Data Representation

Outline

- Binary Numbers
- Adding Binary Numbers
- Negative Integers
- Other Operations with Binary Numbers
- Floating Point Numbers
- Character Representation
- Image Representation
- Sound Representation

Bits and Bytes

- bit: Most basic unit of information in a computer. Two states:
 - 1: on, true
 - 0: off, false
- byte: A group of eight bits.
 - Often abbreviated using a capital B.
- word: A contiguous group of bytes.
 - The precise size of a word is machine-dependent.
 - Typically refers to the size of an address or integer.
 - The most common sizes are 32 bits (4 bytes) and 64 bits (8 bytes).

Number Representation

Initially, focus on non-negative integers of infinite length. Later in this unit, look at:

- fixed-length integers
- negative numbers
- floating point numbers (fractional component)

Base-10 Numbers

Our decimal system is a base-10 system: each digit represents a power of 10.

For instance, the decimal number 947 in powers of 10 can be expressed as:

$$9*10^2 + 4*10^1 + 7*10^0$$

= $900 + 40 + 7$
= 947

Converting Binary into Decimal

Integers are stored in a computer in binary notation where each digit is a bit:

- Each bit represents a power of 2.
- Also called the base-2 system.

•
$$2^0 = 1$$
 $2^1 = 2$

•
$$2^2 = 4$$
 $2^3 = 8$

•
$$2^4 = 16$$
 $2^5 = 32$

•
$$2^6 = 64$$
 $2^7 = 128$

•
$$2^8 = 256$$
 $2^9 = 512$

•
$$2^10 = 1024$$
; $2^11 = 2048$

Converting Binary into Decimal Example

Example: Convert 101101, into base 10.

$$1*2^5 + 0*2^4 + 1*2^3 + 1*2^2 + 0*2^1 + 1*2^0$$

= $32 + 0 + 8 + 4 + 0 + 1$
= 45

Converting Decimal Numbers into Binary

How do you convert decimal numbers into binary? Two techniques:

- Subtraction Method
- Division/Remainder Method

The subtraction method is more intuitive than the division / remainder method but requires familiarity with the powers of 2.

Subtraction Method

Idea: Iteratively subtract the largest power of two.

Algorithm to convert decimal number *n* into binary number *b*:

- 1. Set b = 0.
- 2. Find x: largest power of 2 that does not exceed n.
- 3. Mark a 1 in the position represented by x in b.
- 4. n = n x
- 5. If $n \neq 0$, repeat steps 2-4.

Subtraction Method Example

Example: Use the subtraction method to convert 90 into binary.

•
$$X = 2^4 = 16$$
; $b = 1010000$; $N = 26 - 16 = 10$

•
$$X = 2^3 = 8$$
; $b = 1011000$; $N = 10 - 8 = 2$

•
$$X = 2^1 = 2$$
; $b = 1011010$; $N = 2 - 2 = 0$

• 90 = 1011010 in binary

Division / Remainder Method

Idea: Continuously divide by two and record the remainder.

Algorithm to convert decimal number *n* into binary number *b*:

- 1. Set k = 0, b = 0
- 2. Divide n = n / 2 storing the remainder (0 or 1) into r.
- 3. Bit 2^k of b is set to r.
- 4. k = k + 1
- 5. If $n \neq 0$, repeat steps 2 4.

Division / Remainder Method Example

Example: Use the division / remainder method to convert 177 into binary.

- N = 177/2 = 88; r = 1; b = 1
- N = 88/2 = 44; r = 0; b=01
- N = 44/2 = 22; r=0; b=001
- N = 22/2 = 11; r = 0; b = 0001
- N = 11/2 = 5; r=1; b=10001
- N = 5/2 = 2; r=1; b=110001
- N = 2/2 = 1; r = 0; b = 0110001
- N = 1/2 = 0; r = 1; b = 10110001
- 177 = 10110001 in binary

Hexadecimal Numbers

- Problem: Binary numbers can be long and difficult to read.
- Hexadecimal (base-16) numbers are often used to represent quantities in a computer.
 - Often preceded with '0x' such as 0x61A2F.
- Since $2^4 = 16$, it is easy to convert a binary number into hexadecimal:
 - 1. Divide the binary number into groups of four bits.
 - 2. Translate each four bit group into a hexadecimal digit.

Decimal	4-Bit Binary	Hexadecimal		
0	0000	0		
1	0001	1		
2	0010	2		
3	0011	3		
4	0100	4		
5	0101	5		
6	0110	6		
7	0111	7		
8	1000	8		
9	1001	9		
10	1010	Α		
11	1011	В		
12	1100	С		
13	1101	D		
14	1110	E		
15	1111	F		

Hexadecimal Number Example

Example: Convert the binary number into hexadecimal.

11010100011011

- \bullet 11010100011011 = 0x351B
- 11010100011011 = 32433 in Octal

Class Problem

Convert the number 489 into (a) binary and (b) hexadecimal.

- Binary: 111101001
- Hexadecimal: 0x1E9

Fixed Length Integers

- Integers in a computer have finite length.
- An unsigned (nonnegative) integer of n bits can represent values of 0 to $2^n 1$.
- In C++, can find size of a type using Sizeof operator. For instance, Sizeof (char) = 1.

C++ Integer Sizes

Data type	Size (bytes)	Unsigned range (0 to)
char	1	255
short	2	65,535
int, long	4	4,294,967,295
long long	8	~ 1.84 * 10^19

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Binary Math Facts

Works in the same way as base-10 addition. Math facts:

$$0 + 0 = 0$$

$$0 + 1 = 1$$

$$1 + 0 = 1$$

$$1 + 1 = 10$$

Binary Addition Example

Example: Find the sum of two bytes containing 139 and 46 using binary addition.

10001011 + 00101110 10111001

$$\bullet$$
 139 + 46 = 185

Binary Addition Example

Example: Now find the sum of two bytes containing 214 and 93 using binary addition.

```
11010110
+ 01011101
100110011
```

- \bullet 214 + 93 = 307
- Outside the range of 1 byte, i.e., 255; overflow

Overflow

- Arithmetic overflow occurs when the result of an operation is too large to fit in the provided space.
- In many languages (including C++), overflow is undetected.
 - Responsibility of the programmer to check for and/or avoid overflow conditions.
 - This is especially problematic since many specifications are given using integers (infinite).
 - Potential security hazard if integer is used in pointer arithmetic or array references.
- Good rule of thumb: Restrict input as soon as enters the program.

Class Problem

Find the sums of these binary numbers. Assume a one-byte limit and indicate if overflow occurs.

10100110			01011100
+ 01101100		+	10001111
100010010	_		11101011

• Overflow in the first sum

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Signed Magnitude Numbers

Simple way of representing negative numbers: Reserve the left most bit to represent the sign.

- 0 is positive
- 1 is negative

Example: Represent —43 with one byte.

• 10101011

Signed Magnitude Numbers

Some issues with signed magnitude numbers:

- There are two representations of zero.
 - negative zero?
- Logic for dealing with sign is complicated.
 - Consider how you would add the numbers 34 + .78?

Two's Complement Numbers

Two's complement numbers arrange negative and positive numbers in an ordered number line.

-4	1111 1100
-3	1111 1101
-2	1111 1110
-1	1111 1111
0	0000 0000
1	0000 0001
2	0000 0010
3	0000 0011
4	0000 0100

Two's Complement Numbers

This creates new endpoints. For one byte the endpoints are:

- bottom (most negative): 1000 0000 (-128)
- top (most positive): 0111 1111 (127)

In general, if a number has *b* bits, the end points are:

- bottom (most negative): $-2^{(b-1)}$
- top (most positive): $2^{(b-1)} 1$

Two's Complement Numbers

Why is there one more negative value than positive value?

Zero consumes one of the positive value bit pattern

How do you determine if a value is positive or negative?

- Look at the left most bit, the sign bit
 - 1 => Negative
 - 0 => Zero or positive

Negating Two's Complement Numbers

To express a positive number — the representation is identical to unsigned.

• Remember that the range of positive numbers that can be represented is reduced.

To express a negative value — use this algorithm:

- 1. Start with the positive representation.
- 2. Flip the bits: $0 \rightarrow 1$, $1 \rightarrow 0$. (bitwise not)
- 3. Add 1.

Two's Complement Negation Example

Example: Express -43 in two's complement.

- Positive $43 = 0010 \ 1011$
- Flip bits: 1101 0100
- Add 1: 1101 0101

Negating Two's Complement Numbers

How do you convert a negative number to its positive representation? The same way!

- 1. Start with the negative representation.
- 2. Flip the bits.
- 3. Add 1.

Two's Complement Negation Example

Example: Express –(–43) in two's complement.

- Negative 43 = 1101 0101
- Flip the bits: 0010 1010
- Add 1: 0010 1011

Two's Complement Addition

Addition is carried out much the same way as unsigned numbers.

- No special work for negative numbers
- Only change is for overflow detection

Example: Add the numbers 75 and -39.

	0100	1011		75
+	1101	1001	+_	-39
	0010	0100		36

No overflow

Two's Complement Addition Overflow

Rule for detecting overflow when adding two's complement numbers: When the "carry in" and the "carry out" of the sign bit are different, overflow has occurred.

Example: Add the numbers 107 + 46.

- Carry in of sign bit = 1
- Carry out of sign bit = 0
- Therefore an overflow!

Two's Complement Overflow Cases

Case 1: Adding a positive and a negative number.

- The sign bits must be different (1 and 0)
- The carry out bit will always be the same as carry in
- Hence overflow can never occur

Two's Complement Overflow Cases

Case 2: Adding two positive numbers.

- The sign bits are both zero
- The carry out will be zero
- If the carry in is one
 - The result of 7-bit unsigned addition doesn't fit in 7 bits
 - Overflow has occured

Two's Complement Overflow Cases

Case 3: Adding two negative numbers.

- The sign bits are both one
- Carry out will always be one
- If carry in is zero
 - Overflow has occurred

Class Problem

Find the sums of these two's complement binary numbers. Assume a one-byte limit and indicate if overflow occurs.

1001	1001
+ 0110	0111
10000	0000

- Overflow in the third case:
 - Carry in = 1
 - Carry out = 0

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Numbering Bits

Bits are commonly numbered from right to left starting with 0:

bit $7 \to 0100 \ 1011 \leftarrow bit \ 0$

- The rightmost bit (bit 0) is called the *least significant bit*.
- The leftmost bit (bit n-1) is called the **most significant bit**.
- Bits to the right are *lower* than bits to the left.

Sign Extension

- For two's complement numbers, to convert shorter (fewer bits) to longer numbers:
 - 1. Starting with bit 0, copy the shorter number bit by bit.
 - 2. When you are out of bits, replicate the sign bit (most significant bit) to the remaining bit positions.
- The process of replicating the sign is called *sign extension*.
- For unsigned numbers, simply place a zero in all new bit positions.
 - This is called **zero extension**.

Sign Extension Example

Example: Convert a byte containing -39 to a 16 bit number.

-39 in 8 bits: 1101 1001

-39 in 16 bits: 1111 1111 1101 1001

Other Arithmetic Operations

- Subtraction: Simply negate the subtrahend and add.
- *Multiplication:* Convert to positive numbers and determine sign at end.
 - Use grade-school (long) multiplication.
 - For multiplying two *n*-bit numbers, need 2*n* bits to represent the product.
- Division:
 - Need to be careful about dividing by zero.
- All operations (including addition) have faster algorithms that are beyond the scope of the course.

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Floating Point Numbers

To represent non-integral numbers, computers use **floating point numbers**.

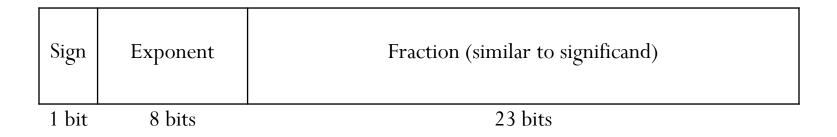
- In base-10 speak, such numbers have a decimal point.
- Since computers represent everything in binary, we could call it a *binary point*.
- However, the more generic term *floating point* is more commonly used.

Scientific Notation

Computers use a form of scientific notation for floating-point representation. Numbers written in scientific notation have three components:

- -3.83 * 10[^]4
 - "-" is the sign
 - 3.83 is the significand
 - $1 \le \text{significand} \le 10$ (unless the number is exactly zero)
 - 4 is the exponent
- -1.00101 * 2⁶
 - "-" is the sign
 - 1.00101 is the significand
 - $1 \le \text{significand} \le 2$ (unless the number is exactly zero)
 - 6 is the exponent

IEEE Floating Point Representation



- The one-bit *sign* field is the sign of the stored value.
 - 0 is positive, 1 is negative
- The size of the *exponent* determines the range of values that can be represented.
- The size of the *fraction* determines the precision of the representation.

To convert a decimal number into floating point requires three steps:

- 1. Convert the decimal number into a binary number.
- 2. Express the floating point number in scientific notation.
- 3. Fill in the various fields of the floating point number appropriately.

To illustrate this process, we will convert the number 10.625 into a IEEE floating point number.

Step 1. Convert the decimal number into a binary number.

Just like a base-10 number with a decimal point, the bits past the floating point represent negative powers of two:

$$...b_3b_2b_1b_0.b_{-1}b_{-2}b_{-3}... = ... + b_32^3 + b_22^2 + b_12^1 + b_02^0 + b_{-1}2^{-1} + b_{-2}2^{-2} + b_{-3}2^{-3} + ...$$

where
$$2^{-1} = \frac{1}{2} = 0.5$$
, $2^{-2} = \frac{1}{4} = 0.25$, $2^{-3} = \frac{1}{8} = 0.125$, ...

Note: Some numbers such as 0.1 and 1/3 cannot be exactly represented in binary notation regardless of how many bits past the floating point are specified.

Example: Convert 10.625 into a binary number.

• 10.625 = 8 + 2 + 0.5 + 0.125 = 1010.101

Converting Fraction to Floating Point

- 1. Begin with the decimal fraction F
- 2. Multiply the fraction F by two; F = F*2
- 3. Whole number part "W" of the multiplication result in step 2 is the next binary digit to the right of the point
- 4. Update F by discarding the whole number part; F = F W
- 5. If F > 0, repeat steps 2, 3, 4

Step 2. Express the floating point number in scientific notation.

Recall in base-10 scientific notation, the number to the left of the decimal point must be 1-9 (unless the number is zero). Examples:

$$857.63 = 8.5763 * 10^2$$

 $0.00007634 = 7.634 * 19^(-5)$

In binary, the number to the left of the floating point must be a 1 (unless the number is zero). Examples:

```
110111.01 = 1.1011101 * 2^5
0.011101 = 1.1101 * 2^(-2)
```

Example: Express 10.625 as a binary number in scientific notation.

• $1010.101 = 1.010101 * 2^3$

Step 3. Fill in the various fields of the floating point number appropriately.

- Sign bit: 0 positive, 1 negative
- Exponent: Holds the exponent using a biased notation (more below).
- Fraction: Holds the fractional part of the significand in scientific notation.
 - The '1' before the floating point is implied and not stored.
 - Cannot represent zero (more later).

Exponent is stored using an unusual biased representation. Think of it as a combination of two's complement and unsigned numbers:

- Two's complement: number line including both negative and positive numbers
- Unsigned: lowest number is all zeroes, highest number is all ones.

Both of these properties are true in the biased representation.

Biased Representation

For an 8 bit exponent:

-127	0000 0000
-126	0000 0001
•••	•••
-2	0111 1101
-1	0111 1110
0	0111 1111
1	1000 0000
2	1000 0001
	•••
127	1111 1110
128	1111 1111

reserved for special numbers

reserved for special numbers

Excess 127 Bias

- For 8 bits, this form is called *excess 127 bias* because the numbers are 127 apart from the two's complement equivalent.
- To convert a two's complement number to excess 127 bias: Add +127 in its two's complement form (0111 1111) and ignore overflow.
- To convert a number from excess 127 bias to two's complement: Add -127 in its two's complement form (1000 0001) and ignore overflow.

Example: Convert 10.625 as a IEEE floating point number in both binary and hexadecimal.

- 10.625 = 1010.101 (binary)
 - 1.010101 * 2[^]3
- Sign bit = 0
- Fraction = 010101...0 (23 bits)
- Exponent = 3 = 011 (binary) = $1000 \ 0010$ (Excess 127)
- Therefore the floating point number is

 - 0x412A0000

Class Problem

Convert the IEEE floating point number 0xC2AC8000 into decimal.

- - Sign: 1
 - Exponent: 10000101
 - Fraction: 010 1100 1000 0000 0000 0000
- To convert exponent from excess 127 to two's complement add -127 (1000 0001) to it
 - Exponent = 6
- Fraction has an implied "1" and binary point, therefore:
 - The number is $1.01011001 * 2^6 = 1010110.01$
 - 1010110.01 = 86.25
- As sign bit is 1, the decimal number is -86.25

Special Floating Point Numbers

Some bit patterns are reserved for special numbers:

zero	infinity	NaN (not a number)
 sign bit can be anything exponent is all zeroes fraction is all zeroes 	 sign bit: 1(-∞), 0(+∞) exponent is all ones fraction is all zeroes 	 sign bit can be anything exponent is all ones fraction is anything except all zeroes

Floating Point Approximations and Errors

- Since the number of bits is finite, not every real number can be represented.
- Many values cannot be represented exactly. This introduces error or imprecision in each floating point value and calculation.
- By using a greater number of bits in the fraction, the magnitude of the error is reduced but errors can never totally be eliminated.

Floating Point Terminology

- The *range* of a numeric format is the difference between the largest and smallest values that is can express. 32-bit IEEE FP range: 1.2×10^{-38} to 3.4×10^{38}
- *Accuracy* refers to how closely a numeric representation approximates a true value.
- The *precision* of a number indicates how much information we have about a value; the number of significant digits.
- *Overflow* occurs when there is no room to store the highorder bits resulting from a calculation.
- *Underflow* occurs when a value is too small to store, possibly resulting in division by zero.

Floating Point Error

- It is the programmer's job to reduce error or be aware of the magnitude of error during calculations.
- When testing floating point values for equality to zero or some other number, you need to figure out how close the numbers can be to be considered equal.

```
Replace: if (a == b) ...
```

With:

```
fp_error = a - b;
if (abs(fp_error) < epsilon) ...</pre>
```

Floating Point Error

Must be aware that errors can compound through repetitive arithmetic operations:

- The order of operations can affect the error.
- Associative, commutative or distributive laws may no longer apply.

Best practice: use operands similar in magnitude.

Floating Point Error Example

```
int main()
 int i;
 float a, b;
 a = 0.0;
 a = a + 10000000;
 for (i = 0; i < 20000000; i++) {
   a = a + 0.5;
 cout << "a = " << a << endl;
 b = 0.0;
 for (i = 0; i < 20000000; i++) {
   b = b + 0.5;
 b = b + 10000000;
 cout << "b = " << b << endl;
 return 0;
```

Example: What does this program print out?

Floating Point Addition

- 1. Check for any special values: zero, infinity, NaN.
- 2. Shift value with smaller exponent right to match larger exponent.
- 3. Add two values (or subtract if signs are different).
- 4. Normalize the value (in the form 1.bbb) and update exponent.
- 5. Check for zero and overflow.

Floating Point Multiplication

- 1. Check for any special values: zero, infinity, NaN.
- 2. Fill in sign based on sign of the two values; ignore sign for remaining steps.
- 3. Multiply fractions.
- 4. Multiply exponents (add them together).
- 5. Normalize the product (in the form 1.bbb) and update exponent.
- 6. Check for overflow and underflow.

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Character Representation

Characters (letters, digits, symbols) are represented using a code where each bit pattern represents a unique character.

Two common formats (virtually all machines use either or both of these formats):

- ASCII (American Standard Code for Information Interchange) is a 7-bit code.
- Unicode is a 16-bit code.
 - First 128 bit patterns are same as ASCII.
 - Includes letters and characters from non-English alphabets.
 - Includes more symbols (including math).

ASCII Character Set

Hex	Char	Hex	Char	Hex	Char	Hex	Char	Hex	Char	Hex	Char
20	(Space)	30	0	40	@	50	Р	60	•	70	р
21	!	31	1	41	Α	51	Q	61	а	71	q
22	II	32	2	42	В	52	R	62	b	72	r
23	#	33	3	43	С	53	S	63	С	73	s
24	\$	34	4	44	D	54	Т	64	d	74	t
25	%	35	5	45	Е	55	U	65	е	75	u
26	&	36	6	46	F	56	V	66	f	76	V
27	,	37	7	47	G	57	W	67	g	77	w
28	(38	8	48	Н	58	Χ	68	h	78	Х
29)	39	9	49	I	59	Υ	69	i	79	у
2A	*	ЗА	:	4A	J	5A	Z	6A	j	7A	z
2B	+	3B	;	4B	K	5B	[6B	k	7B	{
2C	,	3C	<	4C	L	5C	\	6C	- 1	7C	
2D	-	3D	=	4D	М	5D]	6D	m	7D	}
2E		3E	>	4E	Ν	5E	^	6E	n	7E	~
2F	/	3F	?	4F	0	5F		6F	0	7F	DEL

• Source: Andrew Tanenbaum

ASCII Character Set

Hex	Name	Meaning	Hex	Name	Meaning
0	NUL	Null	10	DLE	Data Link Escape
1	SOH	Start Of Heading	11	DC1	Device Control 1
2	STX	Start Of Text	12	DC2	Device Control 2
3	ETX	End Of Text	13	DC3	Device Control 3
4	EOT	End Of Transmission	14	DC4	Device Control 4
5	ENQ	Enquiry	15	NAK	Negative AcKnowledgement
6	ACK	ACKnowledgement	16	SYN	SYNchronous idle
7	BEL	BELI	17	ETB	End of Transmission Block
8	BS	BackSpace	18	CAN	CANcel
9	HT	Horizontal Tab	19	EM	End of Medium
Α	LF	Line Feed	1A	SUB	SUBstitute
В	VT	Vertical Tab	1B	ESC	ESCape
С	FF	Form Feed	1C	FS	File Separator
D	CR	Carriage Return	1D	GS	Group Separator
E	SO	Shift Out	1E	RS	Record Separator
F	SI	Shift In	1F	US	Unit Separator

• Source: Andrew Tanenbaum

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Image Representation

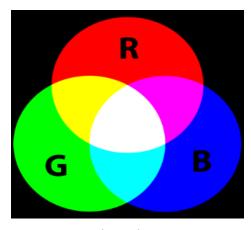
- Images can be thought of as a 2-dimensional array of pixels.
- Each pixel is a small dot within the image that has been assigned a color.
 - The pixels are small enough that the human eye is unable to detect the boundaries between the different pixels.
- A color is commonly represented using an RGB-value. RGB is a color model that produces colors by adding Red, Green, and Blue components.
 - Commonly, one byte (8 bits) is used for each of the three colors for a total of 24 bits for each pixel.
 - This model works best for computer monitors and televisions.

RGB Color Model

In the RGB color model, colors go from (0,0,0) to (255,255,255):

- (0,0,0) is black
- (255, 0, 0) is red
- (0, 255, 0) is green
- (0, 0, 255) is blue
- (0, 255, 255) is cyan
- (255, 0, 255) is magenta
- (255,255,0) is yellow
- (255,255,255) is

If all three color components are the same value → shade of gray



Source:Wikipedia

Image Representation

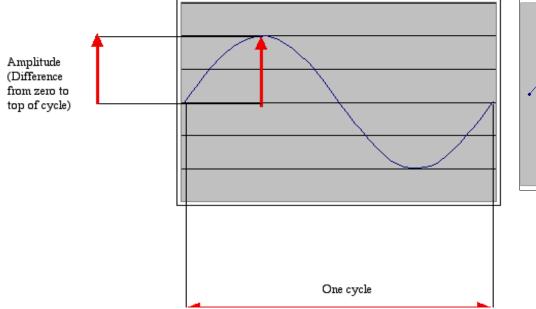
- With 24 bits there are 16,777,216 (2²⁴) possible colors. However, computer monitors are unable to display 16 million colors.
- Color printers use a different color model CYMK (Cyan, Yellow, Magenta, blacK).
- Images are typically stored in a compressed format (such as JPEG). Compression algorithms take advantage of the fact that pixels near one another are often close to the same color.

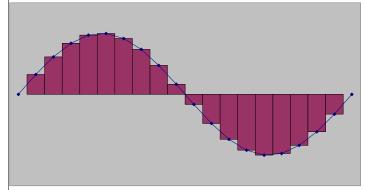
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Sound Representation

Sounds, in the physical world, are waves of air pressure. To digitize the sound wave curve, we need to sample the wave periodically, measuring the instantaneous amplitude.





Source: Mark Guzdial, Georgia Tech

Sampling

- The *Nyquist*—*Shannon sampling theorem* states that if the highest frequency of a sound is N Hertz, a sampling rate of at least 2N can perfectly reconstruct the original sound.
- The human ear can detect sounds up to 22,000 Hz approximately.
- CD quality sound is captured at 44,100 samples per second.
- Each sample is commonly encoded using 16 bits (a two's complement number).
- Like images, audio formats use compression.

Sound Representation Example

Example: How much memory is needed to store a 30-second audio file (uncompressed)?

- 44,100 samples per second
- Each sample has 16 bits
- Hence for 30 second recording we need:
 - 44100 * 16 * 30 bits
 - ~2.52 MB

Thank You!