# Representing and Manipulating Information: Floating point mastery 

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March 2, 2023

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## Quizzes and programming assignments

Short quiz 4

- Due Friday. All about integers.

Programming assignment 3

- Has been out, due Friday before spring break.


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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


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

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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-precision floating point
- 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

## 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

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## Deep understanding 1: Why is exp field encoded using bias?

exp field needs to encode both positive and negative exponents.
Why not just use one of the signed integer formats? 2's complement, $1 \mathrm{~s}^{\prime}$ complement, signed magnitude?

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Answer: allows easy comparison of magnitudes by simply comparing bits.

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Answer: allows easy comparison of magnitudes by simply comparing bits.

Consider hypothetical 8-bit floating point format (from the textbook)
1 -bit sign, $k=4$-bit exp, 3 -bit frac.

What is the decimal value of 0b1_0110_111?

> What is the decimal value of 0b1_0111_000?

## Deep understanding 1: Why is exp field encoded using bias?

$\exp$ field needs to encode both positive and negative exponents.
Why not just use one of the signed integer formats? 2's complement, $1 \mathrm{~s}^{\prime}$ complement, signed magnitude?

Answer: allows easy comparison of magnitudes by simply comparing bits.

Consider hypothetical 8-bit floating point format (from the textbook) 1-bit sign, $k=4$-bit exp, 3-bit frac.
What is the decimal value of 0b1_0110_111?
$-1.875 \times 2^{-1}$
What is the decimal value of 0b1_0111_000?
$-2.000 \times 2^{-1}$

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## Deep understanding 2: Why have denormalized numbers?

Why not just continue normalized number scheme down to smallest numbers around zero?
Answer: makes sure that smallest increments available are maintained around zero.

Suppose denormalized numbers NOT used.

| What is the decimal | What is the decimal | What is the decimal |
| :--- | :--- | :--- |
| value of 0 b0 $0 \_000 \_\_001$ ? | value of 0 b0 $00000 \_111 ?$ | value of $0 \mathrm{~b} 0 \_0001 \_000 ?$ <br> $1.125 \times 2^{-7}$ |
| $1.875 \times 2^{-7}$ | $2.000 \times 2^{-7}$ |  |

## Deep understanding 2: Why have denormalized numbers?

Why not just continue normalized number scheme down to smallest numbers around zero?
Answer: makes sure that smallest increments available are maintained around zero.

Suppose denormalized numbers ARE used.

| What is the decimal | What is the decimal | What is the decimal |
| :--- | :--- | :--- |
| value of 0 b0 $0 \_000 \_001$ ? | value of 0 b0 $0000 \_111 ?$ | value of $0 \mathrm{~b} 0 \_0001 \_000 ?$ |
| $0.125 \times 2^{-6}$ | $0.875 \times 2^{-6}$ | $1.000 \times 2^{-6}$ |

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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

