

Floating Point

15-213/18-213/14-513/15-513/18-613: Introduction to Computer Systems 4th Lecture, Sept. 10, 2020

Announcements

- Lab 0 due today 11:59 pm ET
- Lab 1 went out on Tuesday, due 9/17
 - Puzzles can be tricky, so start early
- Written Assignment 1 released yesterday, due 9/16
 - Available on canvas. Hand-in via canvas
- Bootcamp 3 is Friday 7-9 pm ET
 - Debugging & gdb
- First Recitations are Monday
 - Students requesting in-person recitations will get assigned to an in-person recitation section

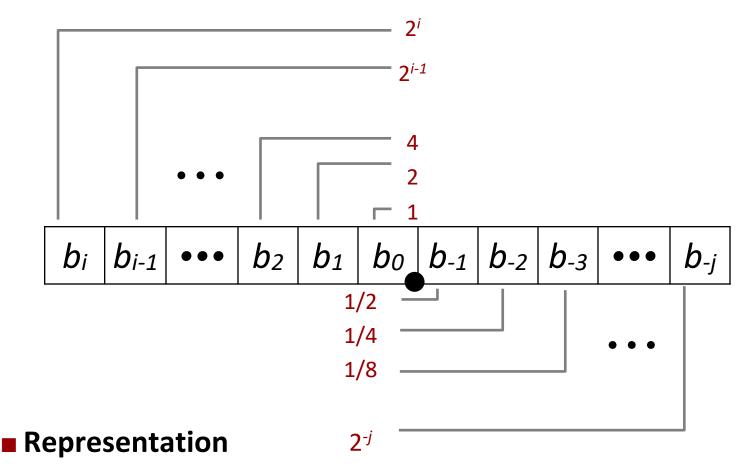
Today: Floating Point

- Background: Fractional binary numbers
- IEEE floating point standard: Definition
- Example and properties
- Rounding, addition, multiplication
- Floating point in C
- Summary

Fractional binary numbers

■ What is 1011.101₂?

Fractional Binary Numbers



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

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

Fractional Binary Numbers: Examples

Value

Representation

$$101.11_2$$

$$1.0111_{2}$$

$$= 4 + 1 + 1/2 + 1/4$$

$$= 2 + 1/2 + 1/4 + 1/8$$

$$= 1 + 1/4 + 1/8 + 1/16$$

Observations

- Divide by 2 by shifting right (unsigned)
- Multiply by 2 by shifting left
- Numbers of form 0.1111111...2 are just below 1.0

■
$$1/2 + 1/4 + 1/8 + ... + 1/2^i + ... \rightarrow 1.0$$

■ Use notation 1.0 – ε

Representable Numbers

Limitation #1

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

```
Value Representation
1/3 0.01010101[01]...2
1/5 0.001100110011[0011]...2
1/10 0.0001100110011[0011]...2
```

Limitation #2

- Just one setting of binary point within the w bits
 - Limited range of numbers (very small values? very large?)

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IEEE Floating Point

IEEE Standard 754

- Established in 1985 as uniform standard for floating point arithmetic
 - Before that, many idiosyncratic formats
- Supported by all major CPUs
- Some CPUs don't implement IEEE 754 in full e.g., early GPUs, Cell BE processor

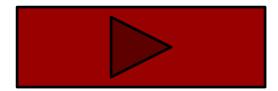
Driven by numerical concerns

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

This is important!

Ariane 5 explodes on maiden voyage: \$500 MILLION dollars lost

- 64-bit floating point number assigned to 16-bit integer (1996)
- Legacy code from Ariane 4 with a lower top speed
- Causes rocket to get incorrect value of horizontal velocity and crash

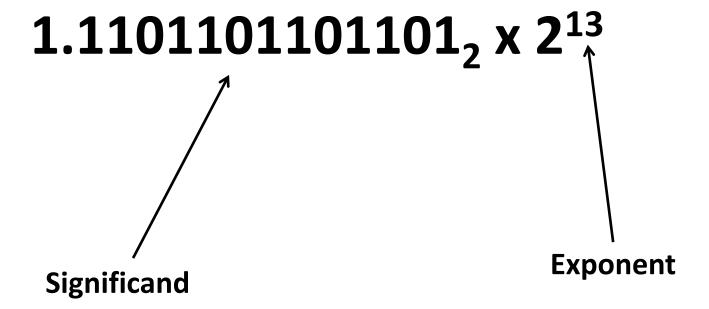


■ Patriot Missile defense system misses scud – 28 people die

- System tracks time in tenths of second
- Converted from integer to floating point number.
- Accumulated rounding error causes drift. 20% drift over 8 hours.
- Eventually (on 2/25/1991 system was on for 100 hours) causes range misestimation sufficiently large to miss incoming missiles.

(Binary) Scientific Notation

What are the parts of a number in scientific notation?



What value does the significand always begin with in scientific notation?

Floating Point Representation

Numerical Form:

Example: $15213_{10} = (-1)^0 \times 1.1101101101101_2 \times 2^{13}$

 $(-1)^{s} M 2^{E}$

- Sign bit s determines whether number is negative or positive
- Significand M normally a fractional value in range [1.0,2.0).
- **Exponent** *E* weights value by power of two

Encoding

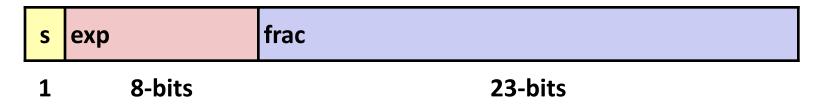
- MSB s is sign bit s
- exp field encodes E (but is not equal to E)
- frac field encodes M (but is not equal to M)

S	ехр	frac
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Precision options

Single precision: 32 bits

 \approx 7 decimal digits, $10^{\pm 38}$



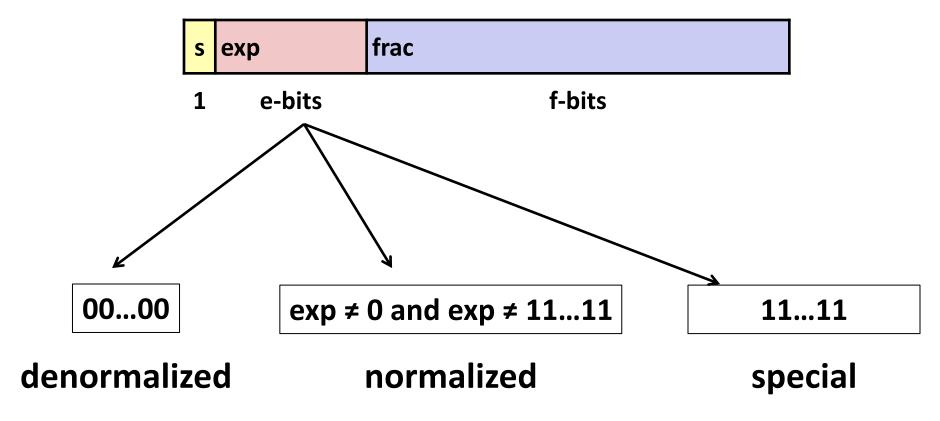
Double precision: 64 bits

 \approx 16 decimal digits, $10^{\pm 308}$



Other formats: half precision, quad precision

Three "kinds" of floating point numbers



"Normalized" Values

 $v = (-1)^s M 2^E$

- When: exp ≠ 000...0 and exp ≠ 111...1
- **Exponent coded as a biased value:** $E = \exp Bias$
 - exp: unsigned value of exp field
 - $Bias = 2^{k-1} 1$, where k is number of exponent bits
 - Single precision: 127 (exp: 1...254, E: -126...127)
 - Double precision: 1023 (exp: 1...2046, E: -1022...1023)
- Significand coded with implied leading 1: M = 1.xxx...x2
 - xxx...x: bits of frac field
 - Minimum when frac=000...0 (M = 1.0)
 - Maximum when **frac**=111...1 (M = 2.0ε)
 - Get extra leading bit for "free"

Normalized Encoding Example

$$v = (-1)^s M 2^E$$

 $E = \exp - Bias$

- Value: float F = 15213.0;
 - $15213_{10} = 11101101101101_2$ = $1.1101101101101_2 \times 2^{13}$

Significand

$$M = 1.101101101_2$$

frac= $101101101101_000000000_2$

Exponent

$$E = 13$$
 $Bias = 127$
 $exp = 140 = 10001100_{2}$

Result:

0 10001100 1101101101101000000000

s exp

frac

Denormalized Values

$$v = (-1)^{s} M 2^{E}$$

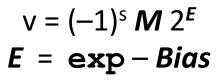
 $E = 1 - Bias$

- **Condition:** exp = 000...0
- **Exponent value:** E = 1 Bias (instead of exp Bias) (why?)
- Significand coded with implied leading 0: M = 0.xxx...x₂
 - xxx...x: bits of frac
- Cases
 - exp = 000...0, frac = 000...0
 - Represents zero value
 - Note distinct values: +0 and -0 (why?)
 - exp = 000...0, $frac \neq 000...0$
 - Numbers closest to 0.0
 - Equispaced

Special Values

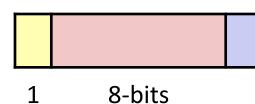
- **■** Condition: exp = 111...1
- Case: exp = 111...1, frac = 000...0
 - Represents value ∞ (infinity)
 - Operation that overflows
 - Both positive and negative
 - E.g., $1.0/0.0 = -1.0/-0.0 = +\infty$, $1.0/-0.0 = -\infty$
- Case: exp = 111...1, frac ≠ 000...0
 - Not-a-Number (NaN)
 - Represents case when no numeric value can be determined
 - E.g., sqrt(-1), $\infty \infty$, $\infty \times 0$

float: 0xC0A00000



$$Bias = 2^{k-1} - 1 = 127$$

binary:



23-bits

E =

S =

M =

 $v = (-1)^s M 2^E =$

He	Oe	BILL
0	0	0000
1	1	0001
2	2	0010
3	თ	0011
4	4	0100
1 2 3 4 5 6 7	1 2 3 4 5	0101
6	6	0110
7	7	0111
8	8	1000
	9	1001
Α	10	1010
В	11	1011
A B C D	12	1100
D	13	1101
E	14	1110
F	15	1111

 $v = (-1)^s M 2^E$ $E = \exp - Bias$

float: 0xC0A00000

1 1000 0001 010 0000 0000 0000 0000 0000

1 8-bits 23-bits

E =

S =

M = 1.

 $v = (-1)^s M 2^E =$

A В

E

float: 0xC0A00000

$$v = (-1)^s M 2^E$$

 $E = \exp - Bias$

$$Bias = 2^{k-1} - 1 = 127$$

1 1000 0001 010 0000 0000 0000 0000 0000

1 8-bits

23-bits

$$E = exp - Bias = 129 - 127 = 2$$
 (decimal)

S = **1** -> negative number

M = 1.010 0000 0000 0000 0000 0000= 1 + 1/4 = 1.25

$$v = (-1)^s M 2^E = (-1)^1 * 1.25 * 2^2 = -5$$

Hex Decimanary

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

 $V = (-1)^s M 2^E$ E = 1 - Bias

float: 0x001C0000

<u>0000</u> <u>0001</u> <u>1100</u> <u>0000</u> <u>0000</u> **binary:** 0000

> 0000 0000 001 1100 0000 0000 0000 0000

23-bits 8-bits

E =

S =

 $\mathbf{M} = \mathbf{0}$

 $v = (-1)^s M 2^E =$

0 0000 0001 0010 0011 0100 0101 0110 0111 8 1000 1001 10

1010

1011

1100

1101

1110

1111

A

В

E

11

12

13

14

15

float: 0x001C0000

$$v = (-1)^{s} M 2^{E}$$

 $E = 1 - Bias$

$$Bias = 2^{k-1} - 1 = 127$$

0	0000 0000	001 1100 0000 0000 0000 0000
1	8-bits	23-bits

$$E = 1 - Bias = 1 - 127 = -126$$
 (decimal)

S = **0** -> positive number

$$M = 0.001 \ 1100 \ 0000 \ 0000 \ 0000 \ 0000$$

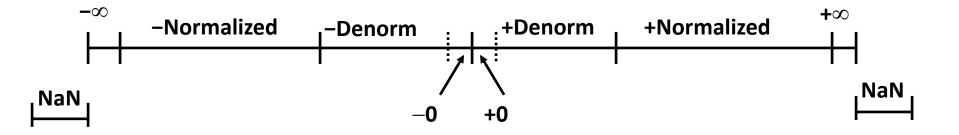
= $1/8 + 1/16 + 1/32 = 7/32 = 7*2^{-5}$

$$v = (-1)^s M 2^E = (-1)^0 * 7*2^{-5} * 2^{-126} = 7*2^{-131}$$

 $\approx 2.571393892 \times 10^{-39}$

A В C

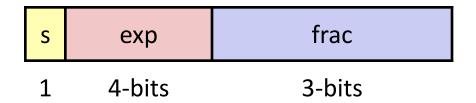
Visualization: Floating Point Encodings



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Tiny Floating Point Example



8-bit Floating Point Representation

- the sign bit is in the most significant bit
- the next four bits are the exp, with a bias of 7
- the last three bits are the frac

Same general form as IEEE Format

- normalized, denormalized
- representation of 0, NaN, infinity

 $v = (-1)^s M 2^E$

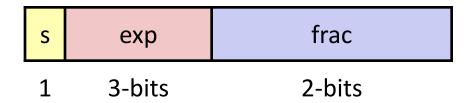
Dynamic Range (s=0 only)

Dynamic Range (s=0 only)						norm: E = exp - Bias	
	s	exp	frac	E	Value		denorm: E = 1 – Bias
	0	0000	000	-6	0	L	
	0	0000	001	-6	1/8*1/64 =	1/512	closest to zero
Denormalized	0	0000	010	-6	2/8*1/64 =	2/512	$(-1)^{0}(0+1/4)*2^{-6}$
numbers	•••						
	0	0000	110	-6	6/8*1/64 =	6/512	
	0	0000	111	-6	7/8*1/64 =	7/512	largest denorm
	0	0001	000	-6	8/8*1/64 =	8/512	smallest norm
	0	0001	001	-6	9/8*1/64 =	9/512	$(-1)^{0}(1+1/8)*2^{-6}$
	•••						
	0	0110	110	-1	14/8*1/2 =	14/16	
	0	0110	111	-1	15/8*1/2 =	15/16	closest to 1 below
Normalized	0	0111	000	0	8/8*1 =	1	
numbers	0	0111	001	0	9/8*1 =	9/8	closest to 1 above
	0	0111	010	0	10/8*1 =	10/8	
	0	1110	110	7	14/8*128 =	224	
	0	1110	111	7	15/8*128 =	240	largest norm
	0	1111	000	n/a	inf		

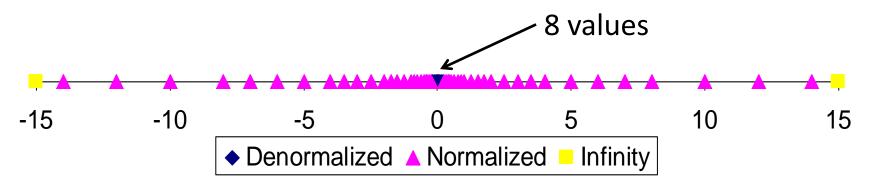
Distribution of Values

6-bit IEEE-like format

- e = 3 exponent bits
- f = 2 fraction bits
- Bias is $2^{3-1}-1=3$



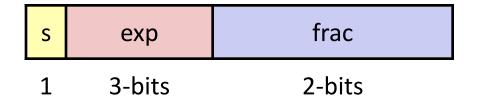
■ Notice how the distribution gets denser toward zero.

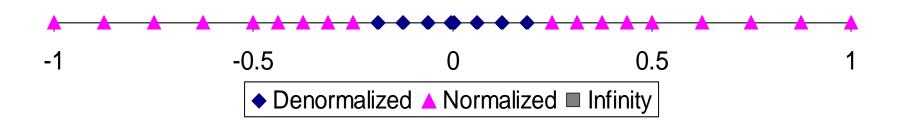


Distribution of Values (close-up view)

6-bit IEEE-like format

- e = 3 exponent bits
- f = 2 fraction bits
- Bias is 3





Special Properties of the IEEE Encoding

- **FP Zero Same as Integer Zero**
 - All bits = 0

■ Can (Almost) Use Unsigned Integer Comparison

- Must first compare sign bits
- Must consider -0 = 0
- NaNs problematic
 - Will be greater than any other values
 - What should comparison yield? The answer is complicated.
- Otherwise OK
 - Denorm vs. normalized
 - Normalized vs. infinity

Quiz Time!

Check out:

https://canvas.cmu.edu/courses/17808

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Floating Point Operations: Basic Idea

$$\mathbf{x} +_{\mathbf{f}} \mathbf{y} = \text{Round}(\mathbf{x} + \mathbf{y})$$

$$\mathbf{x} \times_{\mathbf{f}} \mathbf{y} = \text{Round}(\mathbf{x} \times \mathbf{y})$$

Basic idea

- First compute exact result
- Make it fit into desired precision
 - Possibly overflow if exponent too large
 - Possibly round to fit into frac

Rounding

Rounding Modes (illustrate with \$ rounding)

	\$1.40	\$1.60	\$1.50	\$2.50	-\$1.50
Towards zero	\$1↓	\$1↓	\$1 ↓	\$2 ↓	-\$1 ↑
Round down ($-\infty$)	\$1 ↓	\$1↓	\$1 ↓	\$2 ↓	-\$2↓
Round up $(+\infty)$	\$2 1	\$2 1	\$2 1	\$3 1	-\$1 ↑
Nearest Even* (default)	\$1↓	\$2 1	\$2 🕇	\$2 ↓	- \$2 ↓

^{*}Round to nearest, but if half-way in-between then round to nearest even

Closer Look at Round-To-Even

Default Rounding Mode

- Hard to get any other kind without dropping into assembly
 - C99 has support for rounding mode management
- All others are statistically biased
 - Sum of set of positive numbers will consistently be over- or underestimated

Applying to Other Decimal Places / Bit Positions

- When exactly halfway between two possible values
 - Round so that least significant digit is even
- E.g., round to nearest hundredth

7.8949999	7.89	(Less than half way)
7.8950001	7.90	(Greater than half way)
7.8950000	7.90	(Half way—round up)
7.8850000	7.88	(Half way—round down)

Rounding Binary Numbers

Binary Fractional Numbers

- "Even" when least significant bit is 0
- "Half way" when bits to right of rounding position = 100...2

Examples

Round to nearest 1/4 (2 bits right of binary point)

Value	Binary	Rounded	Action	Rounded Value
2 3/32	10.000112	10.002	(<1/2—down)	2
2 3/16	10.00110 ₂	10.012	(>1/2—up)	2 1/4
2 7/8	10.11 <mark>100</mark> 2	11.0 <mark>0</mark> 2	(1/2—up)	3
2 5/8	10.10 <mark>100</mark> 2	10.1 <mark>0</mark> 2	(1/2—down)	2 1/2

Rounding

1.BBGRXXX

Guard bit: LSB of result

Sticky bit: OR of remaining bits

Round bit: 1st bit removed

Round up conditions

- Round = 1, Sticky = $1 \rightarrow > 0.5$
- Guard = 1, Round = 1, Sticky = 0 → Round to even

Fraction	GRS	Incr?	Rounded
1.0000000	000	N	1.000
1.1010000	100	N	1.101
1.0001000	010	N	1.000
1.0011000	11 0	Y	1.010
1.0001010	011	Y	1.001
1.111 <mark>1</mark> 100	111	Y	10.000

FP Multiplication

- \blacksquare $(-1)^{s1} M1 2^{E1} \times (-1)^{s2} M2 2^{E2}$
- Exact Result: $(-1)^s M 2^E$
 - Sign s: s1 ^ s2
 - Significand *M*: *M1* x *M2*
 - Exponent *E*: *E1* + *E2*

Fixing

- If $M \ge 2$, shift M right, increment E
- If E out of range, overflow
- Round M to fit frac precision

■ Implementation

Biggest chore is multiplying significands

4 bit significand:
$$1.010*2^2 \times 1.110*2^3 = 10.0011*2^5$$

= $1.00011*2^6 = 1.001*2^6$

Floating Point Addition

- - **A**ssume *E1* > *E2*
- **Exact Result:** $(-1)^s M 2^E$
 - ■Sign *s*, significand *M*:
 - Result of signed align & add
 - Exponent *E*: *E1*

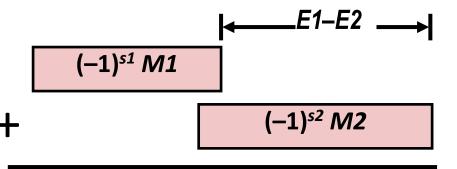
Fixing

- ■If $M \ge 2$, shift M right, increment E
- •if M < 1, shift M left k positions, decrement E by k
- Overflow if E out of range
- Round M to fit frac precision

$$1.010*2^{2} + 1.110*2^{3} = (0.1010 + 1.1100)*2^{3}$$

= $10.0110 * 2^{3} = 1.00110 * 2^{4} = 1.010 * 2^{4}$

Get binary points lined up



Mathematical Properties of FP Add

Compare to those of Abelian Group

Closed under addition?

Yes

But may generate infinity or NaN

Commutative?

Yes

Associative?

No

Overflow and inexactness of rounding

-(3.14+1e10)-1e10 = 0, 3.14+(1e10-1e10) = 3.14

0 is additive identity?

Yes

Every element has additive inverse?

Almost

Yes, except for infinities & NaNs

Monotonicity

■ $a \ge b \Rightarrow a+c \ge b+c$?

Almost

Except for infinities & NaNs

Mathematical Properties of FP Mult

Compare to Commutative Ring

Closed under multiplication?

Yes

But may generate infinity or NaN

• Multiplication Commutative?

Yes

• Multiplication is Associative?

No

Possibility of overflow, inexactness of rounding

Ex: (1e20*1e20) *1e-20= inf, 1e20* (1e20*1e-20) = 1e20

1 is multiplicative identity?

Yes

Multiplication distributes over addition?

No

Possibility of overflow, inexactness of rounding

-1e20*(1e20-1e20)=0.0, 1e20*1e20 - 1e20*1e20 = NaN

Monotonicity

• $a \ge b \& c \ge 0 \Rightarrow a * c \ge b * c$?

Almost

Except for infinities & NaNs

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Floating Point in C

C Guarantees Two Levels

- float single precision
- double double precision

Conversions/Casting

- Casting between int, float, and double changes bit representation
- double/float → int
 - Truncates fractional part
 - Like rounding toward zero
 - Not defined when out of range or NaN: Generally sets to TMin
- int → double
 - Exact conversion, as long as int has ≤ 53 bit word size
- int → float
 - Will round according to rounding mode

Floating Point Puzzles

■ For each of the following C expressions, either:

- Argue that it is true for all argument values
- Explain why not true

```
int x = ...;
float f = ...;
double d = ...;
```

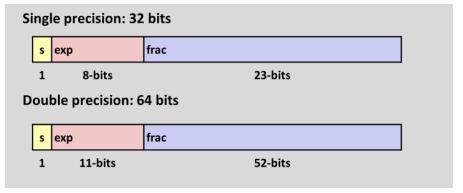
Assume neither **d** nor **f** is NaN

```
• x == (int)(float) x
• x == (int) (double) x
f == (float) (double) f
• d == (double) (float) d
• f == -(-f);
• 2/3 == 2/3.0
• d < 0.0 \Rightarrow ((d*2) < 0.0)
• d > f \Rightarrow -f > -d
• d * d >= 0.0
• (d+f)-d == f
```

Summary

- IEEE Floating Point has clear mathematical properties
- Represents numbers of form M x 2^E
- One can reason about operations independent of implementation
 - As if computed with perfect precision and then rounded
- Not the same as real arithmetic
 - Violates associativity/distributivity
 - Makes life difficult for compilers & serious numerical applications

programmers



Additional Slides

Creating Floating Point Number

Steps

- Normalize to have leading 1
- Round to fit within fraction

s exp frac

1 4-bits 3-bits

Postnormalize to deal with effect	is of rounding
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Case Study

Convert 8-bit unsigned numbers to tiny floating point format

Example Numbers

128	10000000
15	00001101
33	00010001
35	00010011
138	10001010
63	00111111

Normalize

S	ехр	frac
 1	4-bits	3-bits

Requirement

- Set binary point so that numbers of form 1.xxxxx
- Adjust all to have leading one
 - Decrement exponent as shift left

Value	Binary	Fraction	Exponent
128	1000000	1.0000000	7
15	00001101	1.1010000	3
17	00010001	1.0001000	4
19	00010011	1.0011000	4
138	10001010	1.0001010	7
63	00111111	1.1111100	5

Postnormalize

Issue

- Rounding may have caused overflow
- Handle by shifting right once & incrementing exponent

Value	Rounded	Exp	Adjusted	Numeric Result
128	1.000	7		128
15	1.101	3		15
17	1.000	4		16
19	1.010	4		20
138	1.001	7		134
63	10.000	5	1.000/6	64

Interesting Numbers

{single,double}

Description	exp	frac	Numeric Value
Zero	0000	0000	0.0
Smallest Pos. Denorm.	0000	0001	$2^{-\{23,52\}} \times 2^{-\{126,1022\}}$
■ Single $\approx 1.4 \times 10^{-45}$			
■ Double $\approx 4.9 \times 10^{-324}$			
Largest Denormalized	0000	1111	$(1.0 - \varepsilon) \times 2^{-\{126,1022\}}$
■ Single $\approx 1.18 \times 10^{-38}$			
■ Double $\approx 2.2 \times 10^{-308}$			
Smallest Pos. Normalized	0001	0000	1.0 x $2^{-\{126,1022\}}$
Just larger than largest deno	rmalized		
One	0111	0000	1.0
Largest Normalized	1110	1111	$(2.0 - \varepsilon) \times 2^{\{127,1023\}}$
Single ≈ 3.4 x 10 ³⁸			

■ Double $\approx 1.8 \times 10^{308}$