

# 02 – Numerical Representations

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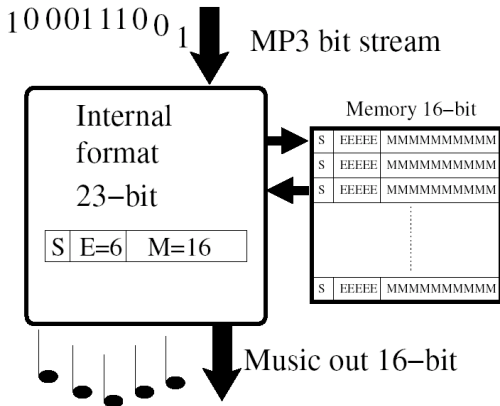
# Today's lecture

- Finite length effects, continued from Lecture 1
  - Floating-point (continued from Lecture 1)
  - Rounding
  - Overflow handling

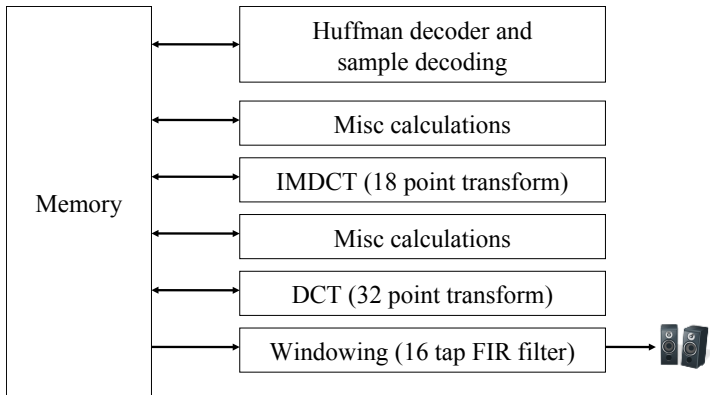
## Discussion break

- *If you are designing an application specific processor where you need floating-point numbers, can you reduce the hardware cost by using a custom FP format?*
- For reference: Single precision IEEE-754:
  - 23 bit mantissa (with implicit one)
  - 8 bit exponent
  - 1 sign bit
  - Other features:
    - Rounding (Round to  $+\infty$ ,  $-\infty$ , 0, and round to nearest even)
    - Subnormal numbers (sometimes called denormalized numbers)

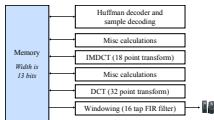
## Example: Floating-point Audio Processing



## Example: MPEG-1 Layer III (also known as MP3) decoding



## Demo (from last lecture): MP3 decoding with 13 bits wide memory



- 13-bit wide memory for intermediate results (16 was used in the actual research, but we are exaggarating the effects using 13 bits)
- Two alternatives
  - Fixed-point data for all intermediate results in memory
  - Floating-point data for all intermediate results in

## ASIP floating-point

- May not adhere to IEEE754 features:
  - Number of bits for exponent/mantissa
  - Rounding modes
  - Exception handling
  - Denormalized numbers
  - May use different base (e.g.  $(-1)^s \times m \times 16^e$  instead of  $(-1)^s \times m \times 2^e$  (A good choice for FPGA based floating-point adders due to the high cost of shifters))

## Block floating-point

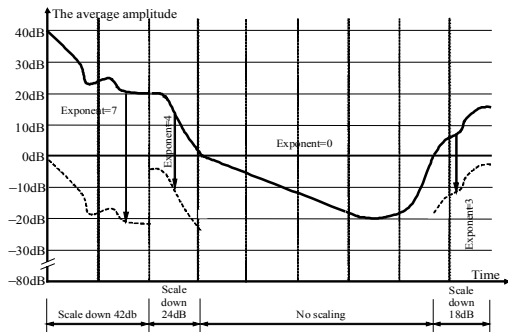
- A fixed-point processor does not have a floating-point hardware unit
- Floating-point computations can be emulated by fixed-point DSP processors when larger dynamic range is required
  - (But this is slow!)



## Block floating-point

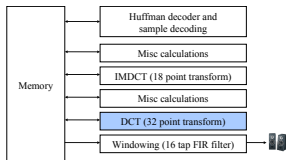
- Block floating-point (also called dynamic signal scaling technique) is an emulation method that is commonly used on fixed-point DSP processors to achieve some of the advantages of floating-point number formats
- Idea: Analyze dynamic range of a block of numbers (Before running an FFT or DCT for example)
  - Scale all values so that overflow is narrowly avoided
  - This will use the available bits as efficiently as possible

## Block floating-point



[Liu2008, figure 2.9]

## Block floating-point example of a DCT



- First version: 24-bit fixed-point
  - More or less perfect sound
- Second version: 14-bit fixed-point
- Third version: 14-bit fixed-point with dynamic scaling of input values

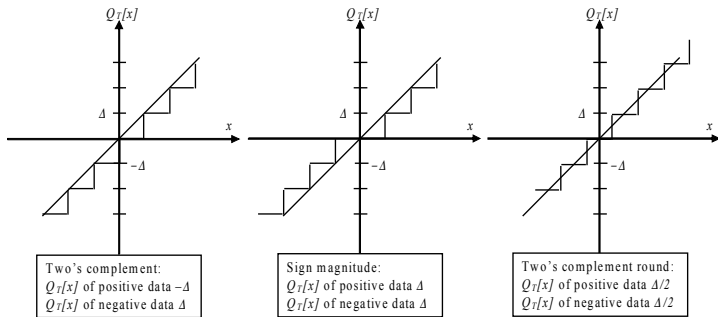
## Finite length DSP: The problem

- A challenge to get the best available precision on the results under a precision-limited datapath and storage system – **Focus of the textbook and this course**
  - First problem: finite resolution of A/D converter
  - Second problem: DSP processors are typically fixed-point to minimize silicon cost
  - Third problem: extra quantization error introduced while scaling down signals within a finite data length system

## A few definitions

- **Definition 1: truncation**
  - To convert a longer numerical format to a shorter one by simply cutting off bits at the LSB part
- **Definition 2: quantization error**
  - The numerical error introduced when a longer numeric format is converted (truncated) to a shorter one

## Quantization errors



*Liu2008 figure 2.11 (with bug in rightmost part corrected!)*

## Round operation

- Why: To eliminate bias errors after truncation.  
(Adds approx.  $3dB$  to the Signal-to-Noise ratio)
- To round up the truncated part: Use the truncated MSB as the carry in of an add operation
- Hardware implementation 1: Mask the kept part and add to the original
- Hardware implementation 2: MSB of truncated part as the carry in

## Round operation

- In certain scenarios you may be concerned with bias caused by rounding
  - Round to nearest even (IEEE-754)



## A cautionary tale

- Saudi Arabia, february 25th, 1991
- An incoming Iraqi Scud missile impacts an army barracks killing 28 soldiers
- Cause: A software bug in the fixed-point math

## Discussion break

- Why did things go wrong?
- System description:
  - Time is stored as a fixed-point value
  - Time is incremented every 100 ms by  $1/10$

## Discussion break

- Why did things go wrong?
- System description:
  - Time is stored as a fixed-point value
  - Time is incremented every 100 ms by  $1/10$
  - **Hint:** How do you represent  $1/10$  in a fixed-point format?

## Patriot missile bug

- $1/10$  cannot be represented exactly using a binary fixed-point number (nor as a (binary) floating-point number)
  - $1/10$  is  $0.0001100110011001100110011\dots$  in base 2
- After the missile battery had been operational for over 100 hours the time has drifted by  $\approx 0.34$  s
- An incoming Scud travels at 1.7 km/s, thus the missile battery's tracking was off by over half a kilometer, causing the range gate of the radar to be missed
- For more information, see: [http://sydney.edu.au/engineering/it/~alum/patriot\\_bug.html](http://sydney.edu.au/engineering/it/~alum/patriot_bug.html)

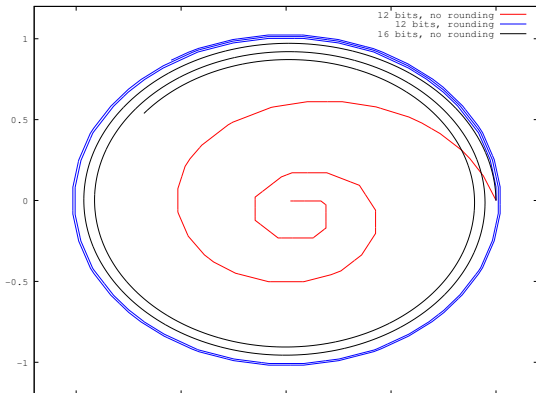
## Demonstration of rounding effects

- Most of the time you will gain about half a bit when doing proper rounding
- However, in some cases you will get significantly better results
- Example: Iterated vector rotation

## Demonstration of rounding effects: Iterated vector rotation

- $X_0 = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$
- $a = 0.003$
- $X_{n+1} = \begin{pmatrix} \cos(a) & -\sin(a) \\ \sin(a) & \cos(a) \end{pmatrix} X_n$
- If you do not round the rotation matrix and  $X$  properly you'll get pretty bad results

## Demonstration of rounding effects: Iterated vector rotation



## Overflow, saturation, and guard bits

- **Overflow:** if the result of a (fractional) calculation ( $X$ ) is not in the range  $-1 \leq X < 1$
- **Common reasons for overflow:**
  - When the result is too large (or small)
  - Too many accumulations



## Ways to deal with fixed-point overflow

- Ignore it
- Use a floating-point processor instead
- Redo calculation with scaled down input data
  - Tricky for real-time systems
- Exception → System restart
- Use guard bits and saturation arithmetic

## Ways to deal with fixed-point overflow

- Ignore it
  - May or may not be a good idea. See Ariane 501 for an example where it was a bad idea...
- Use a floating-point processor instead
- Redo calculation with scaled down input data
  - Tricky for real-time systems
- Exception → System restart
- Use guard bits and saturation arithmetic

## Managing overflow: Saturation/guard

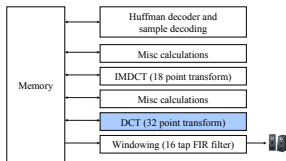
- Most popular way in DSP systems
- What is guard
  - Add more sign extension bits to operands
  - Increasing the range to:  $-2^G \leq x < 2^G$

## Managing overflow: Saturation/guard

```
if(result >= 1.0) {  
    final_result = 0.99999;  
} else if(result <= -1.0) {  
    final_result = -1.0  
} else {  
    final_result = result;  
}
```

- Performed after an iterative accumulation
  - Do not do it during a convolution
  - Often better than exception for hard-real time system

## Managing overflow: Saturation/guard



- Example of overflow vs saturation
  - Same DCT example as for block floating-point

## Discussion break

- What is the correct execution order for the following steps?
  - Truncation and saturation
  - Remove guard bits
  - DSP Kernel computations
  - Add guard bits
  - Round
- **Hint:** Think of a simple scalar product where the input is in fractional format and the output should be in fractional format
- $\sum_{i=1}^N x_i \times y_i$

## Correct execution order

- Add guard bits
- DSP Kernel computations
- Round
- Truncation and saturation
- Remove guard bits

## Corner cases

- When verifying a system it makes sense to concentrate on corner cases that exercises the system in unusual ways
- Example: Corner cases for a divider may be  $\text{MAX\_VAL}/\text{MAX\_VAL}$ ,  $\text{MAX\_VAL}/1$ ,  $1/\text{MAX\_VAL}$ ,  $0/1$ ,  $0/\text{MAX\_VAL}$ ,  $1/0$ ,  $0/0$ ,  $\text{MAX\_VAL}/0$ , and similar cases



## Corner case, fractional multiplication

- Remember, a fractional number can be between  $-1$  and  $1 - 2^{n-1}$  (inclusive)
- Do you see any problems with a fractional multiplier which gives a fractional result?
- Expression for fractional multiplication:
  - `tmp[2*n-1:0] = $signed(a)*$signed(b)`
  - `result=tmp[2*n-2:n-1]`

## Corner case, fractional multiplication

- $(-1) \times (-1) = 1$  (Answer cannot be represented in fractional!)
- (If not taken into account, the fractional multiplier will produce a  $-1$  in this case.)
- How to handle? Probably best to saturate the result to  $0.1111111111\dots$
- (Do you think it is unlikely that you will get a  $-1$ ? What about a broken sensor?)

## Corner case, absolute operation

- Same problem, what about  $| - 1 |$ ?
- Without guard/saturation:
  - $ABS(1000) = INV(1000) + 0001 = 0111 + 0001 = 1000$  (!?)

## Corner case, absolute operation

- With guard bits/saturation:
  - $ABS(1000)$  calculated as  
 $TRUNC(SAT(ABS(GUARD(1000)))) =$   
 $TRUNC(SAT(ABS(11000)))$
  - $TRUNC(SAT(ABS(11000))) =$   
 $TRUNC(SAT(01000)) = TRUNC(00111) = 0111$

## Designing a minimal instruction set

- What is the smallest instruction set you can get away with while retaining the capability to execute all possible programs you can encounter?
- (Something to think about over the weekend.)

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