

Voltage,  
A2D,  
Piece Wise Linear,  
Noise

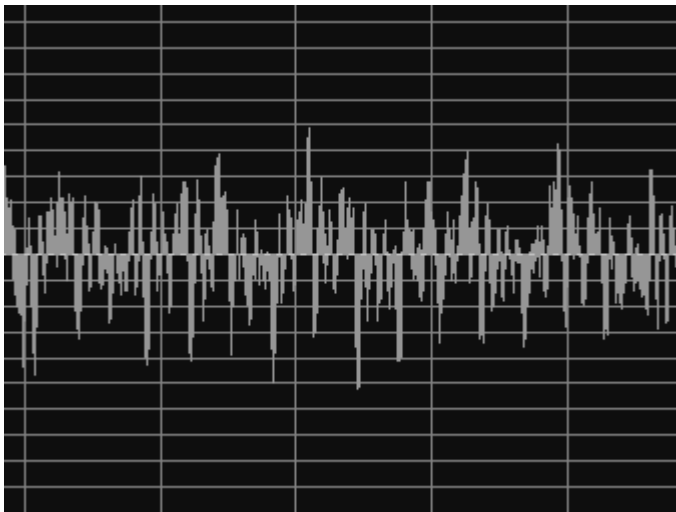
# Topics

- What form are real-world signals?
- How can a computer read an analog signal?
- How can we approximate functions?

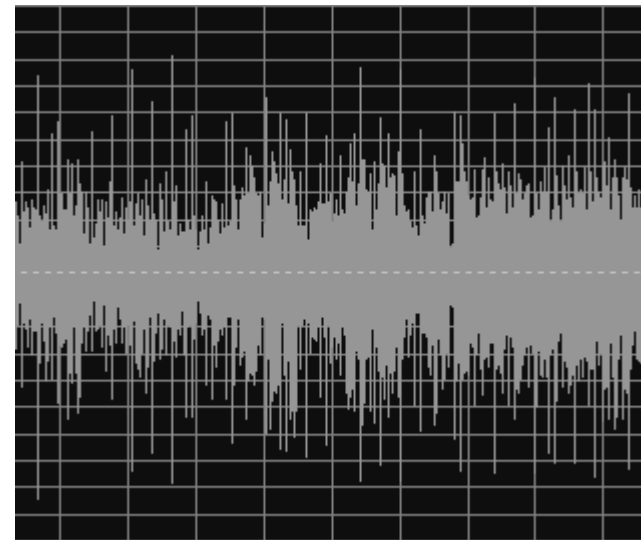
# Signals in the “Real World”: Voltage

# Voltage

- Real world analog signals are often changes in voltage:
  - Ex: Microphone encodes sound into voltage levels



Audio: Zoomed in

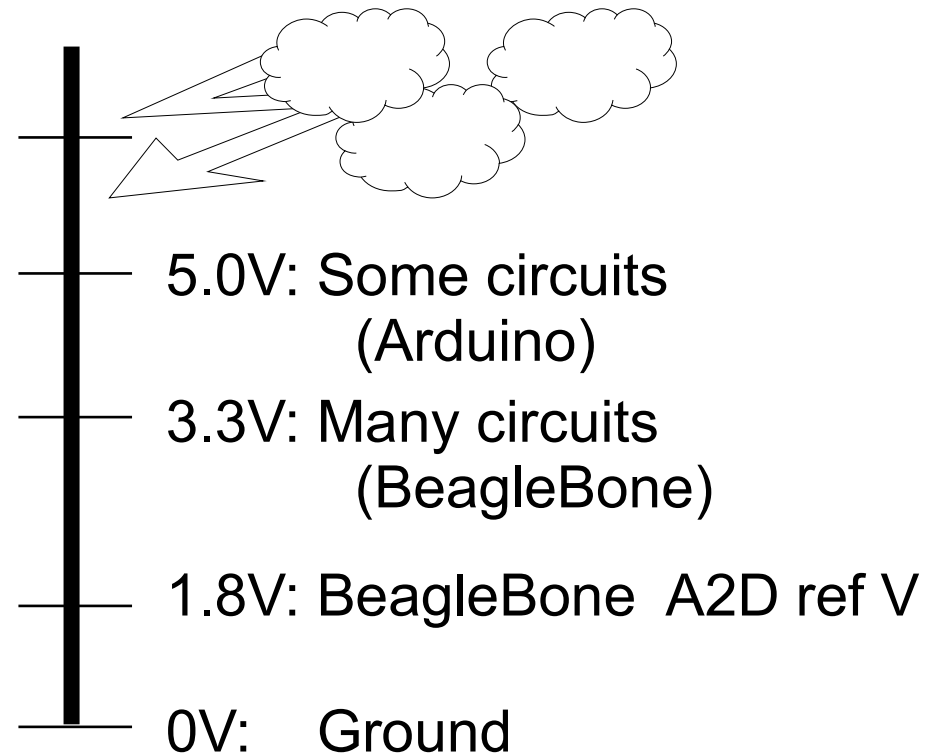


Audio: Zoomed out

# Voltage Ranges

These are all DC voltage  
(Direct Current)

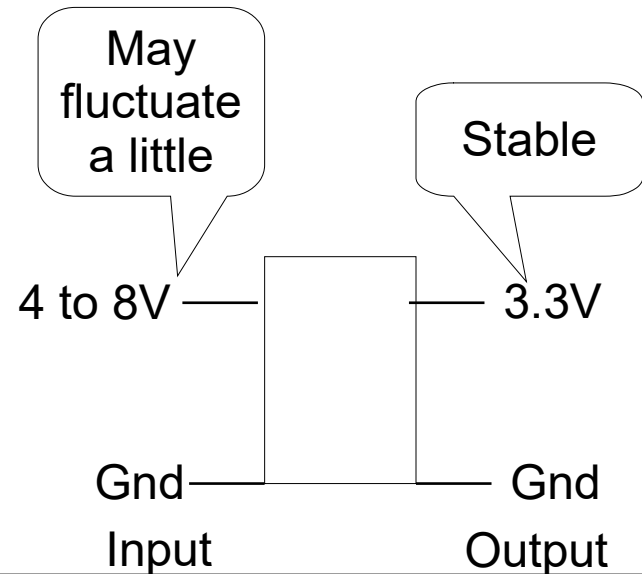
Out of the wall comes AC Voltage  
(Alternating Current)



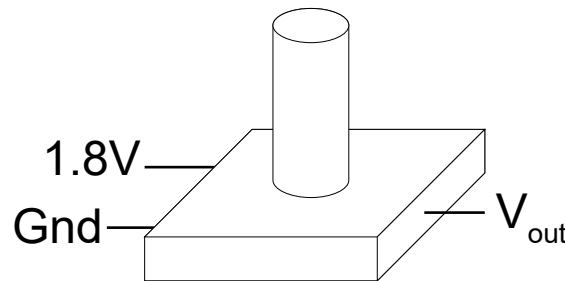
# Electronics Components (“Parts”)

- Many electronics components run on, manage, and work with voltages.

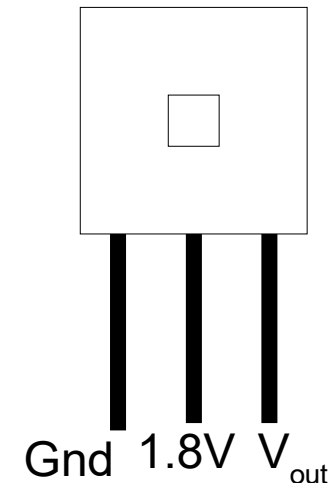
Voltage Regulator:  
Converts input voltage  
to stable output voltage.



Potentiometer:  
Turning the knob  
adjusts the output  
voltage on  $V_{out}$



Light Sensor:  
The more light,  
the lower the  
voltage on  $V_{out}$



# Reading a Voltage

- How can we read a signal into the computer?
  - Real world is analog voltages; computer are digital.
  - We need an analog to digital converter (ADC)
    - Also called an A2D (Analog “to” Digital)
- BeagleBone has a 12 bit A2D:
  - It reads a voltage and gives a number between 0 and  $2^{12}-1$  (=4095)
  - It can sample voltages between 0V and 1.8V
    - It is easily damaged by higher voltages!

# Quantization & Sampling

- Quantization:

Since it has 4096 samples over 1.8V

- Resolution of a single bit is:

$$1.8V / 4096 = 0.00044V = 0.44 \text{ mV}$$

This is pretty good for most applications!

- Sample Rate:

How fast the A2D can read samples

- Need 44100 Hz (44.1kHz) for CD audio
- BeagleBone can sample at 1.6MHz (1600kHz)
- Some applications (reading a POT for volume) may need low sample rates (~10Hz)



# BBB A2D Demo for POT

- A2D is enabled by default
  - Done for us by UBoot via /boot/uEnv.txt

- Change to sys file system folder:

```
(bbg) $ cd /sys/bus/iio/devices/iio\:device0
```

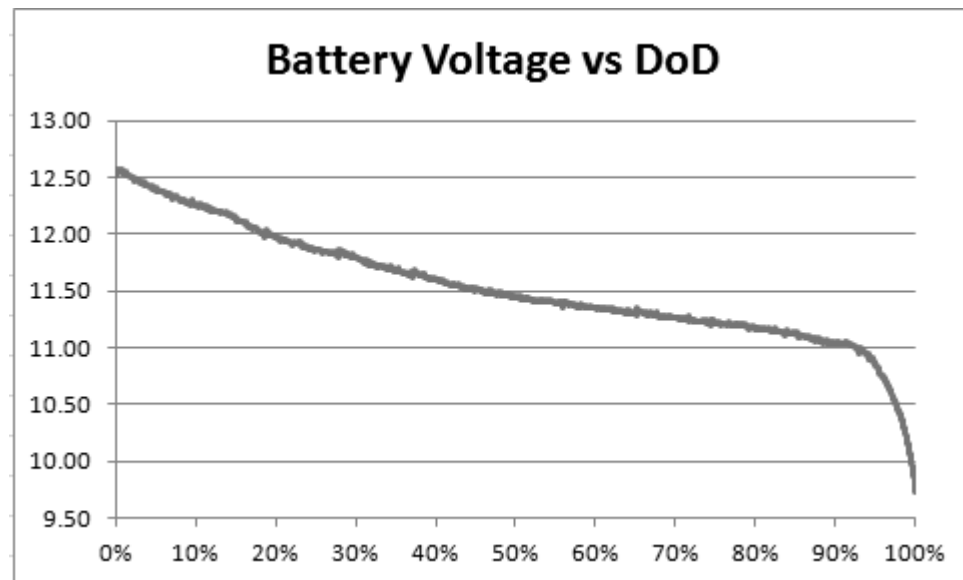
- Read voltage 0 (for POT):

```
(bbg) $ cat in_voltage0_raw
```

# Approximating Functions: Piece Wise Linear

# Function Approximations

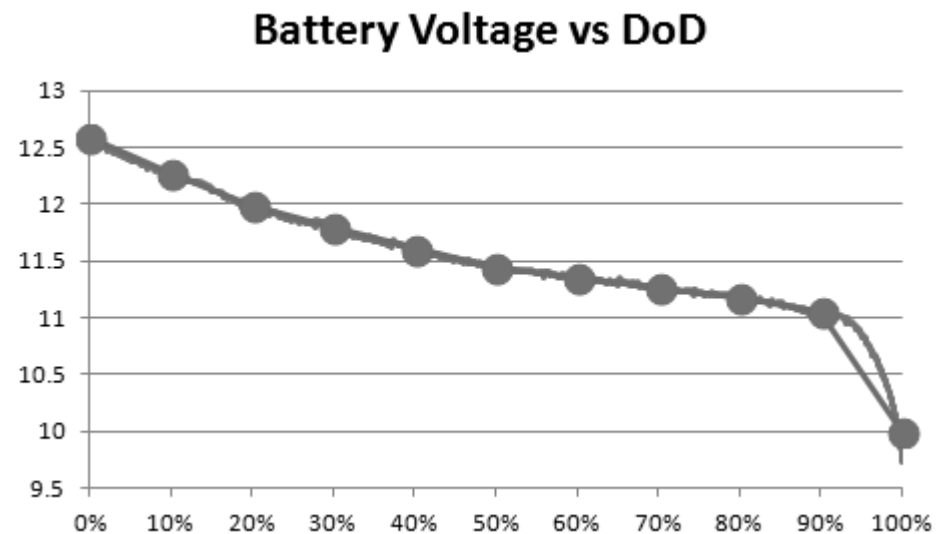
- Real world functions can be hard to approximate.
  - Some approximations are computationally expensive (high-order polynomials, cubic-spline, ..)
  - Piecewise Linear (PWL)  
Approximate a function with a series of lines.



As you discharge a battery,  
its voltage drops.  
(DoD is Depth of  
Discharge)

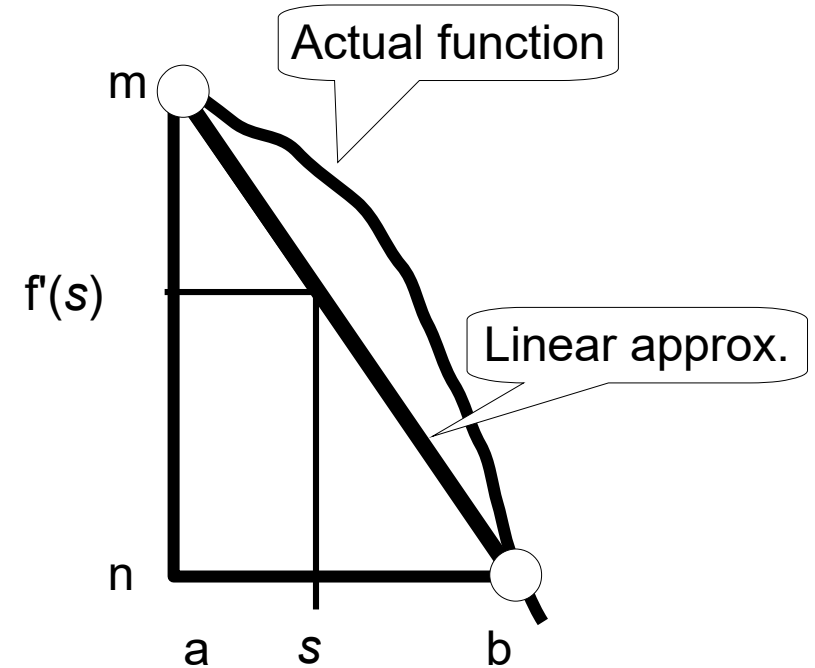
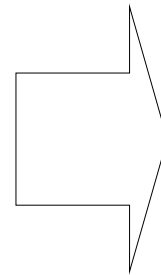
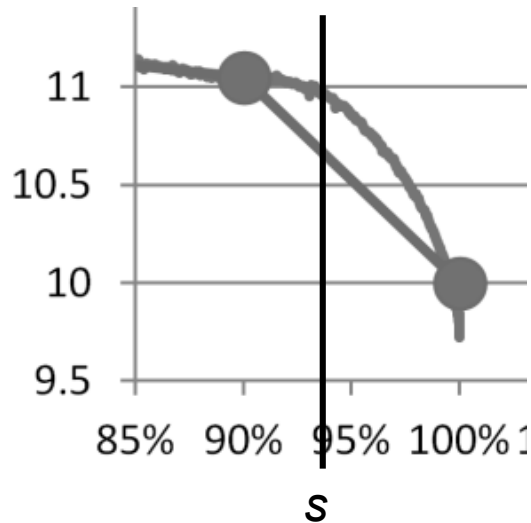
# Piece Wise Linear

- Pick good points on the function  $f(x)$  to capture its shape
  - can be evenly spaced, or
  - can be specially selected points
- Between adjacent points, draw a straight line.
- The approximation  $f'(x)$  is the straight lines.



# Computing Piecewise Linear

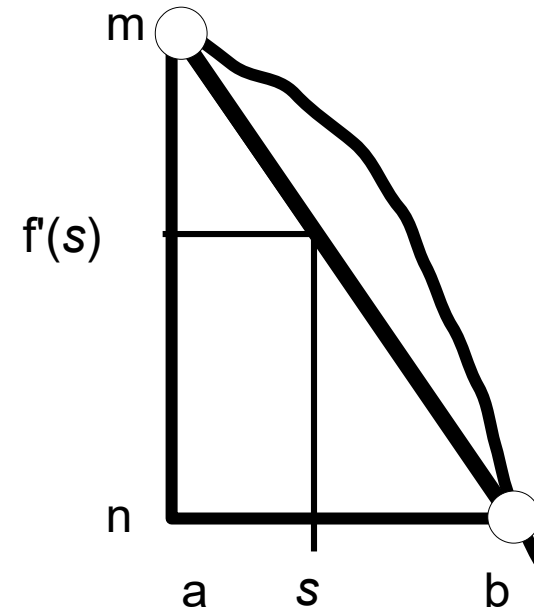
- Given an input value  $s$ , use points on either side
- Compute  $f'(s)$  by solving the point on the line



$$f'(s) = \left( \frac{s-a}{b-a} \right) \cdot (n-m) + m$$

# Understanding Piecewise Linear

$$f'(s) = \left( \frac{s-a}{b-a} \right) \cdot (n-m) + m$$



# Piecewise Linear Details

- Some extra notes:
  - If a reading is  $<$  min or  $>$  max data point, clip it to min & max.
  - Enter the points into a program as two arrays:

```
#define PIECEWISE_NUM_POINTS 11
const float PIECEWISE_DoD[] = { .0, .1, ..., .8, .9, 1 };
const float PIECEWISE_V[]   = { 12.6, 12.3, ..., 11.2, 11.1, 10 };
```

- Make sure to use the correct data types for your calculation (possibly floating point).
- Watch for array out of bounds!

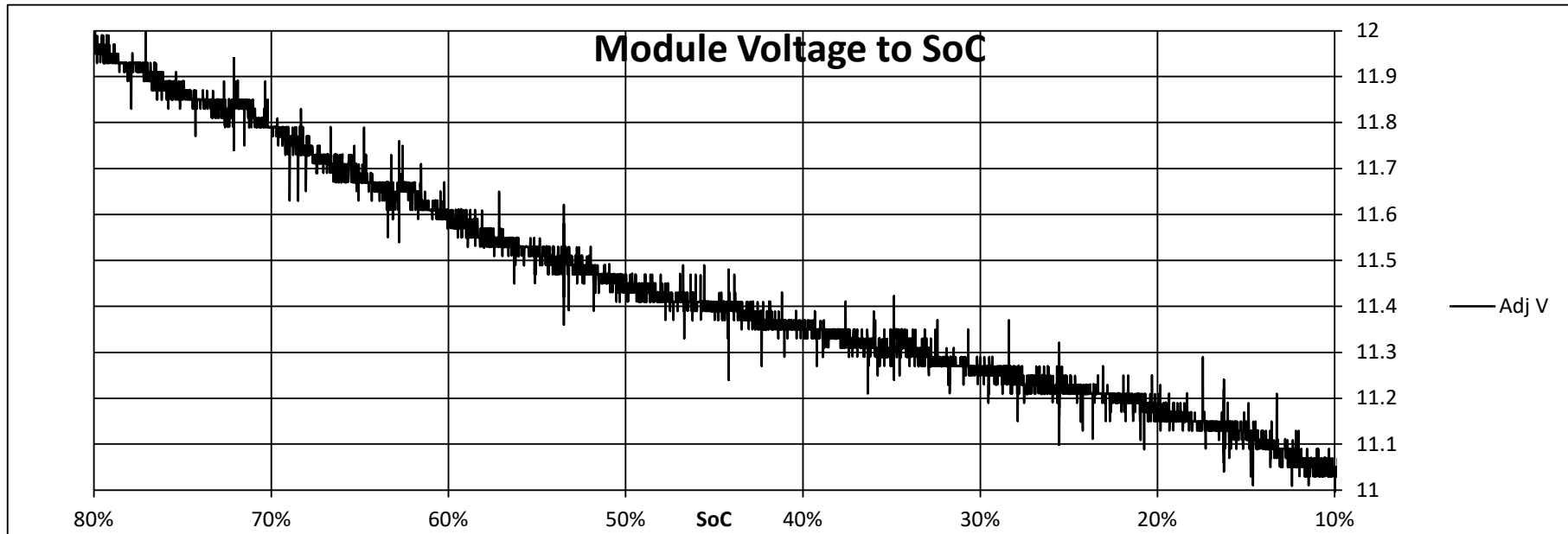
Noise  
Noise  
Noise





# Noise

- Real world data is often 'noisy'
    - each sample has..  
causing it to differ from the correct real-world value.
- A2D Sample = (precise real-world value) + (noise)



# Problem with Noise

- A noisy signal's fluctuations may be:
  - changes in the real signal
  - noise
- Ex: Turn off phone when battery is empty (3V)

```
static void powerDownIfBatteryDead() {  
    if (batteryVoltage < 3.0) {  
        powerDown();  
    }  
}
```

What could  
go wrong?

- What happens when noise spike gives you 2.99V reading when battery actually at 3.10V?

# Tolerating Noise: N Samples Past Threshold

- An idea to tolerate some noise...
- Ex: Power off if 5 consecutive samples are less than 3V:

```
static double batteryVHistory[5];
static void powerDownIfBatteryDead() {
    for (int i = 0; i < 5; i++) {
        if (batteryVHistory[i] >= 3.0) {
            return;
        }
    }
    powerDown();
}
```

# Tolerating Noise: Hysteresis

- State machine should be stable...
  - Problematic Example:  
Battery-saver when State of Charge < 30%

```
static bool inLowPower = false;
static void manageLowPowerState() {
    if (batterySoC < 30) {
        inLowPower = true;
    } else {
        inLowPower = false;
    }
}
```

- Problem?

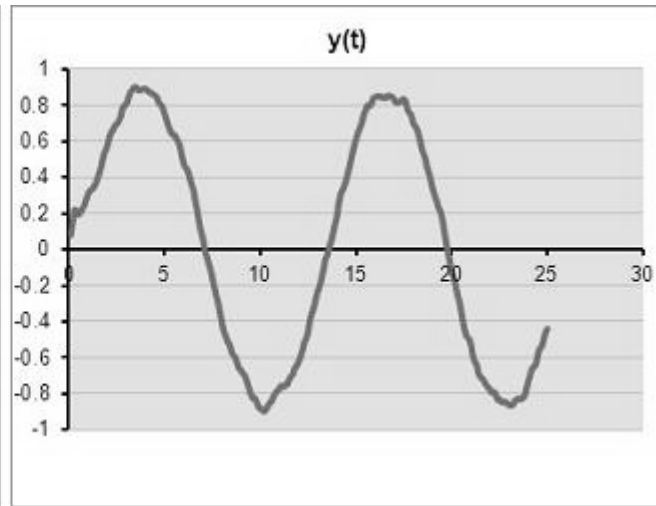
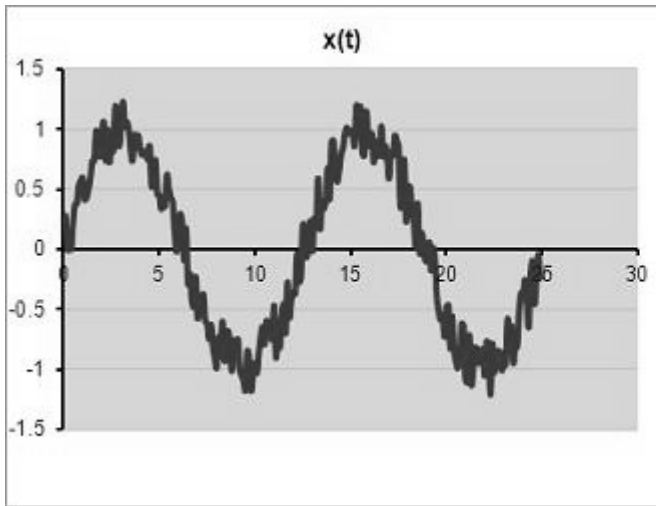
..

# Hysteresis Solution

- A solution:

..

```
static bool inLowPower = false;
static void manageLowPowerState() {
    // Enter
    if (batterySoC < 30) {
        inLowPower = true;
    }
    // Exit (5% SoC Hysteresis)
    if (batterySoC > 35) {
        inLowPower = false;
    }
}
```



## Noise Filters

# Simple Moving Average

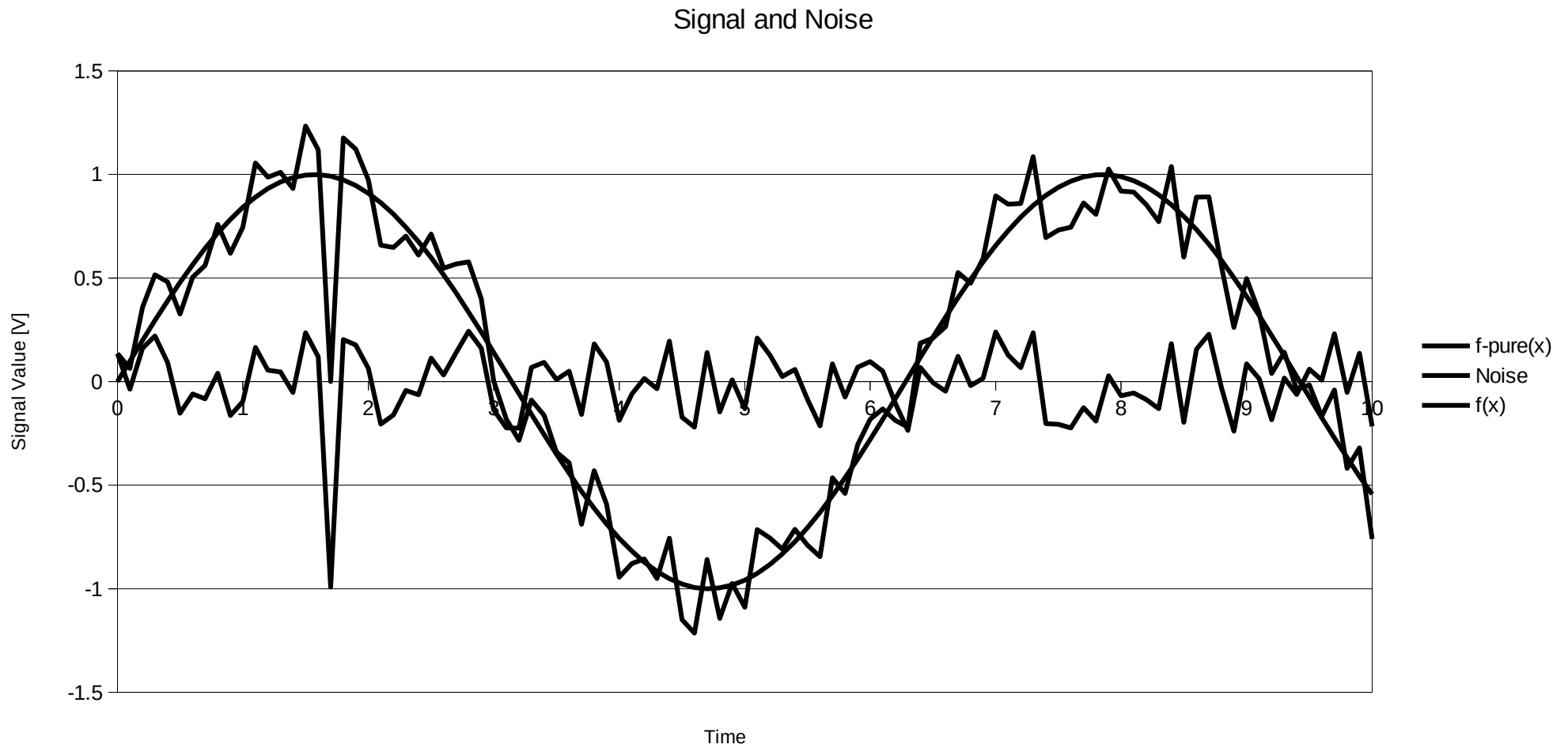
- Rather than tolerating noise,...
- Maintain buffer of *previous* N samples

```
static double batteryVFiltered = 0;
static double samples[10];
static int nextIdx = 0;
static void getNewBatetryV() {
    // Sample
    samples[nextIdx] = readA2DVoltage();
    nextIdx = (nextIdx + 1) % 10;

    // Filter
    batteryVFiltered = average(samples, 10);
    //batetryVFiltered = median(samples, 10);
}
static double average(double *data, int numValues) {...}
```

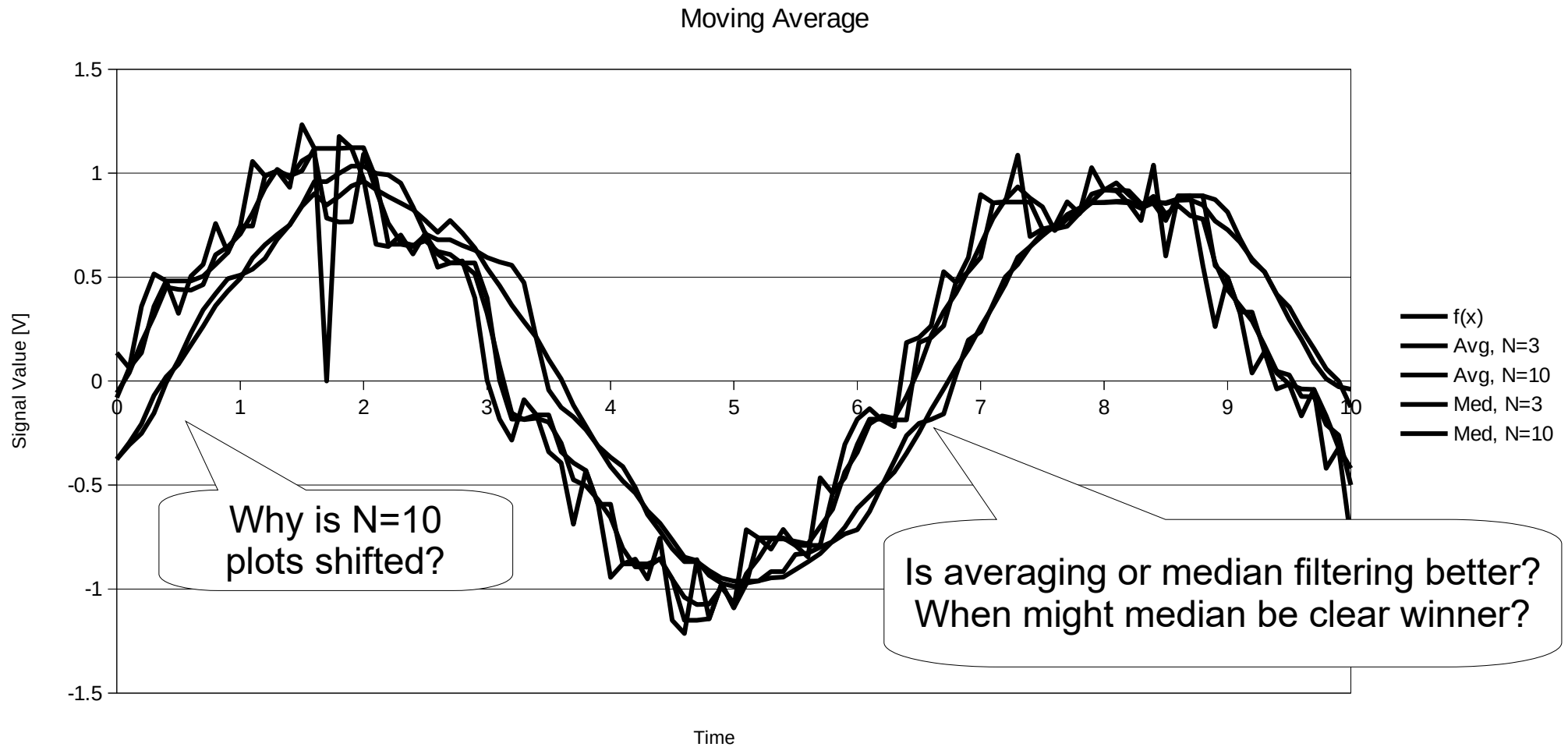
- Note: Must also handle non-full buffer.

# Noise Example





# Simple Moving Average Effectiveness



# Exponential Smoothing

- Simple moving average equally weights all samples,  
..

- Exponential Smoothing Details

- Let  $s_n$  be the Nth sample from the A2D

- Let  $v_n$  be the Nth filtered value

- Let  $a$  be a weighting value between 0 and 1

- Smoothed Data Points ( $v_n$ )

$$v_0 = s_0$$

$$v_n = a * s_n + (1 - a) * v_{(n-1)}$$

# Exponential Smoothing Intuition

- $s_n$  is the Nth sample from the A2D  
 $v_n$  is the Nth filtered value  
 $a$  is a weighting value between 0 and 1

- Smoothed Data Points ( $v_n$ )

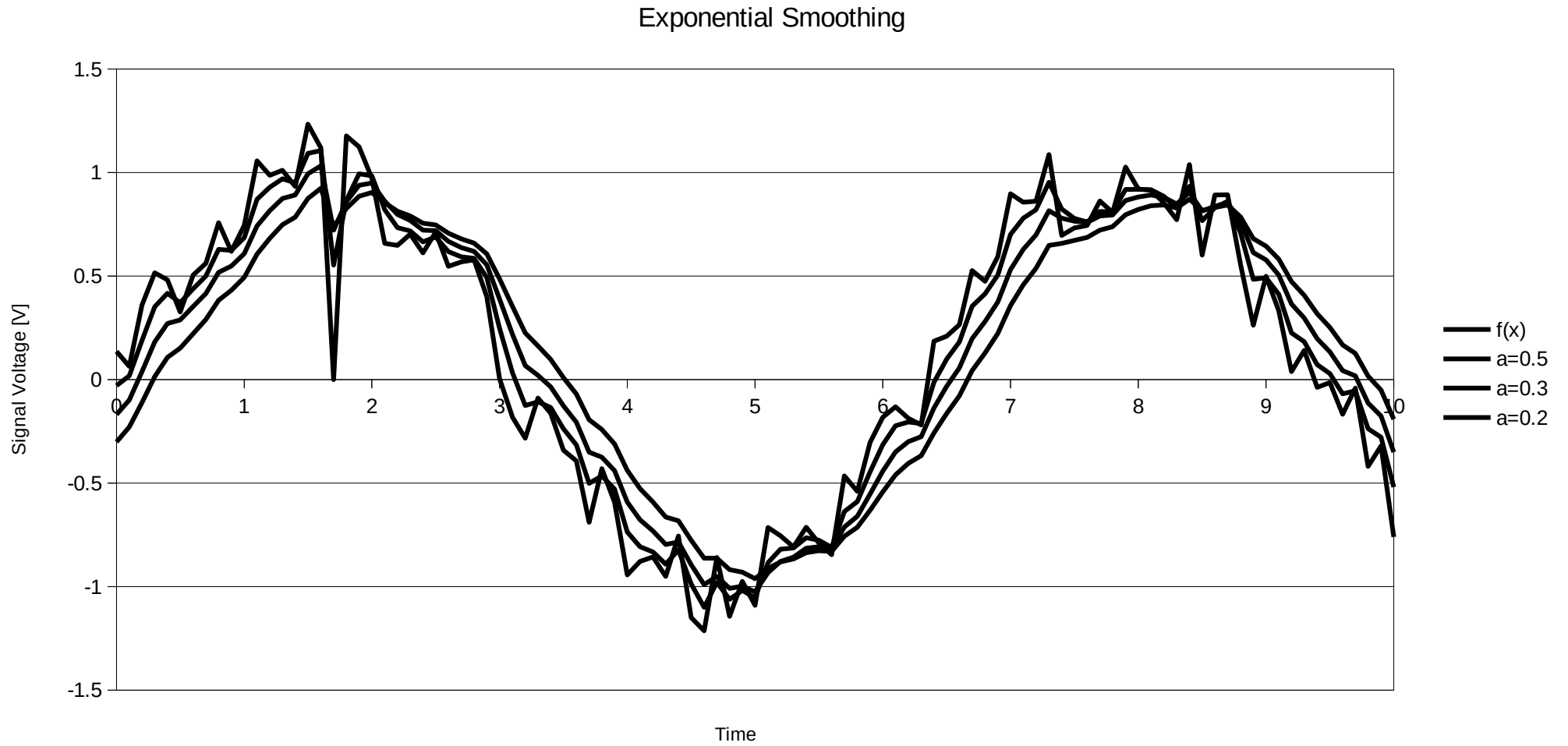
$$v_0 = s_0$$

$$v_n = a * s_n + (1 - a) * v_{(n-1)}$$

- Intuition

- $a = 1$ : 100% weight on instantaneous ‘now’ sample (filtering disabled)
- $a = 0.1$ : Very heavy weight on old data, not much on new data (average over very long time frame)

# Exponential Smoothing Effectiveness



# Summary

- Many sensors generate analog voltage signals.
  - Be careful that signal is in correct voltage range!
- BBB can sample voltages between 0 and 1.8V
  - 12-bit A2D: digital values between 0 and 4095
- Piecewise Linear approximates functions
  - Given a reading (on the X axis), use the selected points and straight lines to approximate desired value (on the Y axis)
- Noise adds errors to samples
  - Tolerate noise with hysteresis and filter thresholds
  - Filter with simple moving average or exponential smoothing.