

# Computers

# Data Representation

*Grau en Ciència i Enginyeria de Dades*

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- Basic Concepts
  - Representation of several data types
- Data Type representation
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  - Dependencies on Hardware and Software

# Basic Concepts

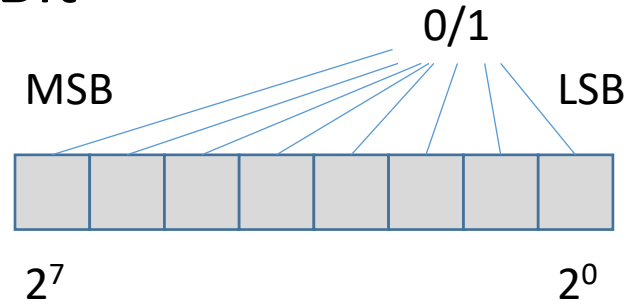
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- Binary Digit: it is a number that can adopt two values: 0 or 1
  - Many interpretations: true/false, positive/negative, on/off, etc
- Bit: contraction from “Binary Information Digit” (*John W. Tukey, 1947*)
  - It is the maximum amount of information that can be conveyed by a binary digit
    - A binary digit can convey between 0 and one bit of information
- Byte: it is a unit of digital information, usually comprising 8 bits
  - The smallest addressable unit of memory in many, but not all, computer architectures
    - Introduced in the ‘60s, and popularized by Intel (8008) in the ‘70s
    - It was used to encode a text character

# Binary number using 8-bit Byte

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- MSB: Most Significant Bit
- LSB: Least Significant Bit



- Example:
  - Decimal number: 23
  - Binary representation: ???

# Signed Number Representations

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- A binary number can represent negative values using different methods
  - MSB = 1 represents negative numbers
  - Optimize subtractions
    - E.g. add negative numbers
- The most known and used methods are:
  - Sign and magnitude
    - Commonly used to represent the mantissa of floating points (see later slides)
  - One's Complement
    - Early computers and other current particular usages
  - Two's Complement
    - Most of current computers
  - Biased representation
    - Exponent of floating points (see later slides)

# Two's Complement

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- Range:
  - From  $-2^{(N-1)}$  to  $+(2^{(N-1)}-1)$
- Advantage compared to one's complement
  - Disregard overflow bit in operations (e.g. subtraction)
- Negative number:
  - Decimal number  $\rightarrow$  invert bits  $\rightarrow$  add +1
- Example:
  - Decimal number: -23
  - Two's Complement representation: ???

# Basic Concepts

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- Data type is a classification that let's the interpreter/compiler knows how the data is going to be used
- Direct impact on size and format
- Software and hardware support
  - Compiler/Interpreter and architecture
    - 32-bit vs 64-bit



# Basic Classification

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- **Scalar data types**: a single value
  - Arithmetic (numbers), symbols and characters, boolean, enumeration, pointers
- **Special data type**: Void -- equivalent to no-data (of size 0), or datatype not specified
- **Compound/Aggregate data types**: built combining one or more scalar types
  - Arrays, structures, unions

# Basic Background

- Endianness
  - The order of bitwise values in memory

E.g.  $(1234)_{10} = (04\ D2)_H$

- Big-Endian
  - Byte with **most** significant value: stored first (lowest memory address)
  - Data networking and mainframes

@	Value
0x0000	<b>04</b>
0x0001	D2

- Little-Endian
  - Byte with **least** significant value: stored first (lowest memory address)
  - x86 Intel processor family and most microprocessors

@	Value
0x0000	<b>D2</b>
0x0001	04

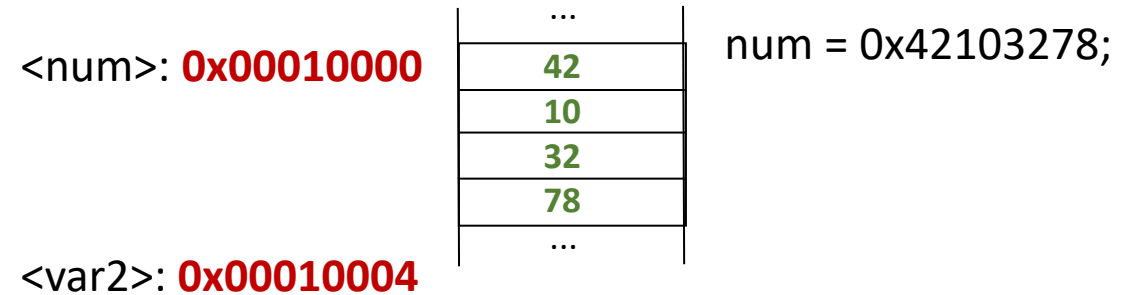
- Some architectures support both
  - E.g. Arm and IBM POWER in full, recent x86 and x86-64 have limited support (movbe)

# Basic Background

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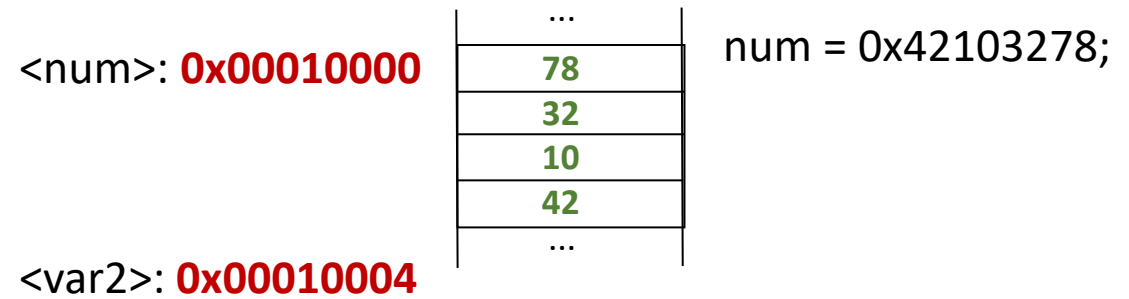
- Big Endian: the location address points to the Big end of the number

(Like writing the bytes left-to-right)



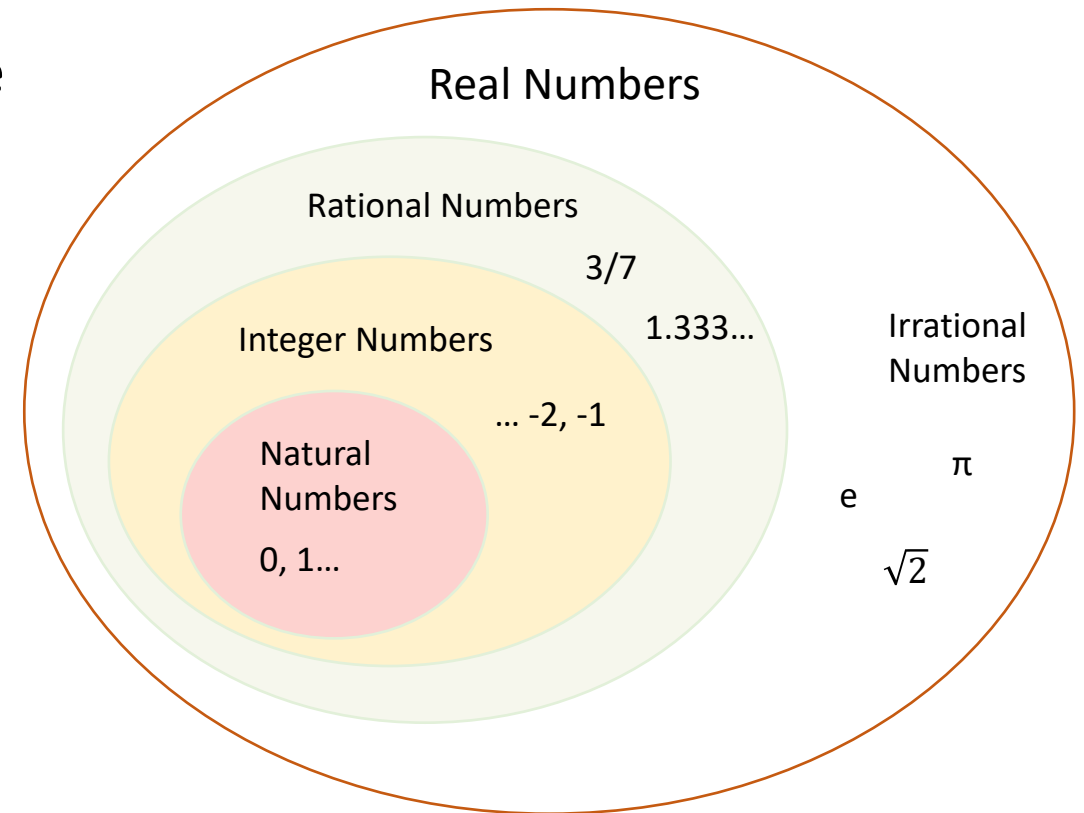
- Little Endian: the location address points to the Little end of the number

(Like writing the bytes right-to-left)



# Scalar Data Type: Arithmetic (numbers)

- Integer and real numbers
  - Complex numbers are hold as a structure
- Signed and unsigned data types
- Numeral Systems
  - Binary, Octal, Decimal, Hexadecimal



# Integers

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- Char: 1 Byte
  - Signed: from -128 to 127
  - Unsigned: from 0 to 255
- Short: 2 Bytes
  - Signed: from -32,768 to 32,767
  - Unsigned: from 0 to 65,535
- Integer: 4 Bytes
  - Signed: from -2,147,483,648 to 2,147,483,647
  - Unsigned: from 0 to 4,294,967,295
- Long Long: 8 Bytes (if possible)
  - Signed: from -9,223,372,036,854,775,808 to 9,223,372,036,854,775,807
  - Unsigned: from 0 to 18,446,744,073,709,551,615
- Different base notation
  - Decimal, octal, hexadecimal



# Integer versus Long Integer

- Long integer depends on both architecture  
Operating System

OS	Arch	Size (Bytes )
Windows	IA-32	4
Windows	x86-64	<b>4</b>
Linux	IA-32	4
Linux	x86-64	<b>8</b>
Mac OS X	IA-32	4
Mac OS X	x86-64	<b>8</b>

- Warning when porting code
  - **The behavior may change**
  - E.g.: IA-32 vs x86-64 Linux, x86-64 Win vs x86-64 Linux

# Real Numbers

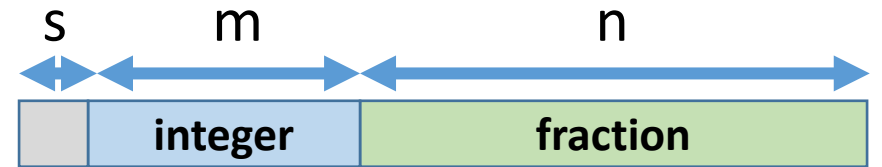
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- Numbers with a fractional component
- Two main representations
  - Fixed-point versus Floating-point
    - The radix point is fixed or can float anywhere
      - The symbol to separate integer and fractional parts of a real number
    - The lesson “computer and its elements” will introduce the cost difference among Hw supports
- Implementation: tradeoff between cost and precision
  - Lack of hardware resources
    - E.g.: Multimedia decoders
  - Boost performance although degraded precision
    - E.g. Playstations, Doom

# Fixed-point numbers

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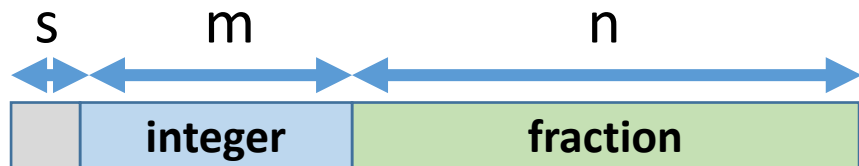
- Bits = 1 + m + n
  - 1 bit for sign (if signed)
  - m bits for integer component
  - n bits for fraction component
- Notation:  $Q_{m.n}$ 
  - Integer number without fraction component ( $Q_{m.0}$ )
  - Fractional number without integer component ( $Q_n$ )





# Fixed-point numbers

- **Value =  $-2^m b'_s + 2^{m-1} b'_{m-1} + \dots + 2^1 b'_1 + 2^0 b'_0 + 2^{-1} b_{n-1} + 2^{-2} b_{n-2} + \dots + 2^{-n} b_0$**
- Programming language support
  - C and C++ have no direct support, but can be implemented
    - Embedded-C supports it (implemented in GCC)
  - Python has direct support through a module
    - I.e. decimal module



## Example: 1110

$$Q3.0: -2^3 + 2^2 + 2^1 = -2$$

$$Q1.2: -2^1 + 2^0 + 2^{-1} = -2 + 1 + 0.5 = -0.5$$

$$Q3: -2^0 + 2^{-1} + 2^{-2} = -1 + 0.5 + 0.25 = -0.25$$

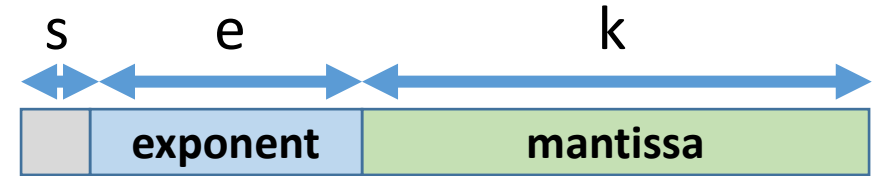
# Fixed-point numbers: accuracy problems

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- Precision loss and overflow
- Results can require more bits than operands
  - Round or truncate
  - Specify different size for result
- Boundary numbers to prevent overflow
- Exception: overflow flag
  - If supported by hardware

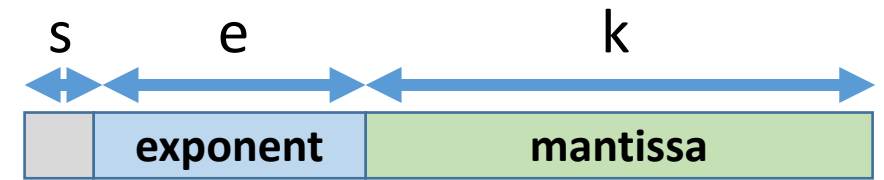
# Floating-point numbers

- Bits = 1 + e + k
  - 1 bit for sign (if signed)
  - e bits for exponent  $\{1, \dots, (2^e - 1) - 1\}$
  - k bits for mantissa (fraction)
    - There is an implicit 1-bit (top left) equals to 1, **unless exponent is equal to zero**
- Most processors follow IEEE floating point standard
  - First version on 1985
  - Standardize formats
  - Special Values



# Floating-point numbers

- **Value =  $(-1)^{\text{sign}} * (1 + \sum_{1}^k b_{(k-i)} 2^{-i}) * 2^{(e-(E_{\text{max}}))}$**



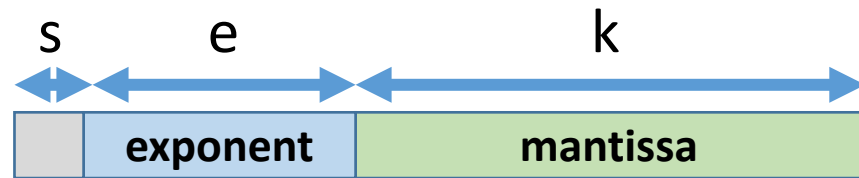
- Float: 4 Bytes
  - Sign bit, 8-bit exponent, 23-bit mantissa
- Double: 8 Bytes
  - Sign bit, 11-bit exponent, 52-bit mantissa
- Some languages support 10 bytes
  - Sign bit, 15-bit exponent, (1+63)-bit mantissa

Biased Exponent (bias = 127):

0	Denormals numbers 0.xxx
1	Smallest normal exponent
<b>127</b>	E+0
<b>254</b>	Larger normal exponent
255	Infinite / NaNs

# Floating-point numbers

- Intel encoding



Sign    Biased exp.    Magnitude

Single precision	8 bits	23 bits	(1+31)
Double precision	11 bits	52 bits	(1+63)
Double extended precision	15 bits	1+63 bits	(1+1+78)

Class		Sign	Exp.	Mantissa
Positive	$+\infty$	0	11 ... 11	1 . 00 ... 00
	+Normals	0	11 ... 10	1 . 11 ... 11
	+3.40 E+38	...	...	...
	+1.000 E+0	0	01 ... 11	1 . 00 ... 00
	+1.17 E-38	0	00 ... 01	1 . 00 ... 00
	+Denormals	0	00 ... 00	0 . 11 ... 11
	+1.17 E-38	...	...	...
Negative	+1.40 E-45	0	00 ... 00	0 . 00 ... 01
	+Zero	0	00 ... 00	0 . 00 ... 00
	-Zero	1	00 ... 00	0 . 00 ... 00
	-Denormals	1	00 ... 00	0 . 00 ... 01
	-1.40 E-45	...	...	...
	-1.17 E-38	1	00 ... 00	0 . 11 ... 11
	-Normals	1	00 ... 01	1 . 00 ... 00
NaN	-1.000 E+0	1	01 ... 11	1 . 00 ... 00
	...	...	...	...
	-3.40 E+38	1	11 ... 10	1 . 11 ... 11
	$-\infty$	1	11 ... 11	1 . 00 ... 00
	SNaN	X	11 ... 11	1 . 0X ... XX
QNaN	X	11 ... 11	1 . 1X ... XX	
-QNaN	1	11 ... 11	1 . 10 ... 00	

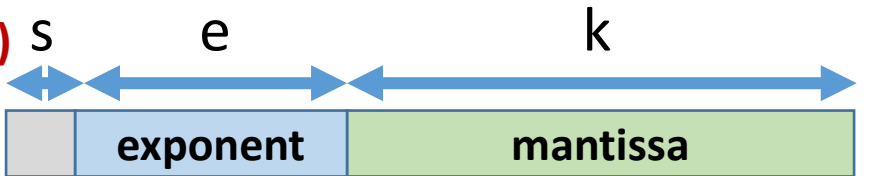
<https://software.intel.com/en-us/articles/x87-and-sse-floating-point-assists-in-ia-32-flush-to-zero-ftz-and-denormals-are-zero-daz>

# Double precision floating point

- Equivalent table for 64-bit fp numbers
- Compare with results from valfp64.c in Lab S3 – Data Representation

Class		Sign	Exp.	Mantissa
Positive	$+\infty$	0	11 ... 11	1 . 00 ... 00
	+Normals	0	11 ... 10	1 . 11 ... 11
	+1.79 E+308	...	...	...
	+1.000 E+0	0	01 ... 11	1 . 00 ... 00
	+2.22 E-308	0	00 ... 01	1 . 00 ... 00
	+Denormals	0	00 ... 00	0 . 11 ... 11
	+2.22 E-308 +4.94 E-324	... 0	... 00 ... 00	... 0 . 00 ... 01
+Zero	0	00 ... 00	0 . 00 ... 00	
Negative	-Zero	1	00 ... 00	0 . 00 ... 00
	-Denormals	1	00 ... 00	0 . 00 ... 01
	-4.94 E-324 -2.22 E-308	... 1	... 00 ... 00	... 0 . 11 ... 11
	-Normals	1	00 ... 01	1 . 00 ... 00
	-1.000 E+0	1	01 ... 11	1 . 00 ... 00
	...	...	...	...
	-1.79 E+308	1	11 ... 10	1 . 11 ... 11
$-\infty$	1	11 ... 11	1 . 00 ... 00	
NaN	SNaN	X	11 ... 11	1 . 0X ... XX
	QNaN	X	11 ... 11	1 . 1X ... XX
	-QNaN	1	11 ... 11	1 . 10 ... 00

# Floating-point numbers

- **Value =  $(-1)^{\text{sign}} * (1 + \sum_{1}^k b_{(k-i)} 2^{-i}) * 2^{(e-(E_{\text{max}}))}$**
- 
- The diagram shows a horizontal bar representing a floating-point number. It is divided into three sections: a small grey box labeled 's' (sign), a larger blue box labeled 'exponent' with a double-headed arrow above it labeled 'e', and a green box labeled 'mantissa' with a double-headed arrow above it labeled 'k'.

Example:  $(23,46875)_{10} = (23)_{10} + (0,46875)_{10} =$   
 $= (10111)_2 + (0.01111)_2 = (10111.01111)_2 =$   
 $= (1.011101111)_2 * 2^4$

32-bit floating point representation

Sign (1-bit) = 0

Exponent (8-bit) = 4 =  $(131 - E_{\text{max}}) = (131 - 127)$   
 $= (10000011)_2$

Mantissa (23-bit) =  $(0111011110...0)$

**0 10000011 011101111000000000000000**  
**(41BB C000)<sub>H</sub>**

# Floating-point numbers: support

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- Float
  - C and C++: single-precision (32-bit)
  - Python: built-in double-precision (64 bit)
- Most 32-bit architectures comprises 64-bit support in FPU (floating-point unit)
  - IA-32 and x86-64 present 80-bit floating-point type (double-extended precision format)
    - From 1989: x87 FPU (80-bit)
- Quad-precision (128-bit)
  - Software support
  - Few architectures provide hardware support
    - E.g. IBM POWER9 processors (MareNostrum 4)



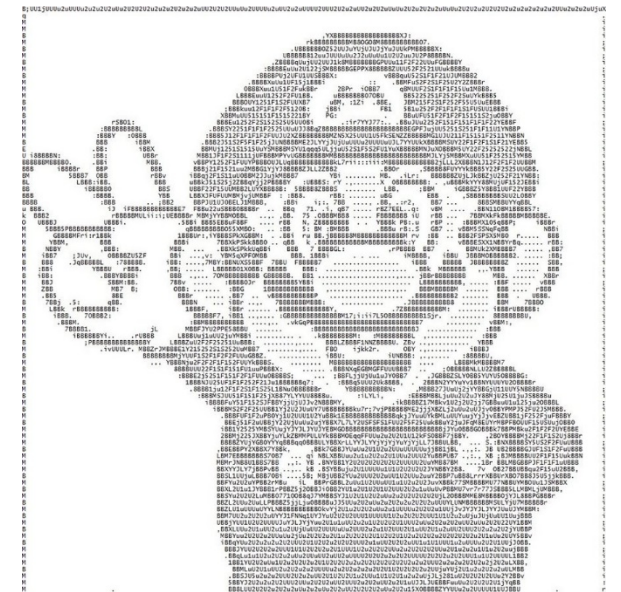
# Floating-point numbers: accuracy problems

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- Numbers that cannot be exactly represented as binary fractions
  - E.g.  $1/10$ 
    - 0.00011001...
- Conversion to integer loses accuracy due to truncate and roundoff
  - E.g.  $56 / 7 = 8$ ;  $0,56 / 0,07 =$  can be 7
    - E.g. explosion of Ariane 5 rocket (1996)
      - <http://www-users.math.umn.edu/~arnold/disasters/ariane.html>
- Commutative, but not necessary: associative and distributive
  - “ $(a + b) + c$ ” could be not equal to “ $a + (b + c)$ ”
  - “ $(a + b) * c$ ” could be not equal to “ $a * c + b * c$ ”

# Scalar Data Type: Symbols and Characters

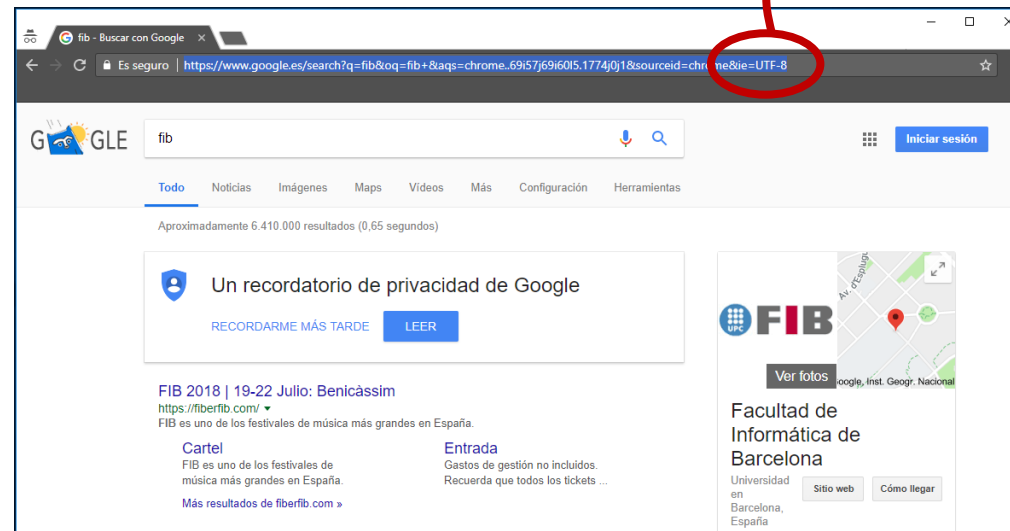
- Char data type
  - Encode alphanumeric data and symbols
- Several character set encoding
  - ASCII code (American Standard Code for Information Interchange)
    - Single byte using the bottom 7 bits. From 0 to 127
    - The standard for the early HTML
  - ISO-8859-1 code (Latin Alphabet)
    - 1 full byte (256 characters): extension to ASCII
    - The standard from HTML 2.0 to HTML 4.01
    - Problems with some symbols
  - Windows-1252 code (CP-1252): also called ANSI
    - It is a superset of ISO-8859-1 (more printable characters)
    - Used by default on legacy components of Microsoft Windows
    - ANSI comprises 8 bits: 1 additional bit compared to ASCII
  - **UNICODE**



# Chars: encoding

- Unicode Standard (created at late 80s by Xerox and Apple)
  - **UTF-8** (from 1 Byte up to 4 bytes, if necessary)
    - It is the dominant encoding
    - Support from Operating Systems (e.g. WindowsNT was the first OS that supported UTF-8)
    - It is the standard of HTML5 and websites
    - To support every language, even Klingon, and emojis
  - Several widths
    - UTF-16 (2-4 Bytes)
    - UTF-32 (4 Bytes)

Input Encoding = UTF-8



# Chars: encoding issues

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- Single Byte versus multiple bytes
  - Fixed-size versus variable-size characters
  - The need to represent character sets that cannot be represented in a single byte (e.g. Japanese, Chinese)
    - MBCSs: MultiByte Character Sets (old and legacy technology)
    - Unicode Standard
- Compatibility issues
  - Unicode-aware programs to manipulate data
    - E.g. fulfilled copy of null-terminated strings (correct process of zero bytes)

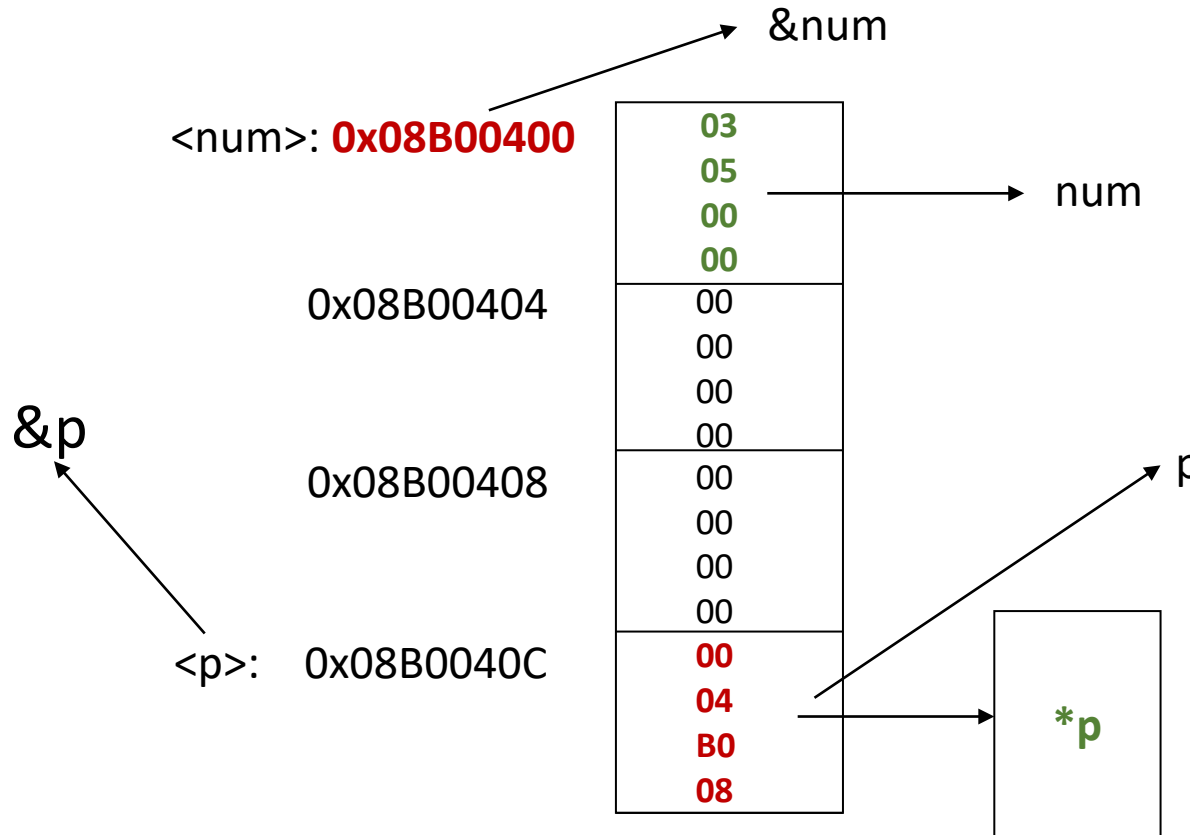
# Scalar Data Type: enumeration and boolean

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- Enumeration:
  - Ordered list of symbolic names bound to unique values
    - E.g.: colours {red, green, blue}
  - Integer size, by default
  
- Boolean:
  - True or false
  - Built-in data type in C++ and Python
    - But not in C (integer value: 0 vs 1)
  - Even it only needs one bit, it takes a byte
    - It must be addressable

# Scalar Data Type: Pointer

- Value that refers to another value stored elsewhere (address == pointer)



```
int num = 0x0503; //1283
```

```
int *p;
```

```
p = &num;
```

```
num = 0x00000503
```

```
&num = 0x08B00400
```

```
p = 0x08B00400
```

```
&p = 0x08B0040C
```

```
*p = 0x00000503
```

# Special Data Type: void and void\*

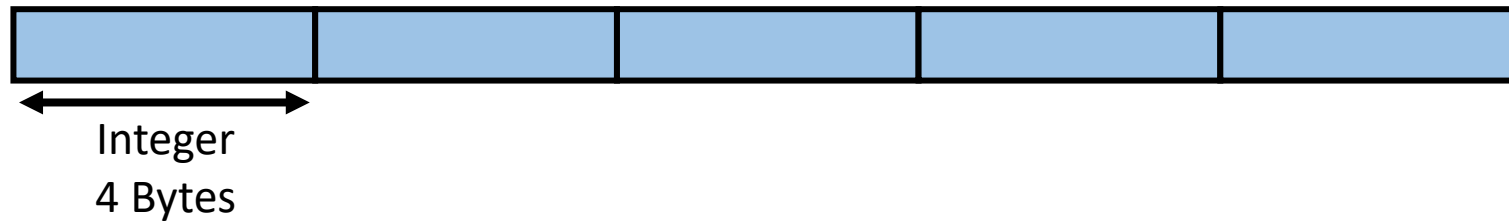
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- The void data type is a keyword that refers to a placeholder to a data type to represent no data!!!!
- Different meanings
  - Void function (in C/C++): the function returns nothing
  - Void parameter (in C/C++): the function takes no parameters
- **Void \*** is different...
  - It is a pointer that points to an unspecified data type...that is, anything!!!!
  - Really useful, but take care...

# Aggregate Data Type: arrays

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- A collection of items that can be selected/accessed using identifying key/s
  - E.g.: A collection of 5 integers in C/C++: `int array[5];`



- Implementation complexities
  - Elements of (same vs different) data type/size
  - Indexing keys: integer vs arbitrary values
  - Static vs dynamic array size
  - One vs multiple dimensions



# Arrays: tradeoffs

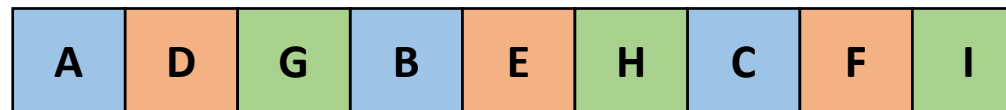
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- Memory layout for multidimensional arrays
  - Row-major versus column-major versus depth (for 3D) versus...

A	B	C
D	E	F
G	H	I



Row Major

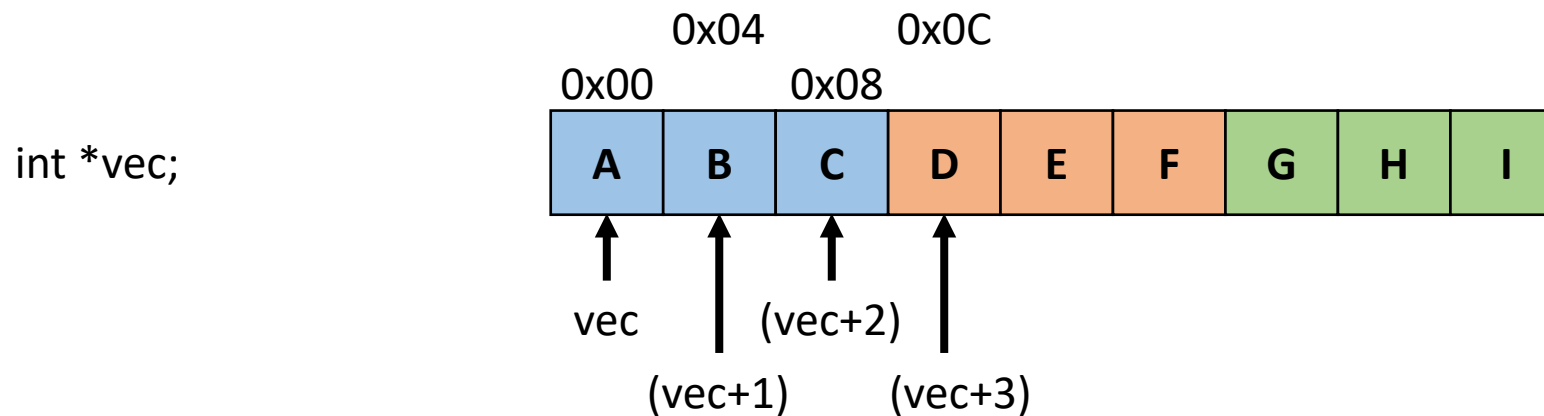


Column Major

- Programming language based
  - Row major: C, C++, Python
  - Column major: Fortran, MatLab, R
- Hardware support to boost performance
  - Special registers

# Pointer Arithmetics

- Pointers can point to subsequent mem @s based on the data type hold on
  - E.g. difference between **char\*** (1@mem shift) and **int\*** (4@mem shift)

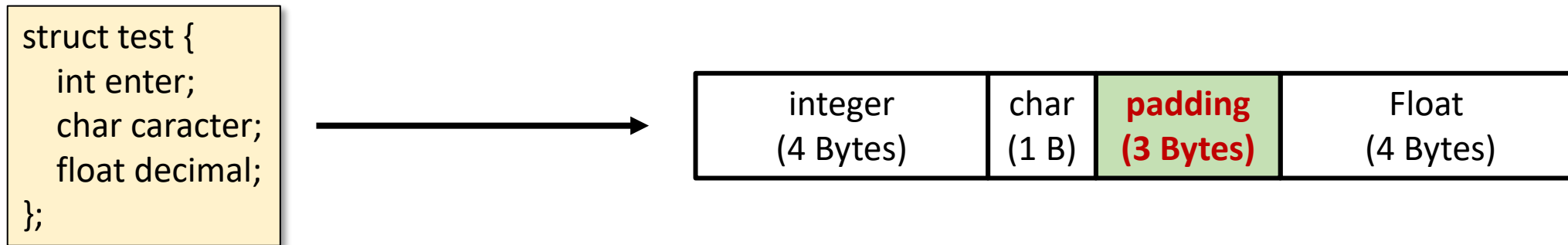


- Pointers point to a given @ independent of the memory region
  - More details on memory @s in future lessons...

# Aggregate Data Type: structures

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- A record that groups several variables and place them in a particular memory block, accessed by a single pointer or variable name

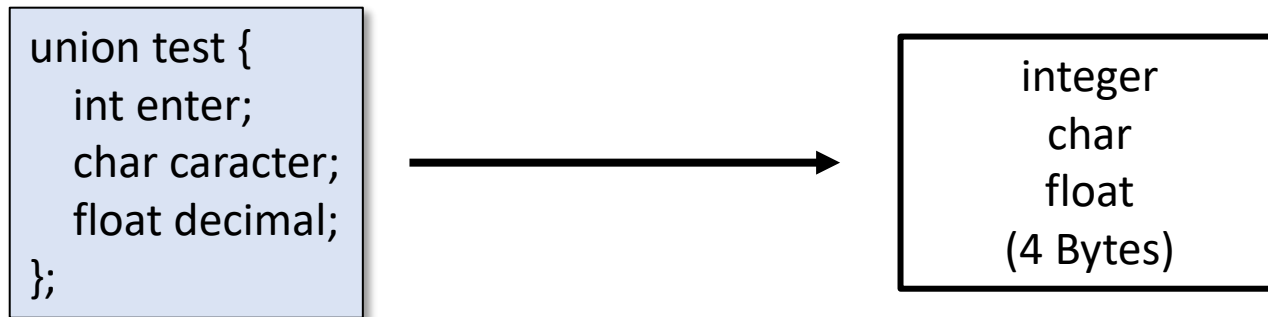


- Padding bytes to align fields in memory aiming at boost performance
  - Processor architecture related (32 bits vs 64 bits)

# Aggregate Data Type: unions

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- Several values of different type can be accessed in the SAME mem @
  - Only one value at a time
  - Overwrite values



- Efficient way to use the same memory location for multiple purpose
- For type-less processing

# Other aggregate data types related to OOP

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- Object Oriented Programming (OOP): programming paradigm
  - Object is an instance of a class: a combination of variables, functions, and structs
    - E.g.: C++ and Python
- Classes are an evolution of structs
  - Contents (fields) with restricted access
- String is different than an array of chars
  - Class-based data type (C++)
    - With embedded functions and fields
  - Sequence of characters ended with '\0' (C/C++)
  - Array of chars is just an array of chars!!!

# Bibliography

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- Computer Organization and Design (5<sup>th</sup> Edition)
  - D. Patterson and J. Hennessy
  - [http://cataleg.upc.edu/record=b1431482~S1\\*cat](http://cataleg.upc.edu/record=b1431482~S1*cat)
    - Several chapters introduce different types of data
- Data Type Summary
  - MSDN (Microsoft)
  - <https://docs.microsoft.com/en-us/office/vba/language/reference/user-interface-help/data-type-summary>
    - Summary list of data types and their respective size in Windows based software
- C++ Language Tutorial
  - <http://www.cplusplus.com/doc/tutorial/>
    - Summary of basic and compound data types for C++