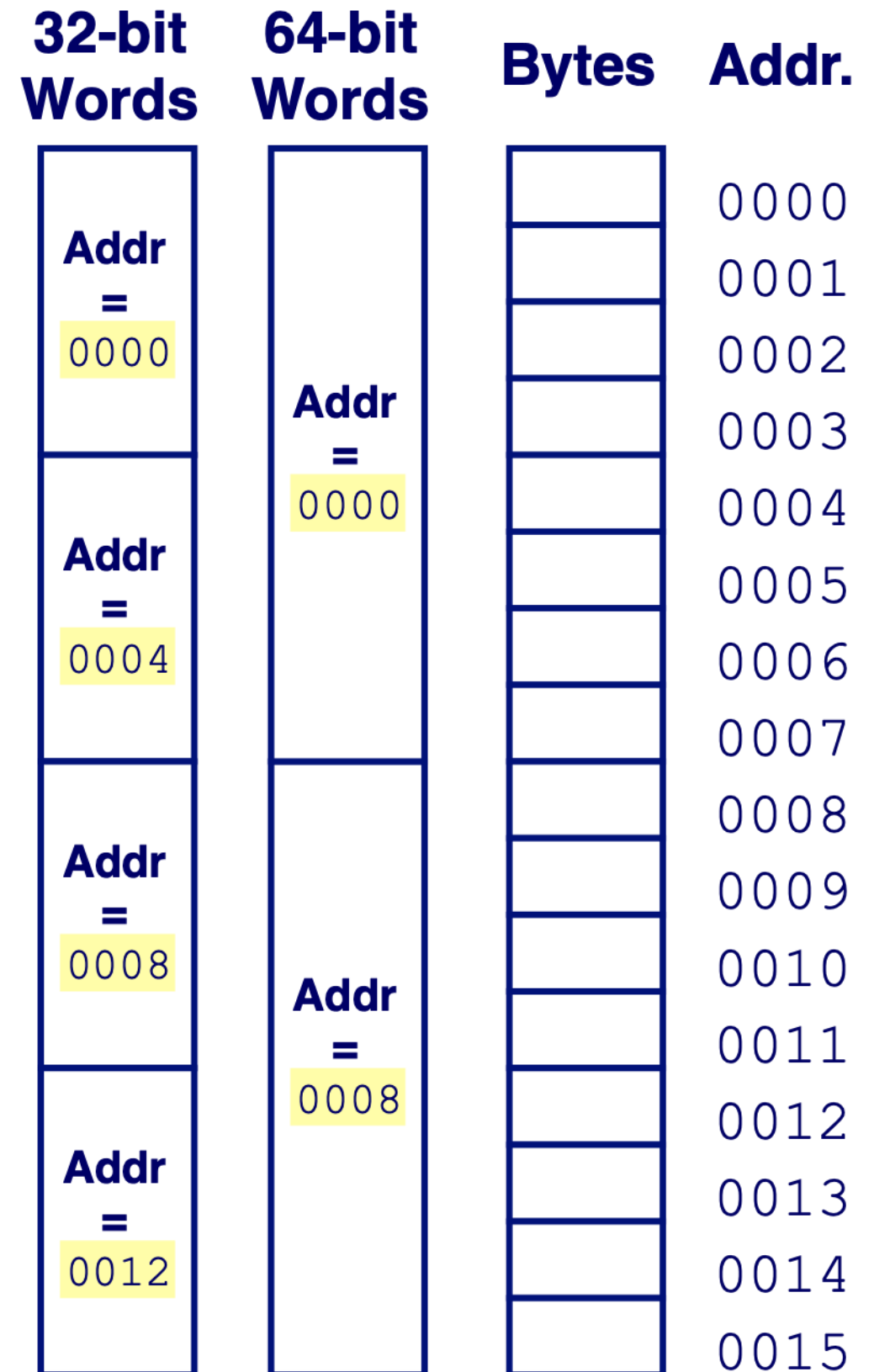


(Virtual Memory: Programs refer to virtual addresses – not covered here)

# Word Oriented Memory Organisation

## ■ Addresses Specify Byte Locations

- Address of first byte in word
- Addresses of successive words differ by 4 (32-bit) or 8 (64-bit)



# Measuring Memory Capacity

- **Kilobyte:**  $2^{10}$  bytes = 1024 bytes
  - Example: 3 KB = 3 times 1024 bytes
- **Megabyte:**  $2^{20}$  bytes = 1,048,576 bytes
  - Example: 3 MB = 3 times 1,048,576 bytes
- **Gigabyte:**  $2^{30}$  bytes = 1,073,741,824 bytes
  - Example: 3 GB = 3 times 1,073,741,824 bytes

Or: Kibibyte, Mebibyte, Gibibyte:  
Indicate that it's a "binary prefix" (bi),  
not a power of 1000

# Representing Unsigned Integers in Computers

Unsigned Integers: Not negative, no +/– sign

$w = \# \text{ of bits}$

$$\underset{\text{BinaryToUnsigned}}{B2U(X)} = \sum_{i=0}^{w-1} x_i \cdot 2^i$$

Numeric Range

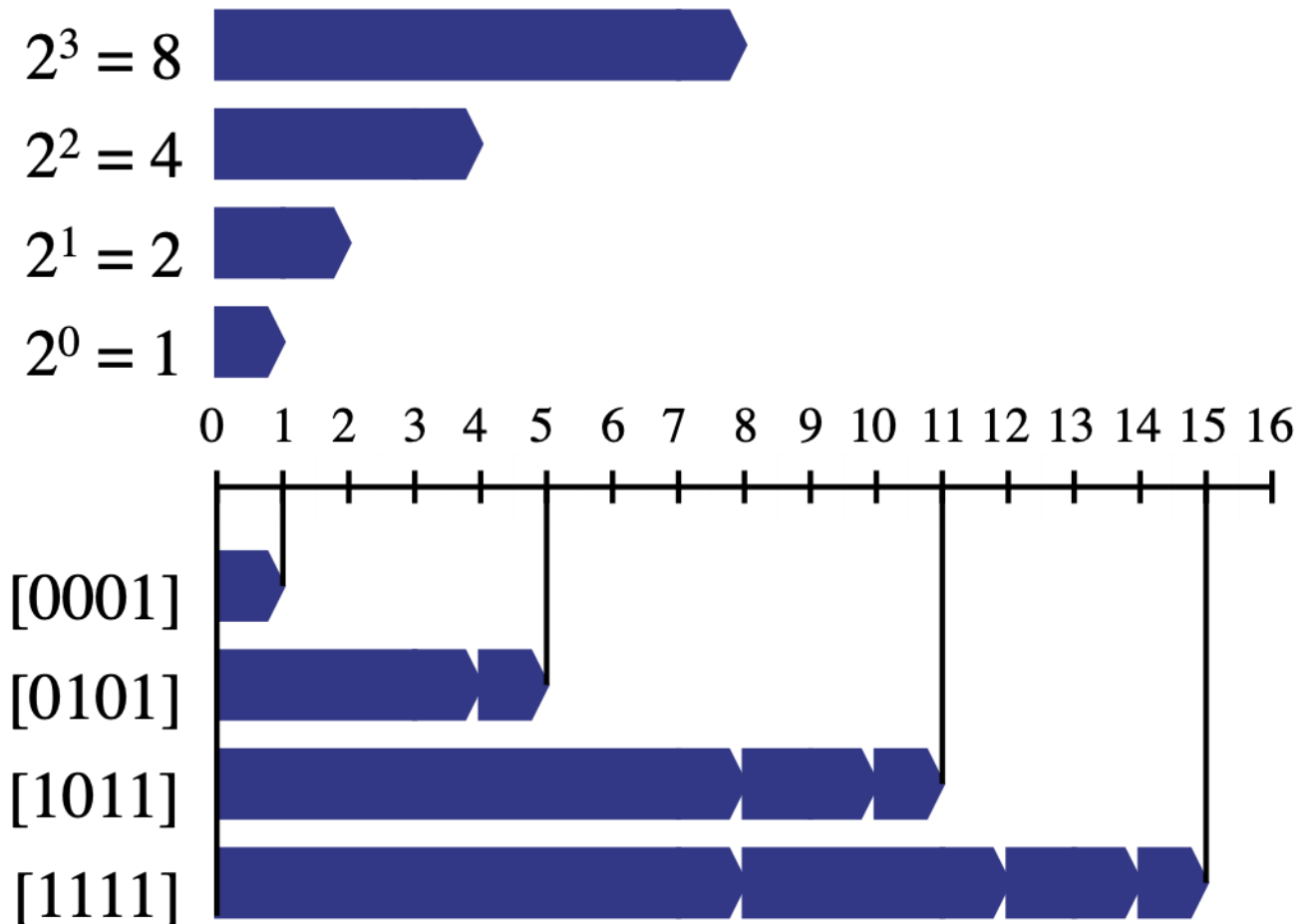
UMin = 0

000...0

UMax =  $2^w - 1$

111...1

$w=4$



$$B2U(0001) = 0 \times 2^3 + 0 \times 2^2 + 0 \times 2^1 + 1 = 0 + 0 + 0 + 1 = 1$$

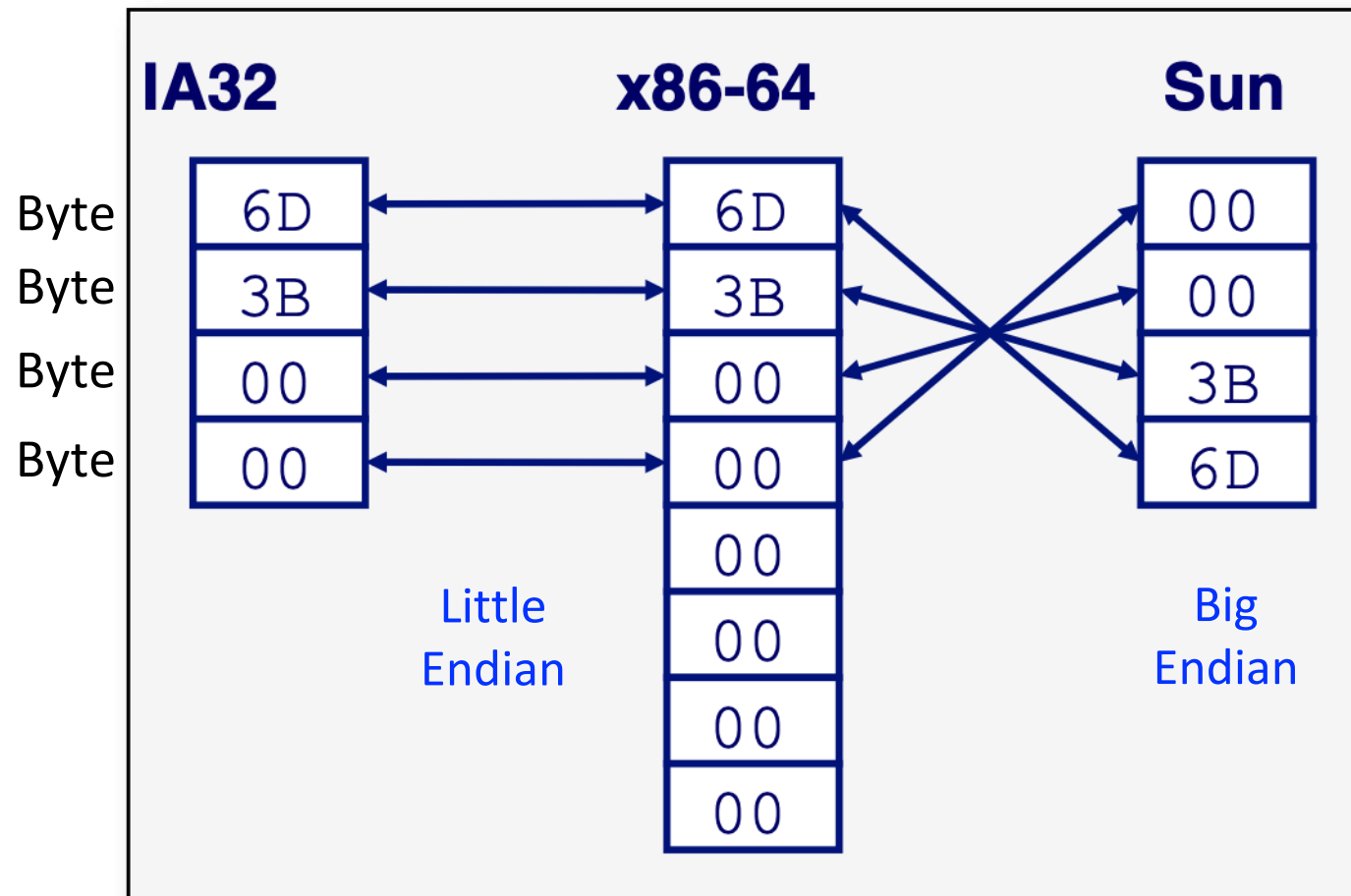
$$B2U(0101) = 0 \times 2^3 + 1 \times 2^2 + 0 \times 2^1 + 1 = 0 + 4 + 0 + 1 = 5$$

$$B2U(1011) = 1 \times 2^3 + 0 \times 2^2 + 1 \times 2^1 + 1 = 8 + 0 + 2 + 1 = 11$$

$$B2U(1111) = 1 \times 2^3 + 1 \times 2^2 + 1 \times 2^1 + 1 = 8 + 4 + 2 + 1 = 15$$

# Representing Unsigned Integers in various Machine Memory

long int C = 15213;

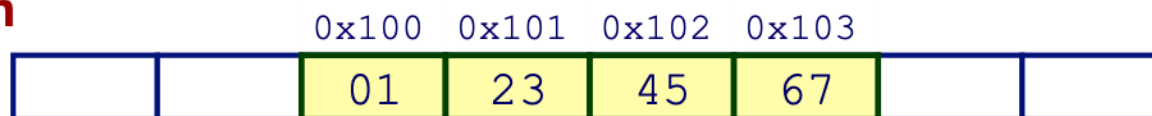


**Decimal:** 15213

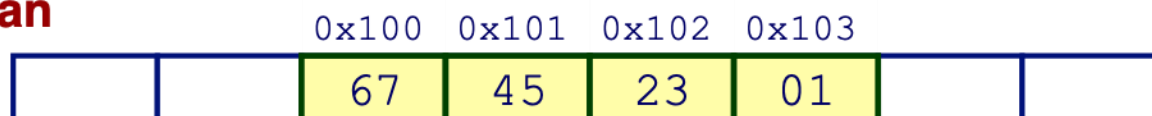
**Binary:** 0011 1011 0110 1101

**Hex:** 3 B 6 D

## Big Endian



## Little Endian



## ■ Big Endian

- Least significant byte has highest address

## ■ Little Endian

- Least significant byte has lowest address

## ■ Example

- Variable x has 4-byte representation 0x01234567

# Representing *Signed* Integers in Computers

| X    |    |
|------|----|
| 0000 | 0  |
| 0001 | 1  |
| 0010 | 2  |
| 0011 | 3  |
| 0100 | 4  |
| 0101 | 5  |
| 0110 | 6  |
| 0111 | 7  |
| 1000 | 8  |
| 1001 | 9  |
| 1010 | 10 |
| 1011 | 11 |
| 1100 | 12 |
| 1101 | 13 |
| 1110 | 14 |
| 1111 | 15 |

Given 4 bits of memory, we can represent  $2^4$  unsigned numbers  
( $2^4 - 1$  if 0 is included)

Suppose we wanted to represent both positive and negative numbers in memory..... Signed numbers

We would need to find an efficient mapping between our binary numbers and roughly  $2^4/2$  positive numbers and  $2^4/2$  negative numbers

Let's do that!

# How about a "sign bit"?

Could we use one bit to represent + or –  
and the rest to represent the actual number?

Yes, and sometimes we do!

4 bits would allow us to represent +0 to +7,  
and –0 to –7...

Might be a bit confusing to allow "negative zero"!

# More common: Two's Complement

- Two's complement: First bit represents  $-2^{w-1}$ , not  $2^{w-1}$
- Binary 1010:  
 $-8 + 0 + 2 + 0 = -6$
- **To convert -6 to binary using two's complement:**
- Start with the positive: 6
- Represent it in binary: 0110 (4 + 2)
- Flip the bits: 1001
- Add 1: 1010...
- This is the internal representation of -6
- Note: First bit is set, indicating a negative number!

# More common: Two's Complement

- What happens with zero?
- Represent it in binary: 0000
- Flip the bits: 1111
- Add 1: Result is 10000,  
but we only work with 4 bits: 0000 (bit 5 disappears)
- So minus zero is zero

# Another method, instead of adding 1

Two's complement notation for 6 using four bits

0 1 1 0

Start with the binary representation of 6

Copy the bits from right to left until a 1 has been copied

Complement the remaining bits

Two's complement notation for -6 using four bits

1 0 1 0

# Two's Complement Examples

a. Using patterns of length three

| Bit pattern | Value represented |
|-------------|-------------------|
| 011         | 3                 |
| 010         | 2                 |
| 001         | 1                 |
| 000         | 0                 |
| 111         | -1                |
| 110         | -2                |
| 101         | -3                |
| 100         | -4                |

b. Using patterns of length four

| Bit pattern | Value represented |
|-------------|-------------------|
| 0111        | 7                 |
| 0110        | 6                 |
| 0101        | 5                 |
| 0100        | 4                 |
| 0011        | 3                 |
| 0010        | 2                 |
| 0001        | 1                 |
| 0000        | 0                 |
| 1111        | -1                |
| 1110        | -2                |
| 1101        | -3                |
| 1100        | -4                |
| 1011        | -5                |
| 1010        | -6                |
| 1001        | -7                |
| 1000        | -8                |

Comparison with Unsigned

| $X$  | $B2U(X)$ | $B2T(X)$ |
|------|----------|----------|
| 0000 | 0        | 0        |
| 0001 | 1        | 1        |
| 0010 | 2        | 2        |
| 0011 | 3        | 3        |
| 0100 | 4        | 4        |
| 0101 | 5        | 5        |
| 0110 | 6        | 6        |
| 0111 | 7        | 7        |
| 1000 | 8        | -8       |
| 1001 | 9        | -7       |
| 1010 | 10       | -6       |
| 1011 | 11       | -5       |
| 1100 | 12       | -4       |
| 1101 | 13       | -3       |
| 1110 | 14       | -2       |
| 1111 | 15       | -1       |

# Addition & Subtraction converted to Two's Complement

## The Payoff!

| Problem in base ten                                 |   | Problem in two's complement                                  |   | Answer in base ten |
|-----------------------------------------------------|---|--------------------------------------------------------------|---|--------------------|
| $\begin{array}{r} 3 \\ + 2 \\ \hline \end{array}$   | → | $\begin{array}{r} 0011 \\ + 0010 \\ \hline 0101 \end{array}$ | → | 5                  |
| $\begin{array}{r} -3 \\ + -2 \\ \hline \end{array}$ | → | $\begin{array}{r} 1101 \\ + 1110 \\ \hline 1011 \end{array}$ | → | -5                 |
| $\begin{array}{r} 7 \\ + -5 \\ \hline \end{array}$  | → | $\begin{array}{r} 0111 \\ + 1011 \\ \hline 0010 \end{array}$ | → | 2                  |

Example: 7 - 5

### For addition:

- Same algorithm as for binary addition.
- any extra carry bit generated on the left is truncated.
- addition of any combination of signed integers uses the same algorithm and circuitry!

### For subtraction:

- negate the number subtracted and then add both together.
- subtraction of any combination of signed integers uses the same algorithm and circuitry for addition plus an additional circuit for negation of an integer!

# Representing Signed Integers in Computers

## Two's Complement Decoding

$$B2T(X) = -x_{w-1} \cdot 2^{w-1} + \sum_{i=0}^{w-2} x_i \cdot 2^i$$

$\uparrow$   
 Sign Bit

1 = negative Int  
 0 = positive Int

## Numeric Range

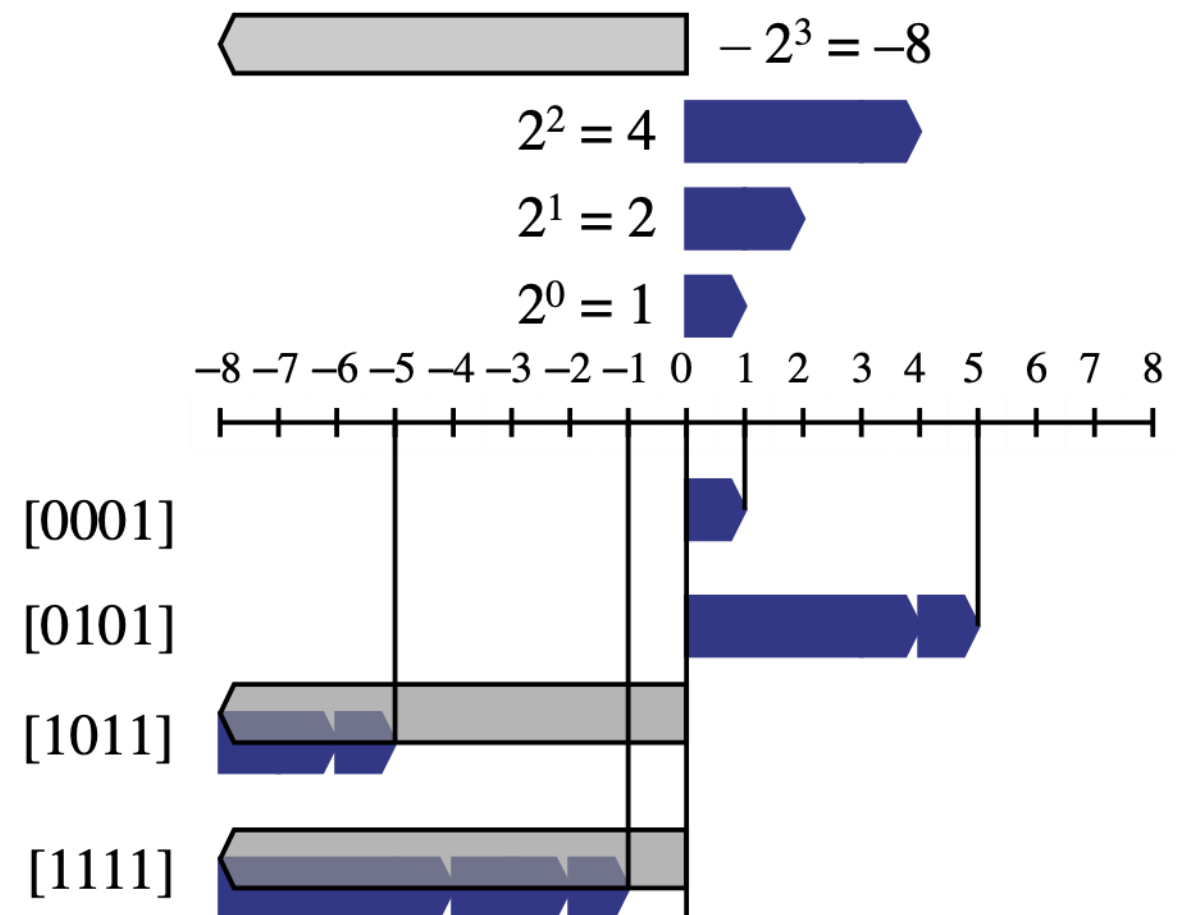
$$TMin = -2^{w-1}$$

100...0

$$TMax = 2^{w-1} - 1 \quad \text{Half of } 2^w - 1$$

011...1

$w=4$



$$B2T(0001) = -0 \times 2^3 + 0 \times 2^2 + 0 \times 2^1 + 1 = 0 + 0 + 0 + 1 = 1$$

$$B2T(0101) = 0 \times 2^3 + 1 \times 2^2 + 0 \times 2^1 + 1 = 0 + 4 + 0 + 1 = 5$$

$$B2T(1011) = -1 \times 2^3 + 0 \times 2^2 + 1 \times 2^1 + 1 = -8 + 0 + 2 + 1 = -5$$

$$B2T(1111) = -1 \times 2^3 + 1 \times 2^2 + 1 \times 2^1 + 1 = -8 + 4 + 2 + 1 = -1$$

# Representing Signed Integers in various Machine Memory

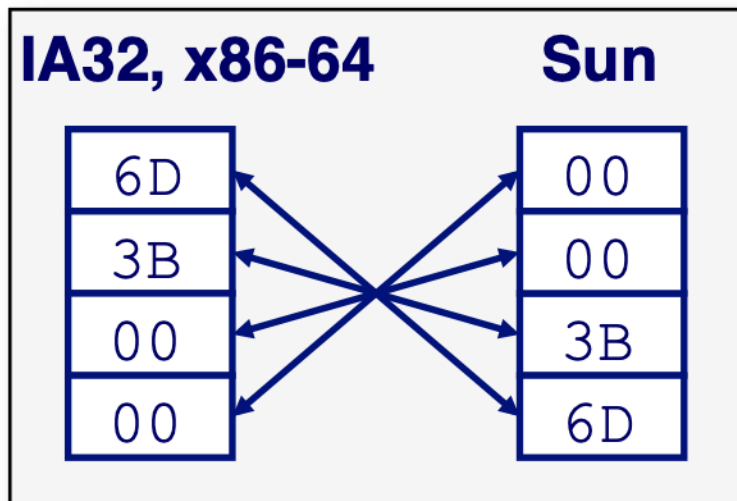
int A = 15213;

**Decimal:** 15213

**Binary:** 0011 1011 0110 1101

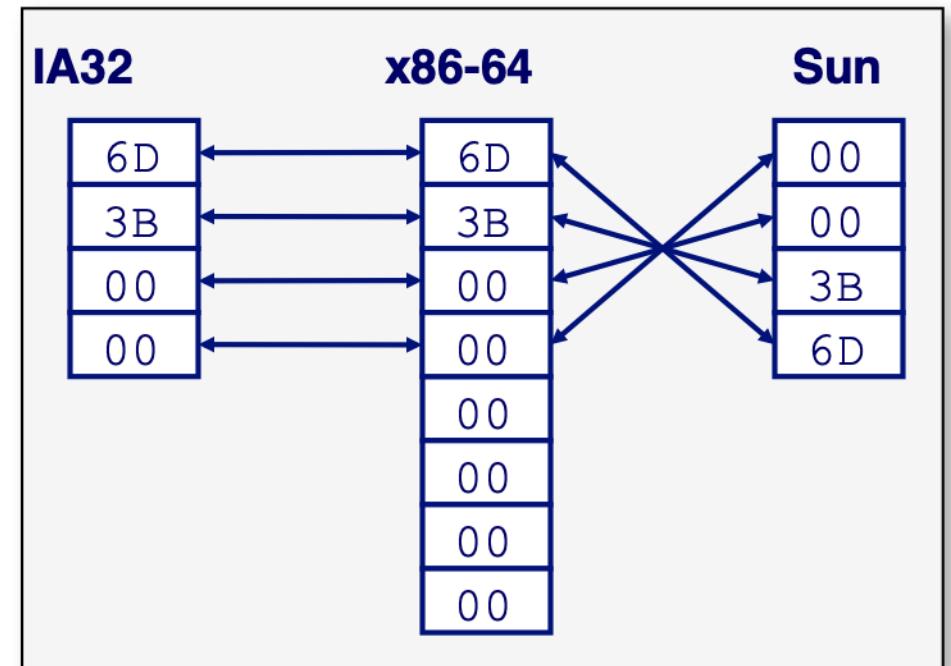
**Hex:** 3 B 6 D

Little  
Endian

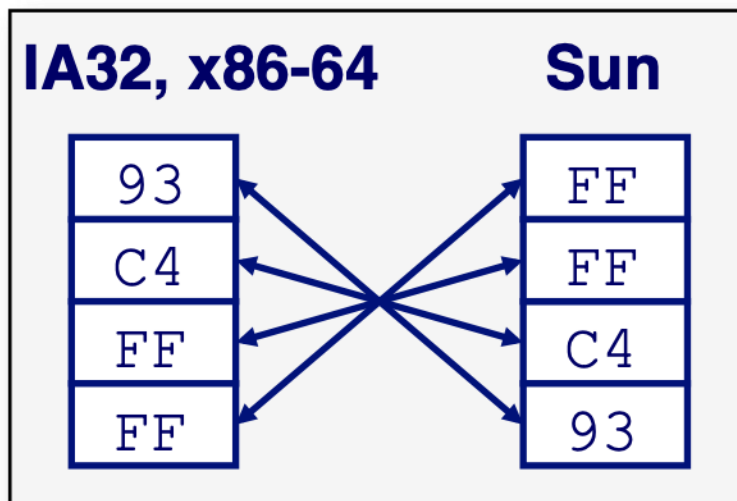


Big  
Endian

long int C = 15213;



int B = -15213;



Two's Complement  
Representation

**Decimal:** -15213

**Binary:** 1111 1111 1111 1111 1100 0100 1001 0011

**Hex:** F F F F C 4 9 3

# Numeric Ranges of Integer Representations

## Unsigned Values

$$UMin = 0$$

000...0

$$UMax = 2^w - 1$$

111...1

## Two's Complement Values

$$TMin = -2^{w-1}$$

100...0

$$TMax = 2^{w-1} - 1$$

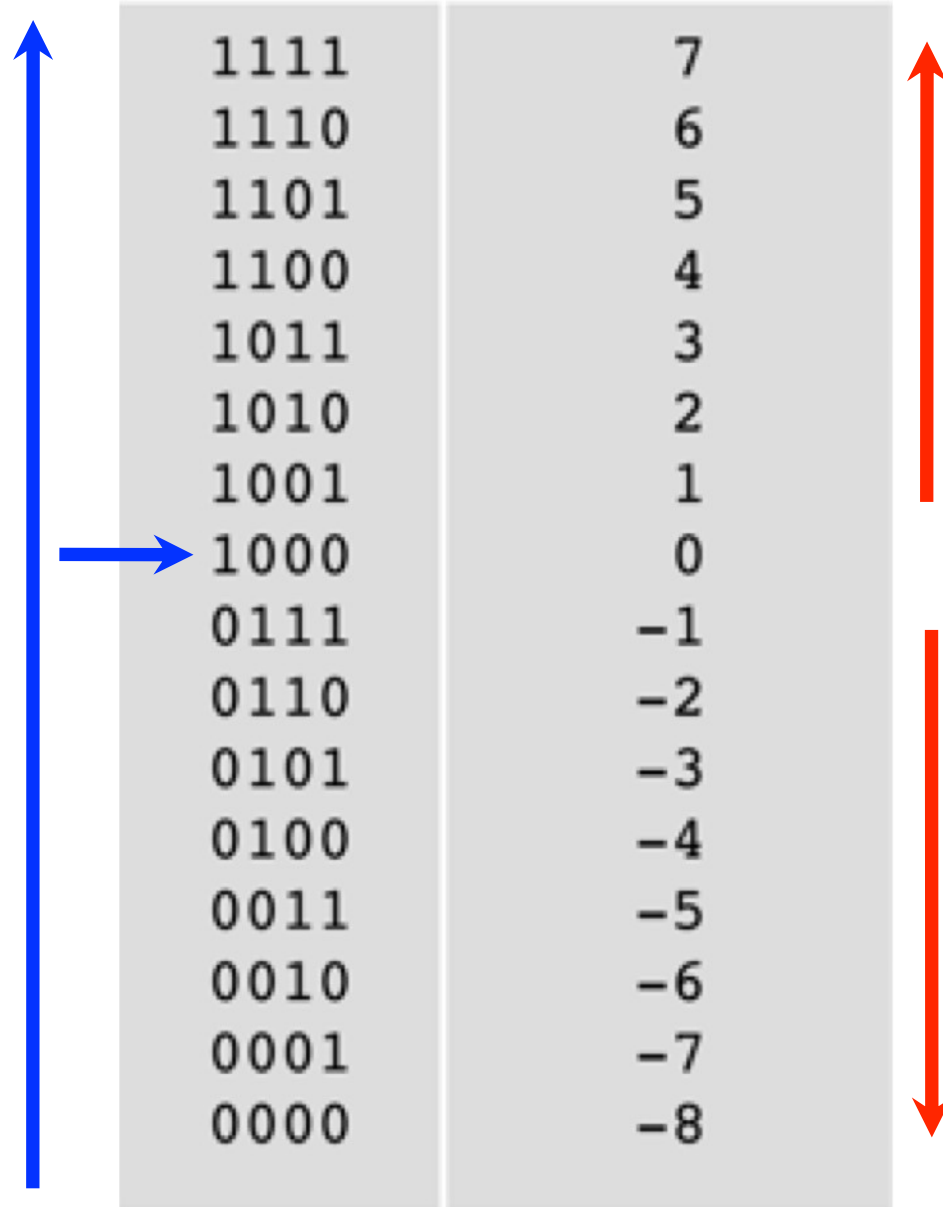
011...1

Half

For Different Word Sizes

|        | W    |         |                |                            |
|--------|------|---------|----------------|----------------------------|
| [Bits] | 8    | 16      | 32             | 64                         |
| UMax   | 255  | 65,535  | 4,294,967,295  | 18,446,744,073,709,551,615 |
| TMax   | 127  | 32,767  | 2,147,483,647  | 9,223,372,036,854,775,807  |
| TMin   | -128 | -32,768 | -2,147,483,648 | -9,223,372,036,854,775,808 |

# Signed Integers in Excess Notation (unusual!)



| Bit pattern | Value represented |
|-------------|-------------------|
| 1111        | 7                 |
| 1110        | 6                 |
| 1101        | 5                 |
| 1100        | 4                 |
| 1011        | 3                 |
| 1010        | 2                 |
| 1001        | 1                 |
| 1000        | 0                 |
| 0111        | -1                |
| 0110        | -2                |
| 0101        | -3                |
| 0100        | -4                |
| 0011        | -5                |
| 0010        | -6                |
| 0001        | -7                |
| 0000        | -8                |

4

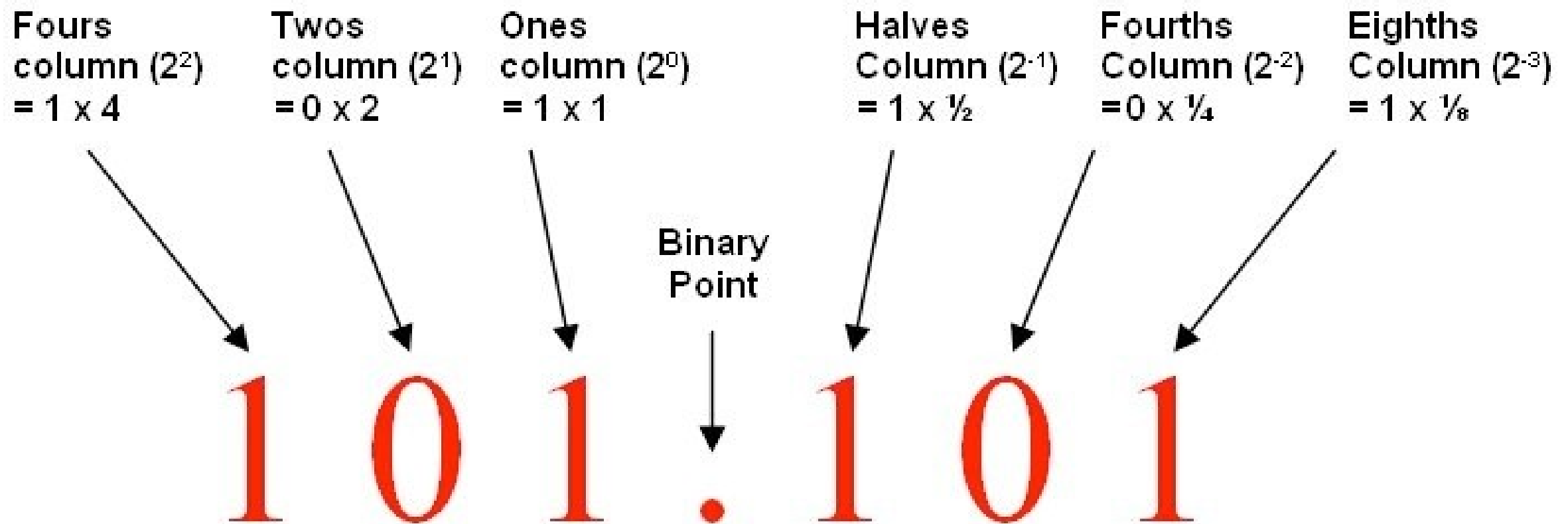
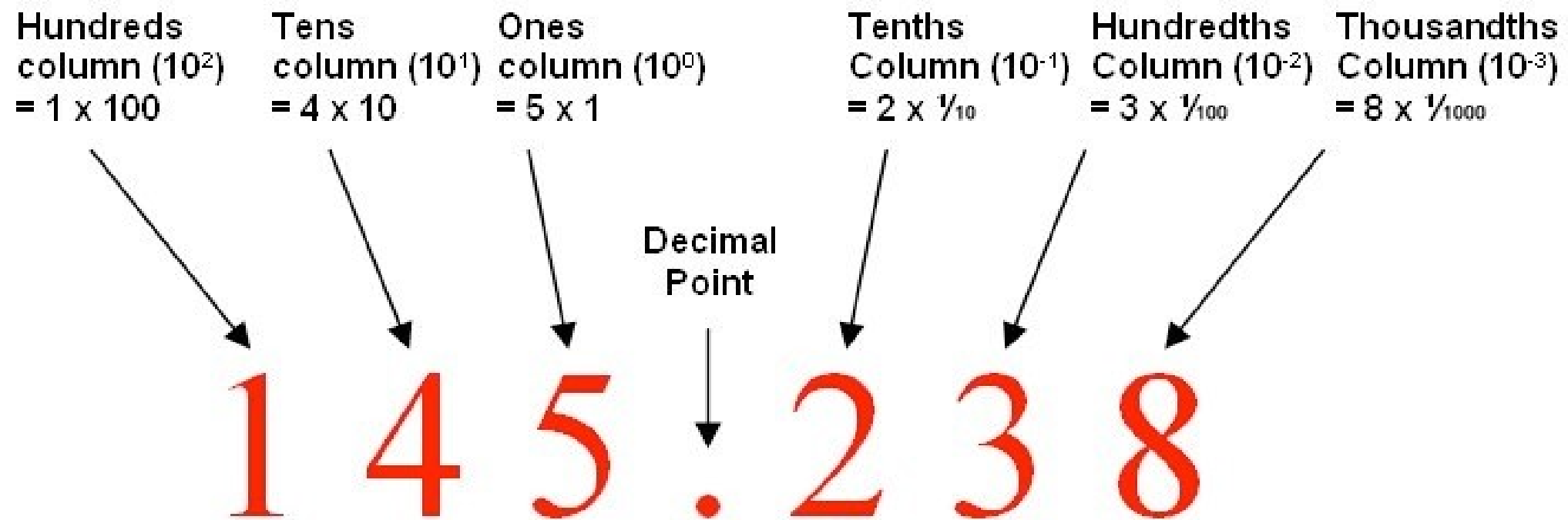
- Select pattern length to be used
- Write down all different patterns in the order they would appear if counting from bottom up.
- Pick the 1st pattern with 1 as most significant bit to represent 0
- Patterns preceding 0 are used for -1, -2, -3 ...
- Patterns proceeding 0 are used for 1, 2, 3, ...

If the pattern length is  $x$ , the difference between the bit pattern value and the value represented is  $2^{x-1}$

$x=4$ , excess-8 notation,  $x=5$ , excess-16 notation

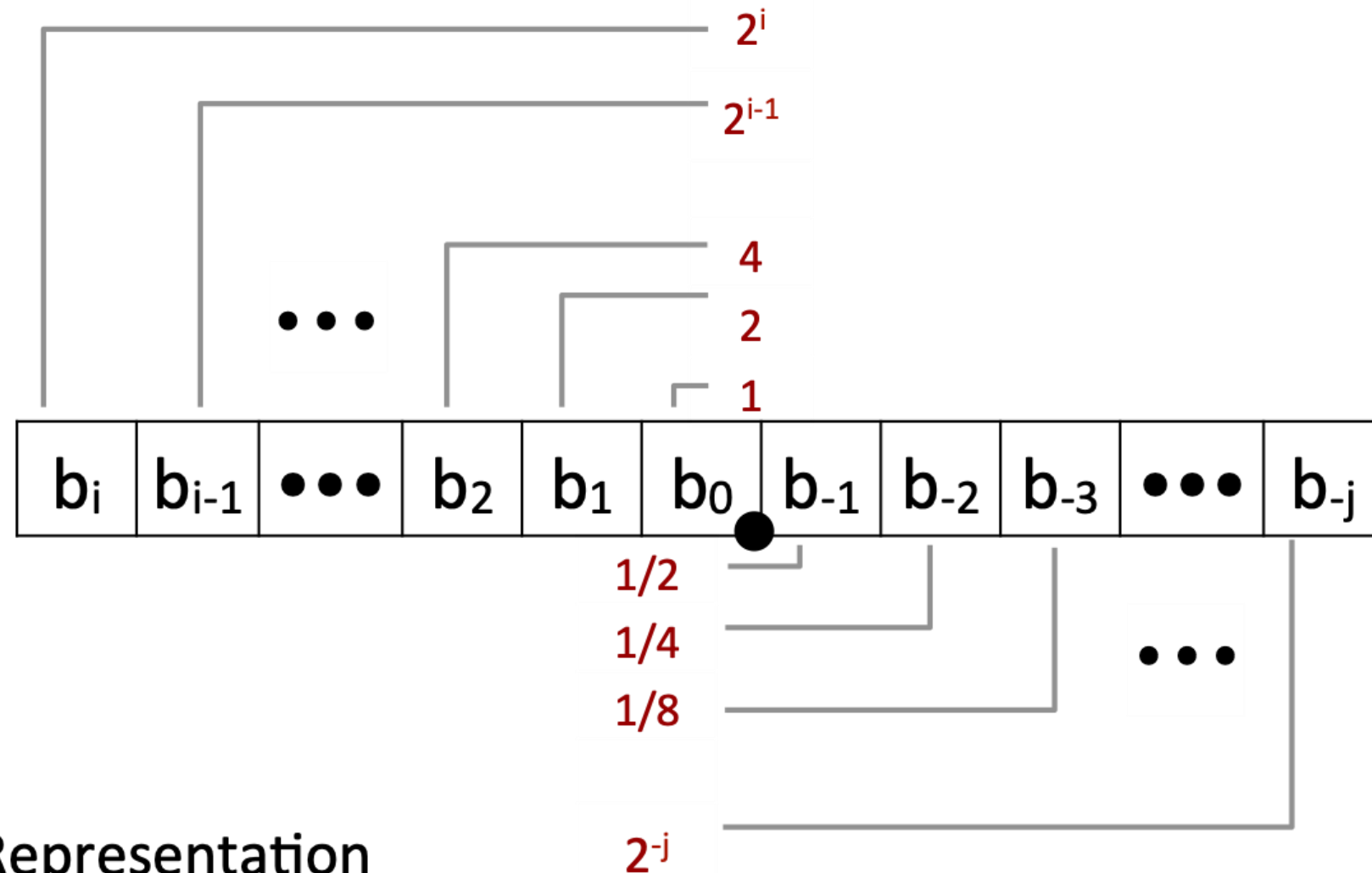
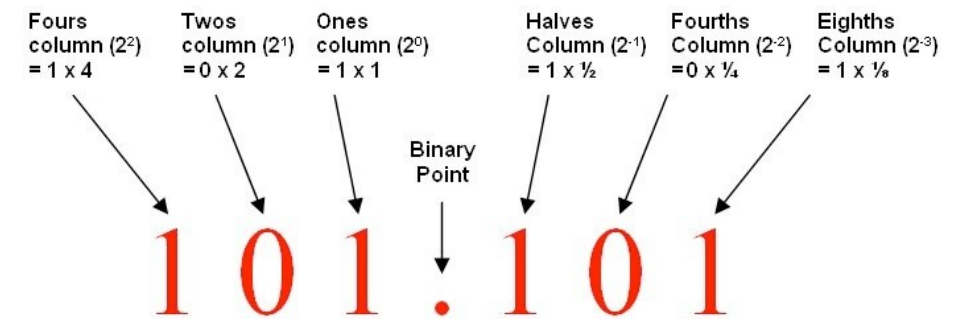
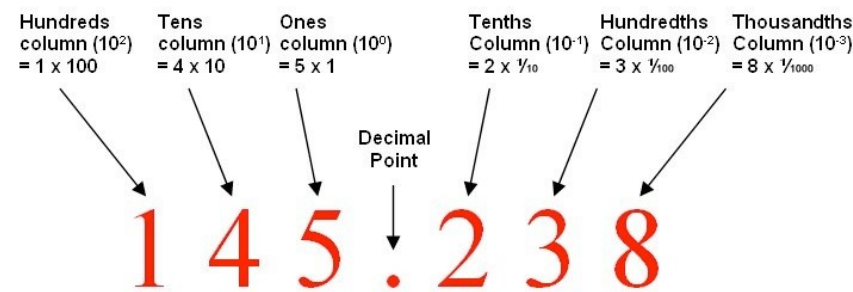
$$\begin{array}{ccccc} 1111 & = & 15 & : & 15 - 7 = 8 = 2^3 \\ \text{Bit pattern} & & & & \text{Value Represented} \end{array}$$

# Representing Fractions (Rational Numbers)



Radix Point

# Representing Fractions (Rational Numbers)



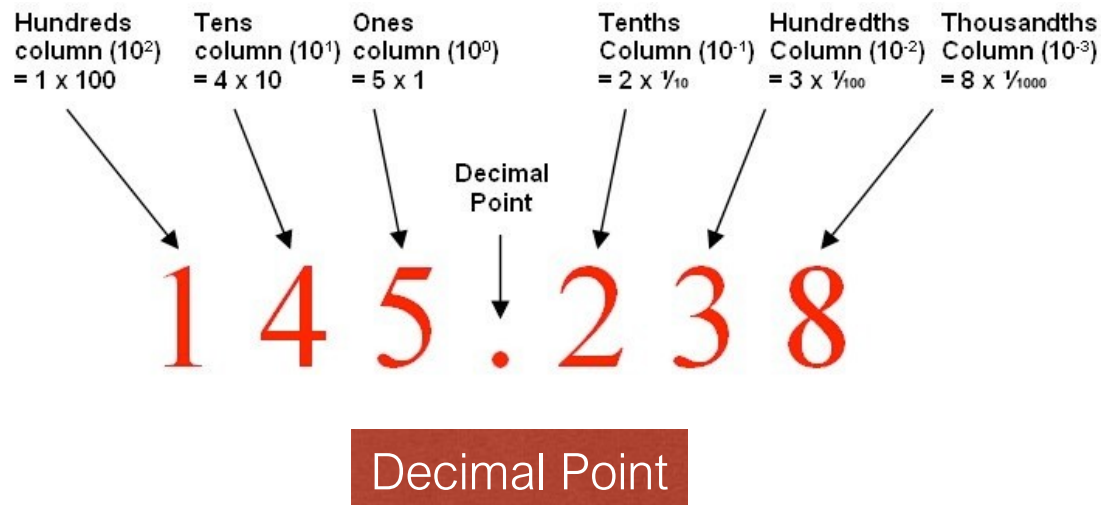
## ■ Representation

- Bits to right of “binary point” represent fractional powers of 2
- Represents rational number:

$$\sum_{k=-j}^i b_k \times 2^k$$

# Division & Multiplication

## Base-10



Shifting the decimal point 1 position to the [left](#) has the effect of [dividing](#) the number by 10.

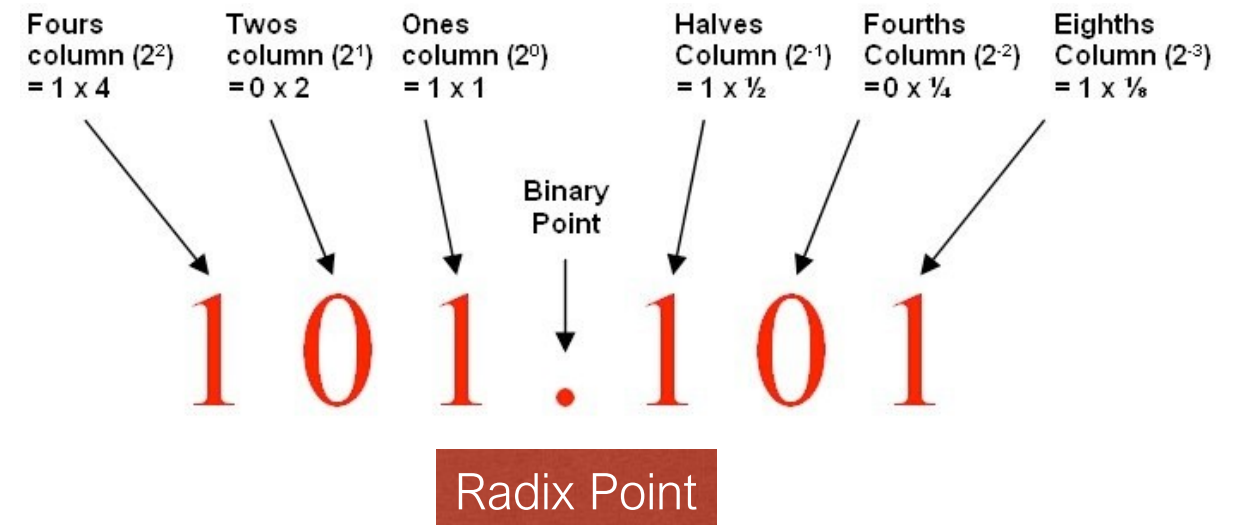
Shifting the decimal point 1 position to the [right](#) has the effect of [multiplying](#) the number by 10.

145.238

14.5238

1452.38

## Base-2



Shifting the radix point 1 position to the [left](#) has the effect of [dividing](#) the number by 2.

Shifting the radix point 1 position to the [right](#) has the effect of [multiplying](#) the number by 2.

$101.11 = 5 \frac{3}{4}$

$10.111 = 2 \frac{7}{8}$

$1011.1 = 11 \frac{1}{2}$

# Representable Numbers

Assuming finite length encodings:

## ■ Limitation

- Can only exactly represent numbers of the form  $x/2^k$
- Other rational numbers have repeating bit representations

## ■ Value

## Representation

So, we must eventually truncate!

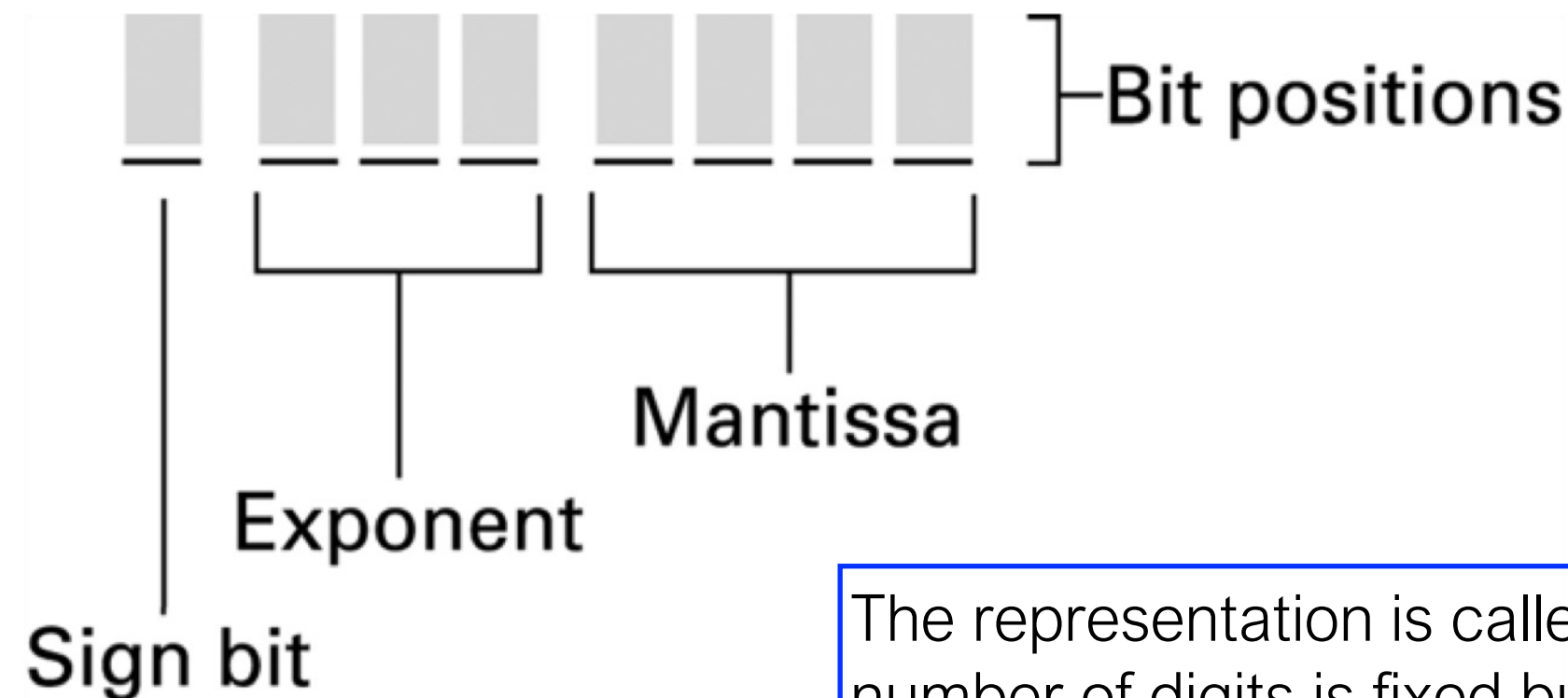
- |        |                                       |
|--------|---------------------------------------|
| ■ 1/3  | 0.0101010101[01]... <sub>2</sub>      |
| ■ 1/5  | 0.001100110011[0011]... <sub>2</sub>  |
| ■ 1/10 | 0.0001100110011[0011]... <sub>2</sub> |

Can approximate with increasing accuracy by lengthening the binary representation

# Floating Point Representation

Representing a [real value](#) in a computer:

- [The sign](#) - positive or negative
- [The mantissa](#) - consists of digits in the value with the radix point assumed to the left
- [The exponent](#) - which determines how the radix point is shifted relative to the mantissa (can be positive or negative)



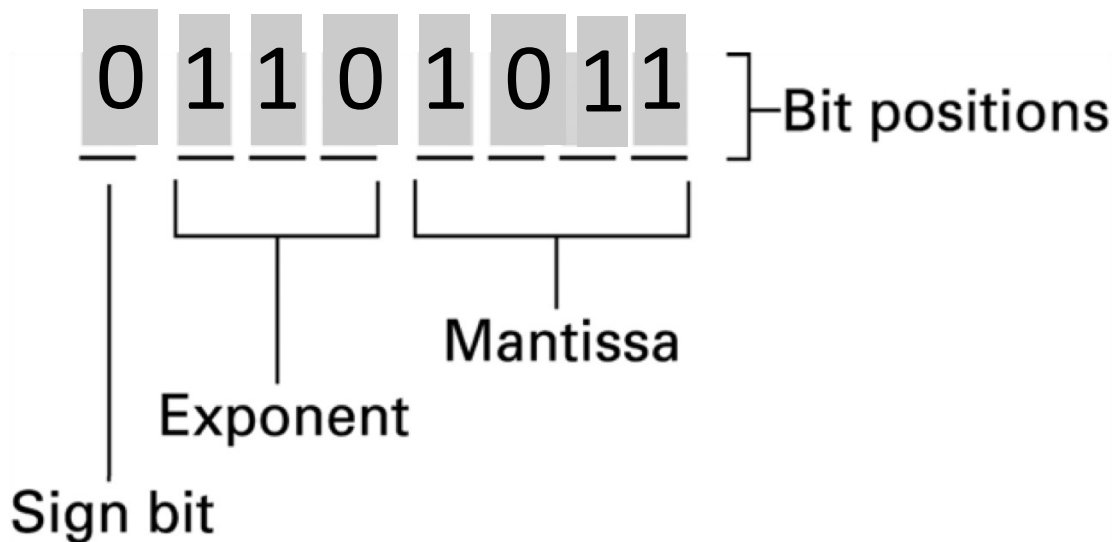
Let's Assume an 8-bit fixed representation (usually much larger 64 bits):

- sign: 1 bit,
- exponent: 11 bits,
- mantissa: 52 bits

The representation is called [floating point](#) because the number of digits is fixed but the radix point floats.

- a positive exponent shifts the radix point to the right
- a negative exponent shifts the radix point to the left

# Decoding the value 01101011



| Bit pattern | Value represented |
|-------------|-------------------|
| 111         | 3                 |
| 110         | 2                 |
| 101         | 1                 |
| 100         | 0                 |
| 011         | -1                |
| 010         | -2                |
| 001         | -3                |
| 000         | -4                |

Exponent encoded  
in excess-3

2

. 1 0 1 1      Extract Mantissa

1 1 0      Extract Exponent  
Interpret in excess-3

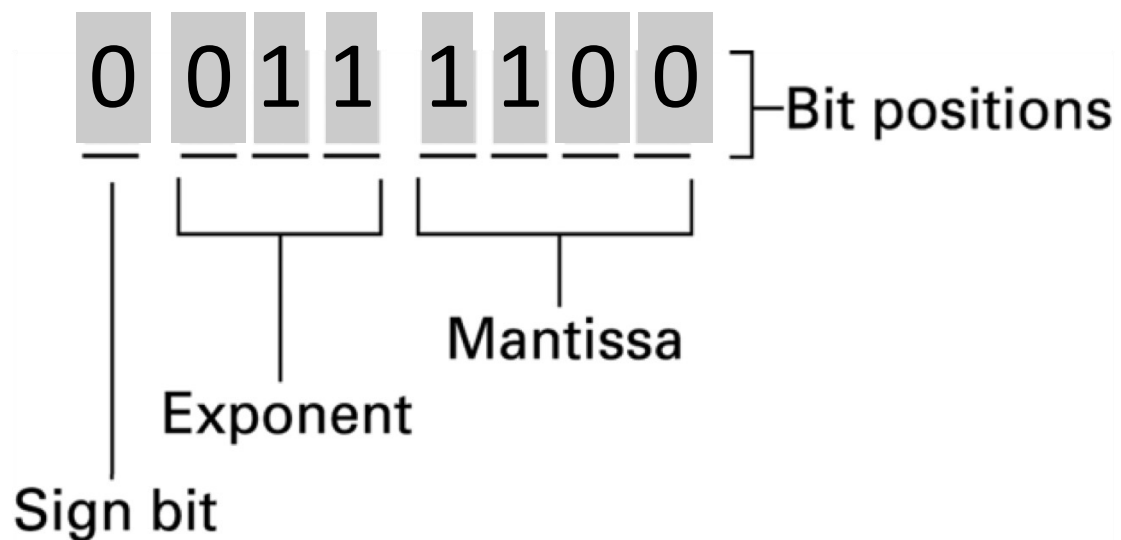
1 0 . 1 1      Move radix point  
to the right 2

$2 + 0 + 1/2 + 1/4 = 2 \frac{3}{4}$       Translate to  
decimal form

+  $2 \frac{3}{4}$       Check sign bit  
0 is positive  
1 is negative

2.75

# Decoding the value 0011100



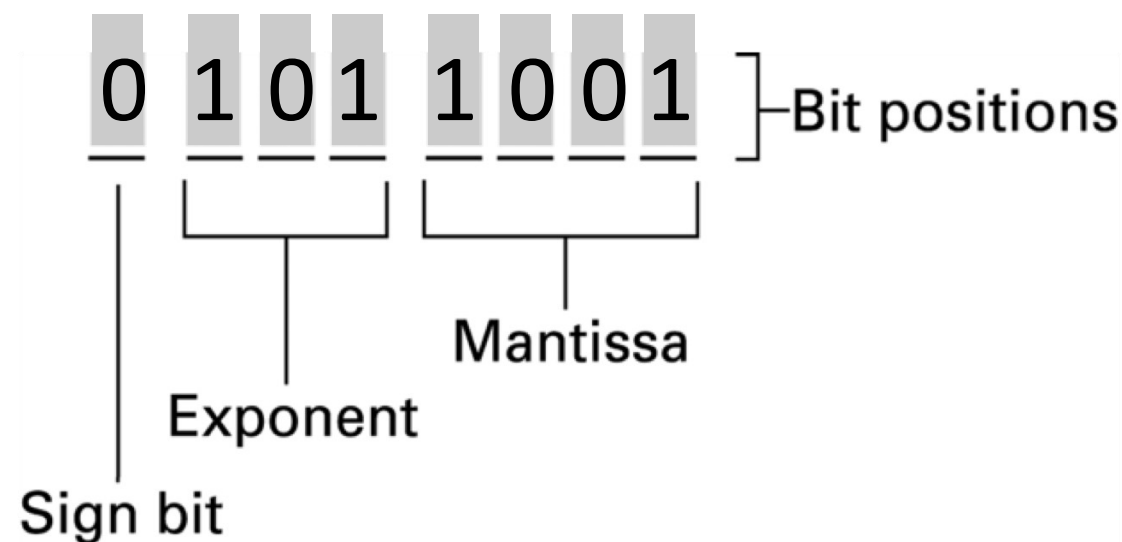
| Bit pattern | Value represented |
|-------------|-------------------|
| 111         | 3                 |
| 110         | 2                 |
| 101         | 1                 |
| 100         | 0                 |
| 011         | -1                |
| 010         | -2                |
| 001         | -3                |
| 000         | -4                |

Exponent encoded  
in excess-3

$$\begin{array}{l}
 \text{Extract Mantissa} \\
 . 1100 \\
 \\
 \text{Extract Exponent} \\
 \text{Interpret in excess-3} \\
 -1 \quad 011 \\
 \\
 \text{Move radix point} \\
 \text{to the left 1} \\
 . 01100 \\
 \\
 \text{Translate to} \\
 \text{decimal form} \\
 0/2 + 1/4 + 1/8 = 3/8 \\
 \\
 + 3/8 \\
 \\
 0.375
 \end{array}$$

Check sign bit  
0 is positive  
1 is negative

# Encoding the value $1+1/8$ (1.125)



| Bit pattern | Value represented |
|-------------|-------------------|
| 111         | 3                 |
| 110         | 2                 |
| 101         | 1                 |
| 100         | 0                 |
| 011         | -1                |
| 010         | -2                |
| 001         | -3                |
| 000         | -4                |

Exponent encoded  
in excess-4

1 . 0 0 1

Encode the number  
in binary notation

1 0 0 1

Copy the pattern  
into the mantissa  
(left to right)

Starting with leftmost 1

. 1 0 0 1

Imagine the radix  
point to the left of  
the mantissa value

1 to the right  
(+1)

Determine direction  
and length to move  
radix point to recover  
the original binary  
number

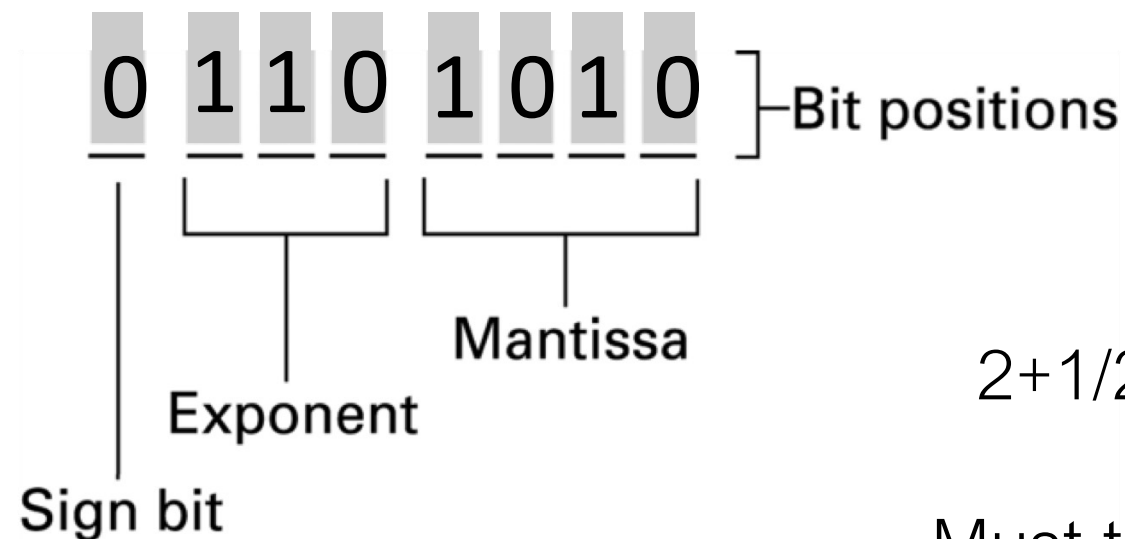
1 0 1

Encode in exponent  
field using excess notation

0

Encode sign bit  
0 is positive  
1 is negative

# Truncation Errors: Encoding the value $2 \frac{5}{8}$ (2.625)



$$2 + \frac{1}{2} + \frac{1}{8} = 2 \frac{5}{8}$$

Must truncate the  
rightmost 1 ( $\frac{1}{8}$ )

1 0 . 1 0 1

1 0 1 0

. 1 0 1 0

2 to the right  
(+1)

1 1 0

0

Encode the number  
in binary notation

Copy the pattern  
into the mantissa  
(left to right)

Starting with leftmost 1

Imagine the radix  
point to the left of  
the mantissa value

Determine direction and  
length to move radix point  
to recover the original  
binary number

Encode in exponent  
field using excess notation

Encode sign bit  
0 is positive  
1 is negative

| Bit pattern | Value represented |
|-------------|-------------------|
| 111         | 3                 |
| 110         | 2                 |
| 101         | 1                 |
| 100         | 0                 |
| 011         | -1                |
| 010         | -2                |
| 001         | -3                |
| 000         | -4                |

Exponent encoded  
in excess-4

Result:  
01101010 =  $2 \frac{1}{2}$   
Truncation or  
Rounding error!

# Truncation Errors

Can cause significant problems in applications requiring high precision!

There are many more repeating decimal numbers in binary than in decimal notation. Example:  $1/10$

Arithmetic with accumulated rounding errors can be problematic:

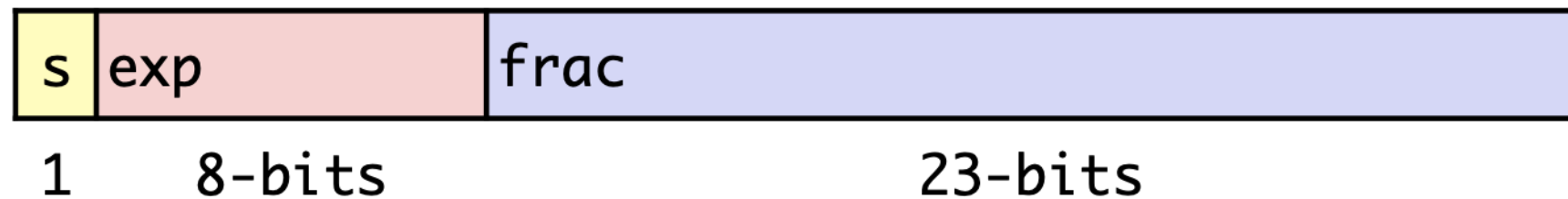
8 bit representation:

$2 \frac{1}{2} + \frac{1}{8} + \frac{1}{8} \rightarrow 2 \frac{1}{2} + \frac{1}{8} \rightarrow 2 \frac{1}{2}$  (small parts disappear)  
 $\frac{1}{8} + \frac{1}{8} + 2 \frac{1}{2} \rightarrow \frac{1}{2} + 2 \frac{1}{2} \rightarrow 3$  (accumulate small parts first)

Topic: Numerical Analysis

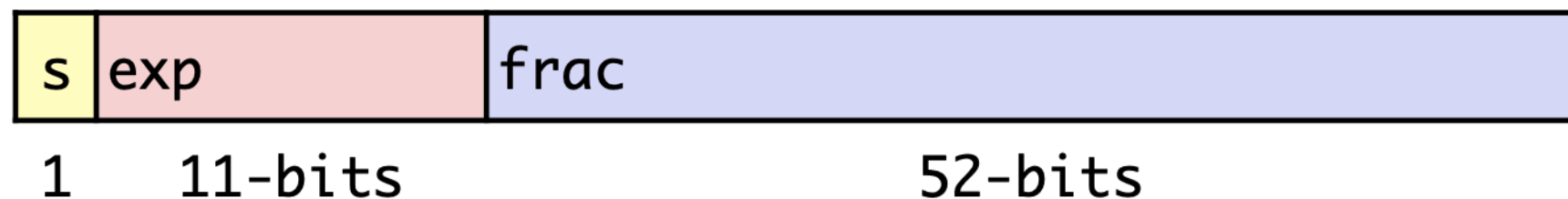
# Worrying about precision

## ■ Single precision: 32 bits

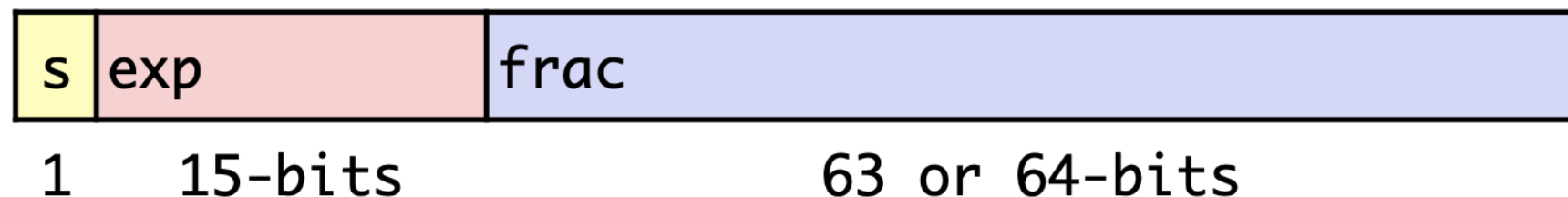


$10^{-37}$  to  $10^{38}$   
Precision: 7 decimal digits

## ■ Double precision: 64 bits



## ■ Extended precision: 80 bits (Intel only)



### Single Precision

- Encodes very small real numbers and very large real numbers
- very accurate precision to 7 decimals...

# IEEE Floating Point Standard

## ■ IEEE Standard 754

- Established in 1985 as uniform standard for floating point arithmetic
  - Before that, many idiosyncratic formats
- Supported by all major CPUs

## ■ Driven by numerical concerns

- Nice standards for rounding, overflow, underflow
- Hard to make fast in hardware
  - Numerical analysts predominated over hardware designers in defining standard

# The High Cost of Floating Point Overflow!



On June 4, 1996, the **US\$500 million** Ariane 5 spacecraft was launched for the first time.

Sadly, the primary cause was found to be a piece of software which had been retained from the previous launcher's systems and which was not required during the flight of Ariane 5. The software was used in the Inertial Reference System (SRI) to calculate the attitude of the launcher. In Ariane 4, this software was allowed to continue functioning during the first 50 seconds of flight as it could otherwise delay launching if the countdown was halted for any other reason, this was not necessary for Ariane 5. Additionally, the software contained implicit assumptions about the parameters, in particular the horizontal velocity that was safe for Ariane 4, but not Ariane 5.

The failure occurred because the horizontal velocity exceeded the maximum value for a 16 bit unsigned integer when it was converted from it's signed 64 bit representation. This failure generated an exception in the code which was not caught and thus propagated up through the processor and ultimately caused the SRI to fail. The failure triggered the automatic fail-over to the backup SRI which had already failed for the same reason. This combined failure was then communicated to the main computer responsible for controlling the jets of the rocket, however, this information was misinterpreted as valid commands. As a result of the invalid commands, the engine nozzles were swung to an extreme position and the launcher was destroyed shortly afterwards.



# The High Cost of Floating Point Overflow!

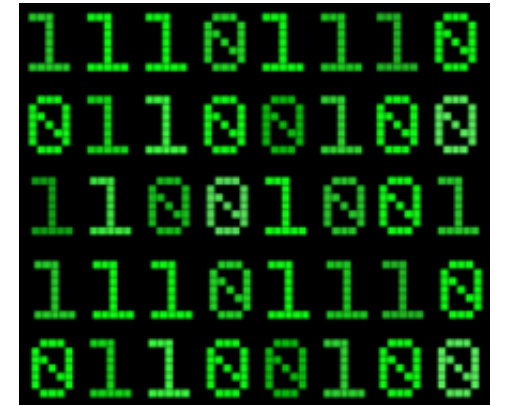
On June 4, 1996, the US\$500 million Ariane 5 spacecraft was launched for the first time

- Piece of software retained from Ariane 4, used to calculate launcher attitude
- Contained implicit assumptions about safe horizontal velocities (different in Ariane 5)
- Horizontal velocity exceeded max for 16 bit unsigned integer
- Velocity was actually safe, but overflow → software crash
- Failed over to backup system; failed for the same reason
- Failure communicated to main computer, misinterpreted as valid commands
- Engine nozzles swung to an extreme position
- Launcher destroyed



# Final Words

**Do programmers and computer engineers  
work with ones and zeros?**



**Yes... in the same way authors and journalists  
work with the alphabet**

