## Representing and Manipulating Information: Fixed point and floating point

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Announcements

Quizzes and programming assignments

Fractions and fixed point representation

monteCarloPi.c Using floating point and random numbers to estimate PI
Floats: Overview

#### Floats: Normalized numbers

Normalized: exp field Normalized: frac field Normalized: example

#### Floats: Denormalized numbers

Denormalized: exp field Denormalized: frac field Denormalized: examples

## Quizzes and programming assignments

#### Short quiz 4

▶ Has been out as of this morning. Due Friday. All about integers.

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#### Programming assignment 3

► Has been out, due Friday before spring break.

toBin.c: Printing the binary representation

- Shifting and masking
- Try modifying to print octal.

## Bit shifting

#### << N Left shift by N bits

- multiplies by  $2^N$
- ▶  $2 << 3 = 0000_0010_2 << 3 = 0001_0000_2 = 16 = 2 * 2^3$

▶ 
$$-2 << 3 = 1111_{110_2} << 3 = 1111_{0000_2} = -16 = -2 * 2^3$$

### >> N Right shift by N bits

- divides by  $2^N$
- ▶  $16 >> 3 = 0001_0000_2 >> 3 = 0000_0010_2 = 2 = 16/2^3$
- ▶  $-16 >> 3 = 1111_0000_2 >> 3 = 1111_110_2 = -2 = -16/2^3$

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## Unsigned fixed-point binary for fractions

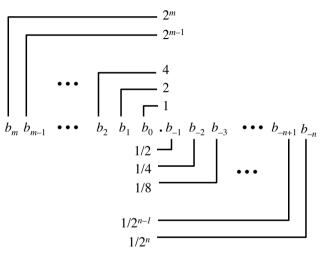


Figure: Fractional binary. Image credit CS:APP

## Unsigned fixed-point binary for fractions

unsigned fixed-point char example	weight in decimal
1000.0000	8
0100.0000	4
0010.0000	2
0001.0000	1
0000.1000	0.5
0000.0100	0.25
0000.0010	0.125
0000.0001	0.0625

Table: Weight of each bit in an example fixed-point binary number

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- ▶  $.625 = .5 + .125 = 0000.1010_2$
- ▶  $1001.1000_2 = 9 + .5 = 9.5$

## Signed fixed-point binary for fractions

signed fixed-point char example	weight in decimal
1000.0000	-8
0100.0000	4
0010.0000	2
0001.0000	1
0000.1000	0.5
0000.0100	0.25
0000.0010	0.125
0000.0001	0.0625

Table: Weight of each bit in an example fixed-point binary number

- $\blacktriangleright -.625 = -8 + 4 + 2 + 1 + 0 + .25 + .125 = 1111.0110_2$
- ▶  $1001.1000_2 = -8 + 1 + .5 = -6.5$

## Limitations of fixed-point

- Can only represent numbers of the form  $x/2^k$
- Cannot represent numbers with very large magnitude (great range) or very small magnitude (great precision)

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## Floating point numbers

# $\begin{array}{l} Avogadro's \ number \\ +6.02214 \times 10^{23} \ \textit{mol}^{-1} \end{array}$

#### Scientific notation

- sign
- mantissa or significand

exponent

## Floating point numbers

#### Before 1985

- 1. Many floating point systems.
- 2. Specialized machines such as Cray supercomputers.
- 3. Some machines with specialized floating point have had to be kept alive to support legacy software.

### After 1985

- 1. IEEE Standard 754.
- 2. A floating point standard designed for good numerical properties.
- 3. Found in almost every computer today, except for tiniest microcontrollers.

#### Recent

- 1. Need for both lower precision and higher range floating point numbers.
- 2. Machine learning / neural networks. Low-precision tensor network processors.

## Floats and doubles

Single precision		
31 30	23 22 0	
s exp	frac	

	Double precision 63 62 52 51 32			
03	02 32	51 32		
s	exp	frac (51:32)		
31		0		
	frac (31:0)			

Figure: The two standard formats for floating point data types. Image credit CS:APP

#### Floats and doubles

property	1	float	double
total bits s bit exp bits frac bits C printf() format specifier	16	32	64
s bit	1	1	1
exp bits	5	8	11
frac bits	10	23	52
C printf() format specifier	None	"%f"	''%lf''

Table: Properties of floats and doubles

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### The IEEE 754 number line

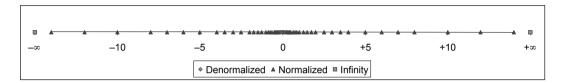


Figure: Full picture of number line for floating point values. Image credit CS:APP

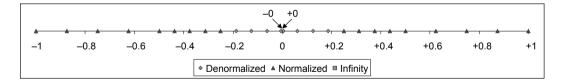


Figure: Zoomed in number line for floating point values. Image credit CS:APP

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Different cases for floating point numbers

Value of the floating point number =  $(-1)^s \times M \times 2^E$ 

- ► *E* is encoded the exp field
- ► *M* is encoded the frac field

1. Normalized	
s ≠0&≠255	f
2. Denormalized	
<b>s</b> 0 0 0 0 0 0 0 0	f
3a. Infinity	
s 1 1 1 1 1 1 1 1	0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
3b. NaN	
s 1 1 1 1 1 1 1 1	⊭ 0

Figure: Different cases within a floating point format. Image credit CS:APP

#### Normalized and denormalized numbers

Two different cases we need to consider for the encoding of E, M (19/32)

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## Normalized: exp field

## For normalized numbers, $0 < \exp < 2^k - 1$

exp is a k-bit unsigned integer

#### Bias

- need a bias to represent negative exponents
- ▶ bias =  $2^{k-1} 1$
- bias is the k-bit unsigned integer: 011..111

## For normalized numbers, E = exp-bias

In other words, exp = E+bias

property	float	double
k	8	11
bias	127	1023
smallest E (greatest precision)	-126	-1022
largest E (greatest range)	127	1023

Table: Summary of normalized exp field

Normalized: frac field

M = 1.frac

## Normalized: example

- 12.375 to single-precision floating point
- ▶ sign is positive so s=0
- ▶ binary is 1100.011<sub>2</sub>
- in other words it is  $1.100011_2 \times 2^3$
- $\exp = E + \text{bias} = 3 + 127 = 130 = 1000_0010_2$

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- ▶ M = 1.100011<sub>2</sub> = 1.frac
- ▶ frac = 100011

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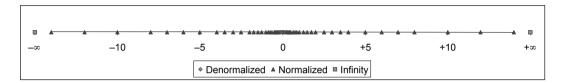


Figure: Full picture of number line for floating point values. Image credit CS:APP

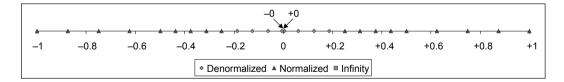


Figure: Zoomed in number line for floating point values. Image credit CS:APP

## Denormalized: exp field

#### For denormalized numbers, exp = 0

#### Bias

- need a bias to represent negative exponents
- ▶ bias =  $2^{k-1} 1$
- bias is the k-bit unsigned integer: 011..111

## For denormalized numbers, E = 1-bias

property	float	double
k bias	8	11
bias	127	1023
Ε	-126	-1022

Table: Summary of denormalized exp field

## Denormalized: frac field

#### M = 0.frac value represented leading with 0

### Denormalized: examples

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## Floats: Special cases

number class	when it arises	exp field	frac field
+0 / -0		0	0
+infinity / -infinity	overflow or division by 0	$2^{k} - 1$	0
NaN not-a-number	illegal ops. such as $\sqrt{-1}$ , inf-inf, inf*0	$2^{k} - 1$	non-0

Table: Summary of special cases

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## Floats: Summary

	normalized	denormalized
value of number	$(-1)^s  imes M  imes 2^E$	$(-1)^s  imes M  imes 2^E$
E		E = -bias + 1
bias	$2^{k-1} - 1$	$2^{k-1} - 1$
exp	$0 < exp < (2^k - 1)$	exp = 0
M	M = 1.frac	M = 0.frac
	M has implied leading 1	M has leading 0
	greater range large magnitude numbers denser near origin	greater precision small magnitude numbers evenly spaced

Table: Summary of normalized and denormalized numbers