# Data Representation: floating point. 

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## Looking ahead

## Class plan

1. Today, Thursday, 2/18: Floats.
2. 2/18-2/22: Quiz 5 . Weekly short quiz on bits, bytes, integers.
3. Tuesday, 2/23: Floats / rounding. Introduction to the software-hardware interface.
4. Thursday, 2/25: Programming assignment 3: data representations.

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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

- $.625=.5+.125=0000.1010_{2}$
- $1001.1000_{2}=9+.5=9.5$


## 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

Avogadro's number
$+6.02214 \times 10^{23} \mathrm{~mol}^{-1}$
Scientific notation

- sign
- mantissa or significand
- exponent
$0.602214 * 10^{\wedge} 24$
60.2214 * $10^{\wedge} 22$
602.214 * $10^{\wedge} 21$


## 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
$3130 \quad 2322$

| s | $\exp$ | frac |
| :--- | :--- | :--- |

## Double precision



31
frac (31:0)

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

## Floats and doubles

| property | float | double |
| ---: | :--- | :--- |
| total bits | 32 | 64 |
| s bit | 1 | 1 |
| exp bits | 8 | 11 |
| frac bits | 23 | 52 |
| C printf() format specifier | "\%f" | "\%lf" |

Table: Properties of floats and doubles

## 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

## 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


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 $\mathrm{E}, \mathrm{M}$

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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: $011 . .111$

| 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
For normalized numbers,
$\mathrm{E}=$ exp-bias
In other words, $\exp =\mathrm{E}+$ bias

## Normalized: frac field

$M=1$.frac

## Normalized: example

- 12.375 to single-precisionfloating point $12.375=8+4+0+0+0+0.25+0.125$
- sign is positive so $s=0$
- binary is $1100.011_{2}$
- in other words it is $1.100011_{2} \times 2^{3}$
- $\exp =E+$ bias $=3+127=130=1000 \_0010_{2}$
- $\mathrm{M}=1.100011_{2}=1$.frac
- $\mathrm{frac}=100011$


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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

## 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, $\mathrm{E}=1$-bias

| property | float | double |
| ---: | :--- | :--- |
| k | 8 | 11 |
| bias | 127 | 1023 |
| E | -126 | -1022 |

Table: Summary of denormalized exp field

## Denormalized: frac field

$$
\begin{aligned}
& \mathrm{M}=0 . \text { frac } \\
& \text { value represented leading with } 0
\end{aligned}
$$

## 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 | $(-1)^{s} \times M \times 2^{E}$ | $(-1)^{s} \times M \times 2^{E}$ |
| E | $\mathrm{E}=\operatorname{exp-bias}$ | $\mathrm{E}=-$ bias +1 |
| bias | $2^{k-1}-1$ | $2^{k-1}-1$ |
| $\exp$ | $0<\exp <\left(2^{k}-1\right)$ | $\exp =0$ |
| M | $\mathrm{M}=1$.frac | $\mathrm{M}=0$. frac |
|  | M has implied leading 1 | M has leading 0 |
|  | greater range <br>  <br>  <br> large magnitude numbers <br> denser near origin | greater precision |
|  |  |  |
|  |  |  |

Table: Summary of normalized and denormalized numbers

