

# Wireless Sensor Networks

Understanding Complex-Engineered  
Systems By Example

Module 4: Analog-to-Digital  
Conversion

## WSN's - The Eyes and Ears of the Internet: Sensing the Physical World

- Wirelessly networked embedded systems
- Mission: Transduce a parameter of the physical environment into a number on your desktop
- First task: choose/understand transducers
- Second task: interface a network node with transducers

# Themes

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  - From physical world to measurement
  - From measurement to knowledge
  - *Bridging the physical and cyber worlds*

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  - Analog signal processing
  - Digital and statistical signal processing

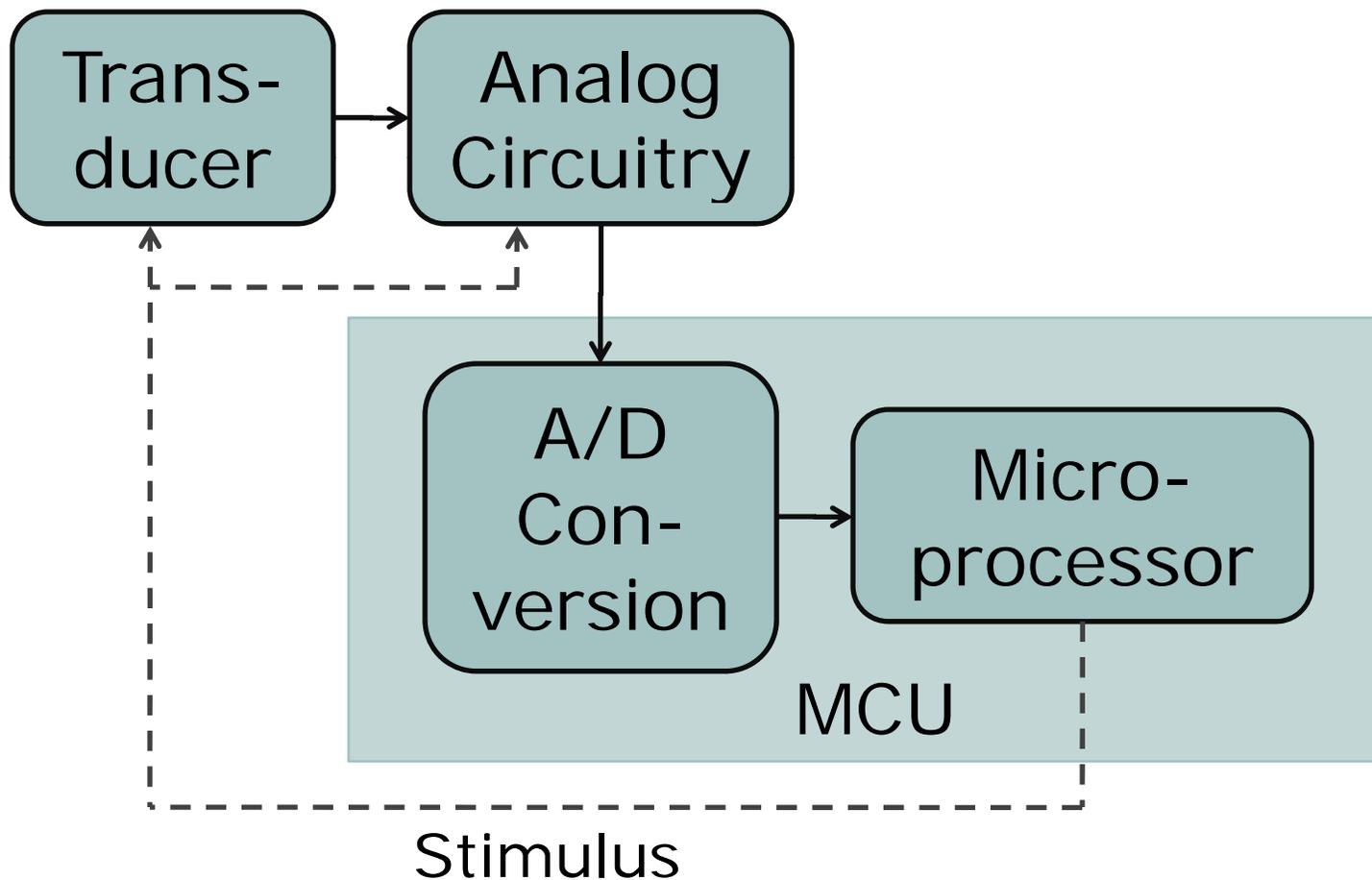
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  - Analog signal processing
  - Digital and statistical signal processing
- Error sources
  - Transducer and electronic noise
  - Analog-to-digital conversion

## Connections

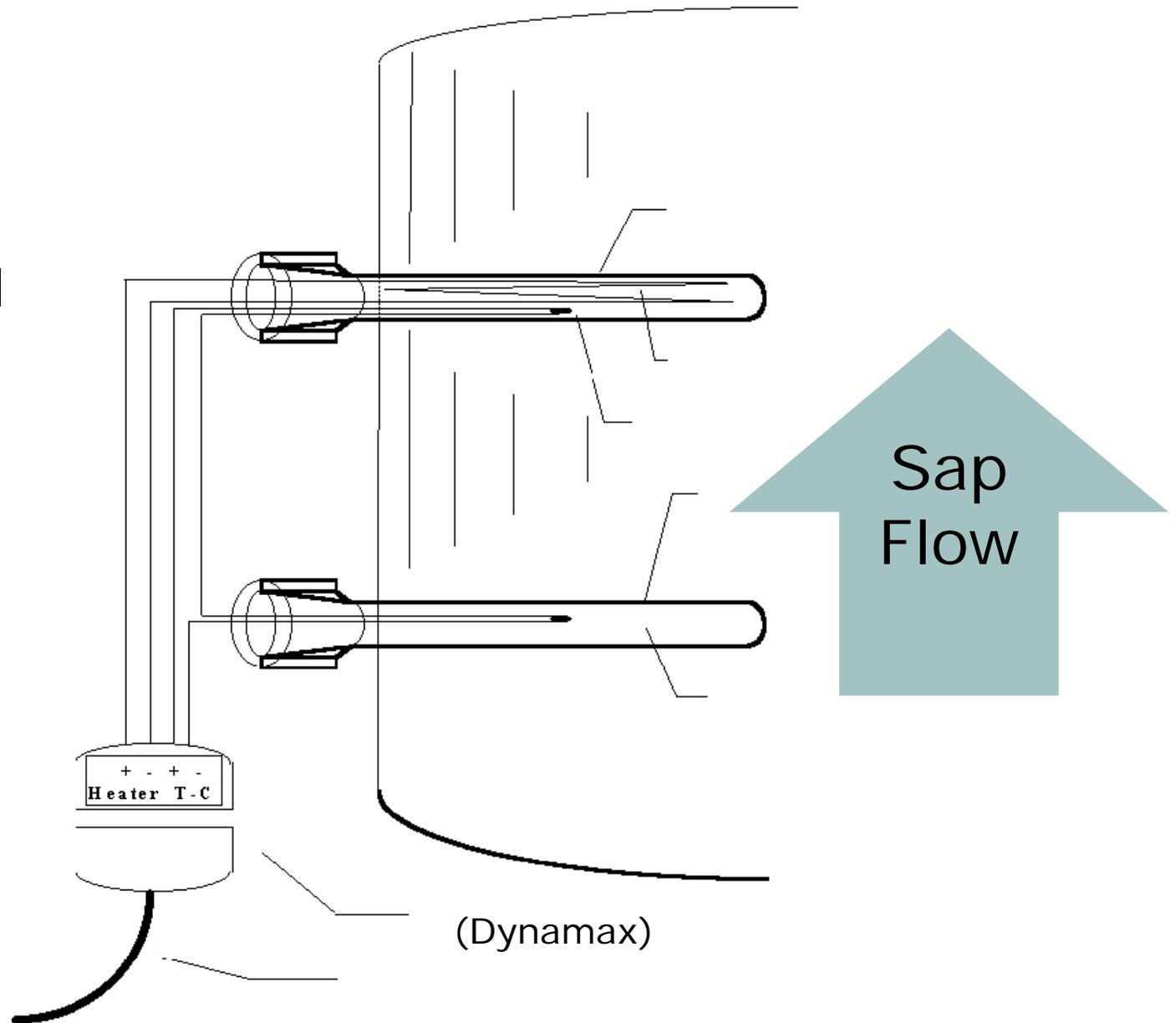
- Analog circuit design
  - Signal conditioning, amplification, filtering
- Mixed signal circuit design
  - analog-to-digital conversion. Conversion speed, quantization noise, dynamic range, and linearity
- Signals and systems, DSP
  - Filtering, sampling rate, linearity
- Statistical signal processing
  - Transducer noise and bias, quantization noise, interference

# From physical parameter to number

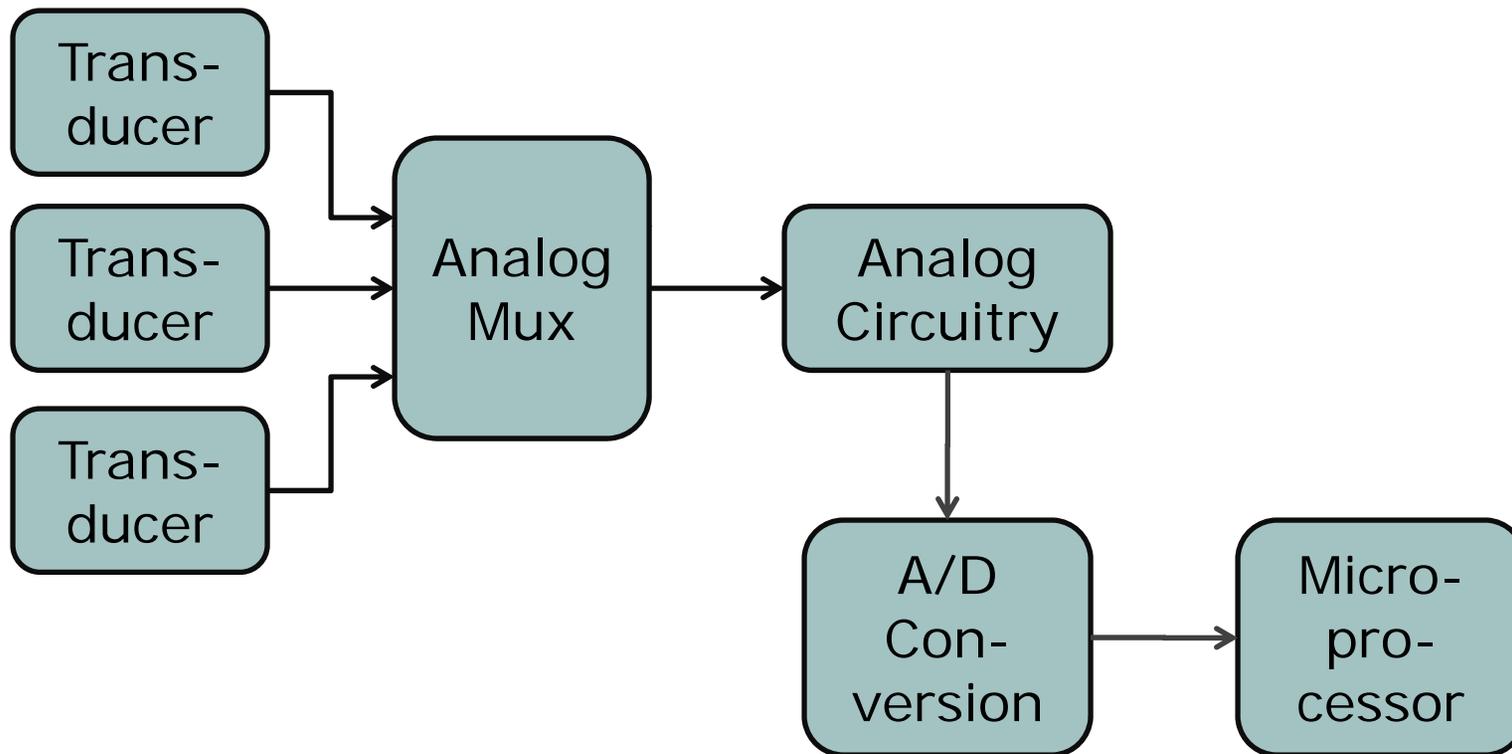


# A Biotic Response: Sap Flux

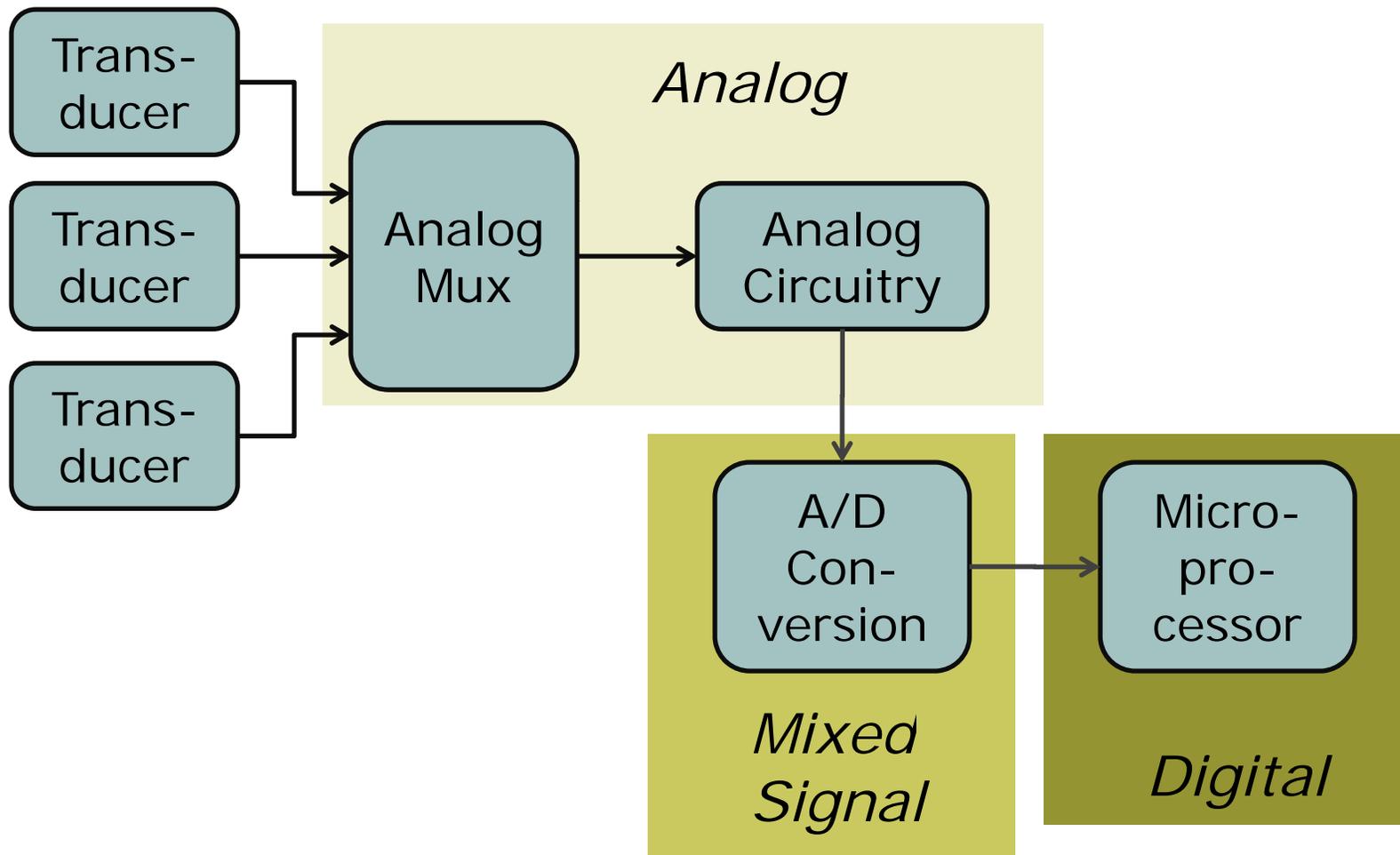
Granier  
method



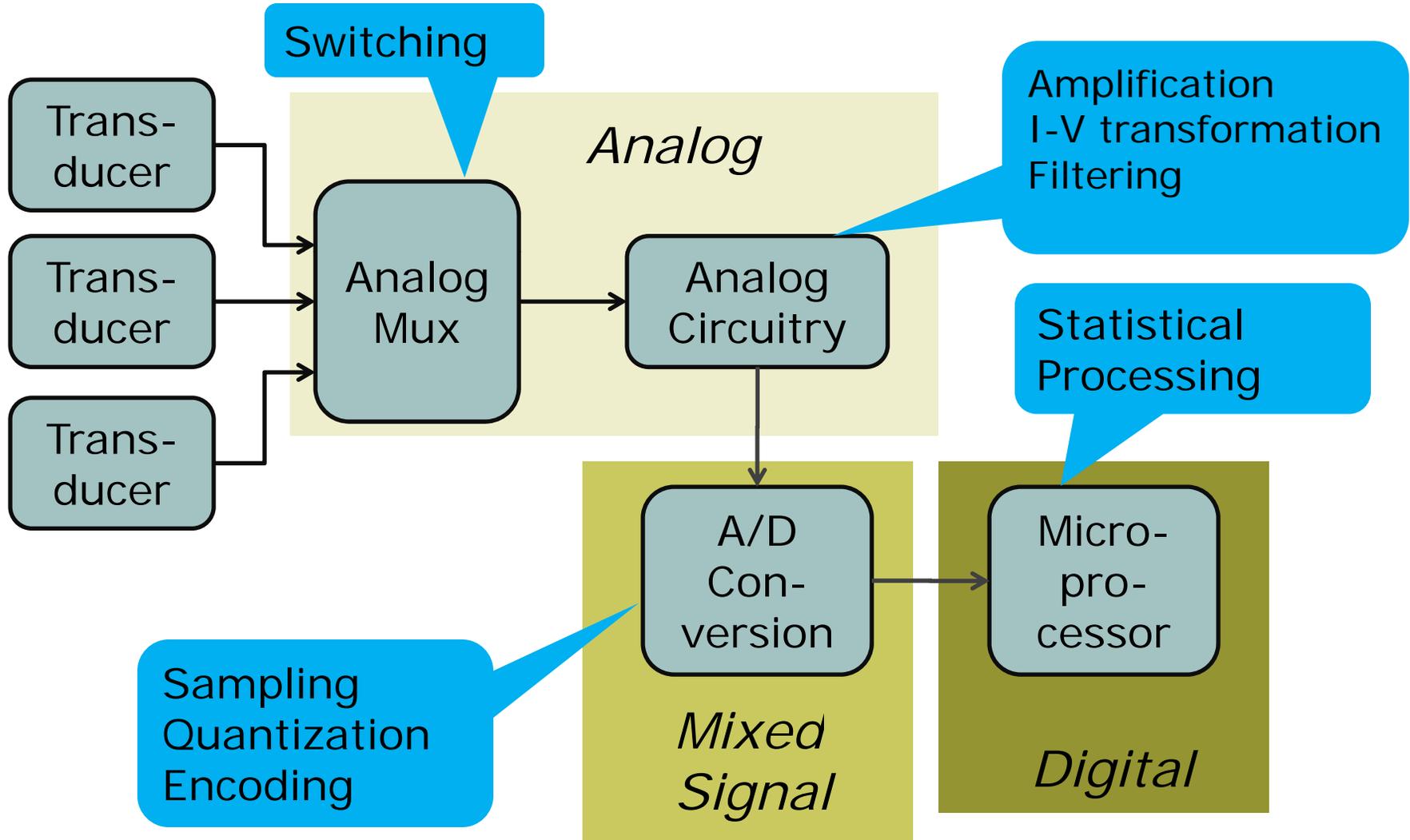
## From physical parameter to number



# From physical parameter to number



# From physical parameter to number



## Getting a handle on data fidelity

- Accuracy
- Precision
- Resolution

How good is the sensed data?

Part I: transducer signal

Analog measurement  $y$  of data  $x^*$  from the transducer is uncertain.

Error  $\beta + \epsilon$  is the sum of a bias (offset)  $\beta$  and noise  $\epsilon$  :

$$y = x^* + \beta + \epsilon$$

$$\epsilon \sim (0, \sigma^2)$$

|                  |     |               |
|------------------|-----|---------------|
| large $ \beta $  | = > | low accuracy  |
| large $\sigma^2$ | = > | low precision |

How do we deal with noise?

# Tasks

## 1. Evaluate and Calibrate

- a) Determine accuracy – find the bias
- b) Determine precision – find the noise variance (power)

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1. Evaluate and Calibrate
  - a) Determine accuracy – find the bias
  - b) Determine precision – find the noise variance (power)
2. Design algorithms to get desired performance
  - manage the noise

1a. Estimate the bias

1a. Estimate the bias (ii)

1b. Estimate the measurement noise

## 2. Manage the noise

## 2. Manage the noise (ii)

# How good is the sensed data?

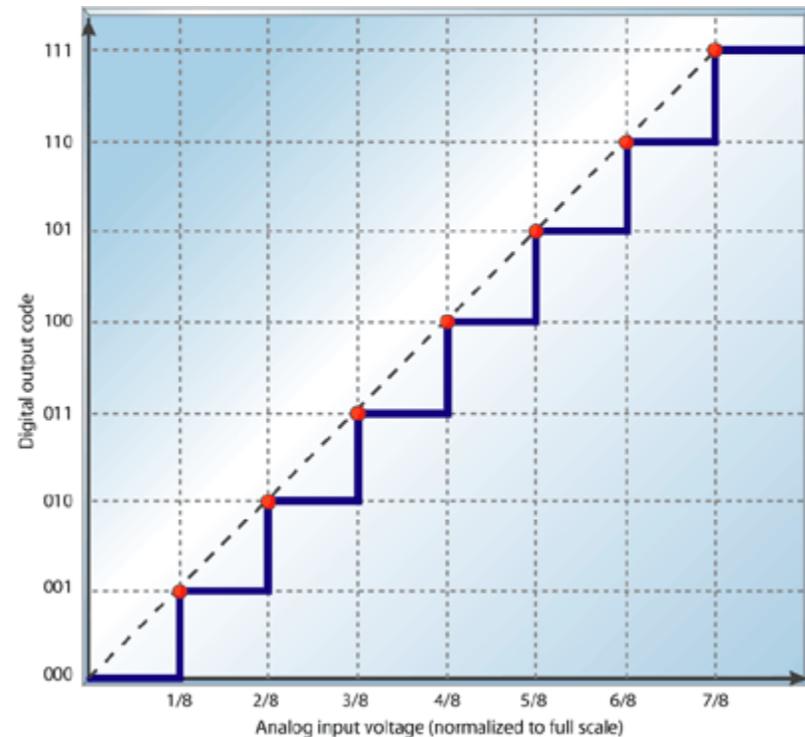
## Part II: A/D conversion

A/D conversion can distort the value.

Error types:

- Resolution
- Noise
- Nonlinearities

High resolution  
does **not** imply  
high precision or  
accuracy!



L. Staller. Understanding analog to digital converter specifications. Embedded Systems Design (02/24/05, 05:24:00 PM EST)

A/D converter: SP model

How many A/D bits do I need?

How much does another bit buy?

# Modeling the quantization error

# Calculating the Improvement

## Remaining Questions

- How often to sample
- Where to sample
- How to encode the information for transmission
- How to use the information for the construction of predictive models