



# Complementary Filter



Or

A Special Instance of an  
Alpha-Beta Filter



Or

How I Came to Love  
Weighted Averages

# Overview of Averages

- What is the average of 6 and 10?
  - $\text{Avg} = (6 + 10) / 2$
- What about the average of 6, 10, and 12?
  - $\text{Avg} = (6 + 10 + 12) / 3$
- In general form:
  - $\text{Avg} = \text{sum}(\text{values}) / \text{number of values}$

# A Different Way to Look at Averages

- $\text{Avg} = (6 + 10) / 2$
- $\text{Avg} = 6/2 + 10/2$  (Distribute)
- $\text{Avg} = (6 * 0.5) + (10 * 0.5)$  (Inverse)
- $\text{Avg} = (6 * 50\%) + (10 * 50\%)$  (Definition of percentage)
  
- $\text{Avg} = (6 * 33.3\%) + (10 * 33.3\%) + (12 * 33.3\%)$
  
- All numbers have an equal contribution/weight in the average

# Weighted Averages

- What if I told you the third voltage measurement in a series is always more accurate than the first two?
- You could discount the first two, or you could take more of a share of the third value when computing the average.
- $\text{Avg} = (6 * 20\%) + (10 * 20\%) + (12 * 60\%)$
- $\text{Avg} = (6 * 15\%) + (10 * 20\%) + (12 * 65\%)$
- $\text{Avg} = (6 * 05\%) + (10 * 10\%) + (12 * 85\%)$
- In all cases the percentages add up to 100%.

# Complementary

- We are not talking about free nuts at the bar. (That is complimentary)
- Complementary is a math term meaning “to complete a whole”
- In our case the ‘whole’ is 100%.
  
- $Avg = (6 * 15\%) + (10 * 20\%) + (12 * 65\%)$
- $Avg = (6 * W1) + (10 * W2) + (12 * W3)$
- $Avg = (V1 * W1) + (V2 * W2) + \dots + (Vn * Wn)$ 
  - Where  $W1 + W2 + \dots + Wn = 100\%$

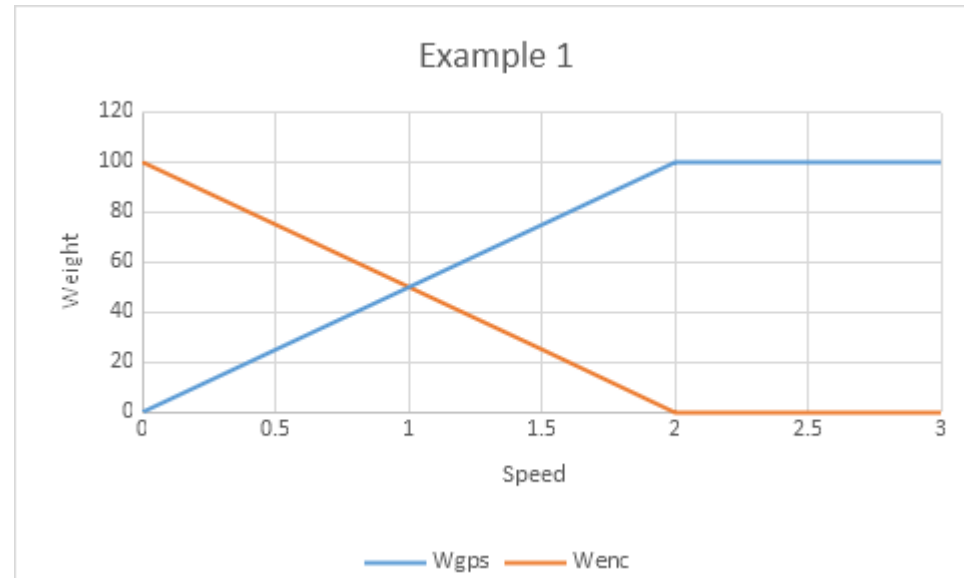
# Example 1

- Robot with wheel encoders and GPS sensor each providing speed.
- $V_{avg} = (V_{enc} * 50\%) + (V_{gps} * 50\%)$
- But GPS can't provide a velocity when traveling slowly.
- Encoders start to slip when traveling fast.
- These two sensors complement each other!
  - GPS is good going fast, and encoders good when going slow.
- $V_{avg} = (V_{enc} * W_{enc}) + (V_{gps} * W_{gps})$

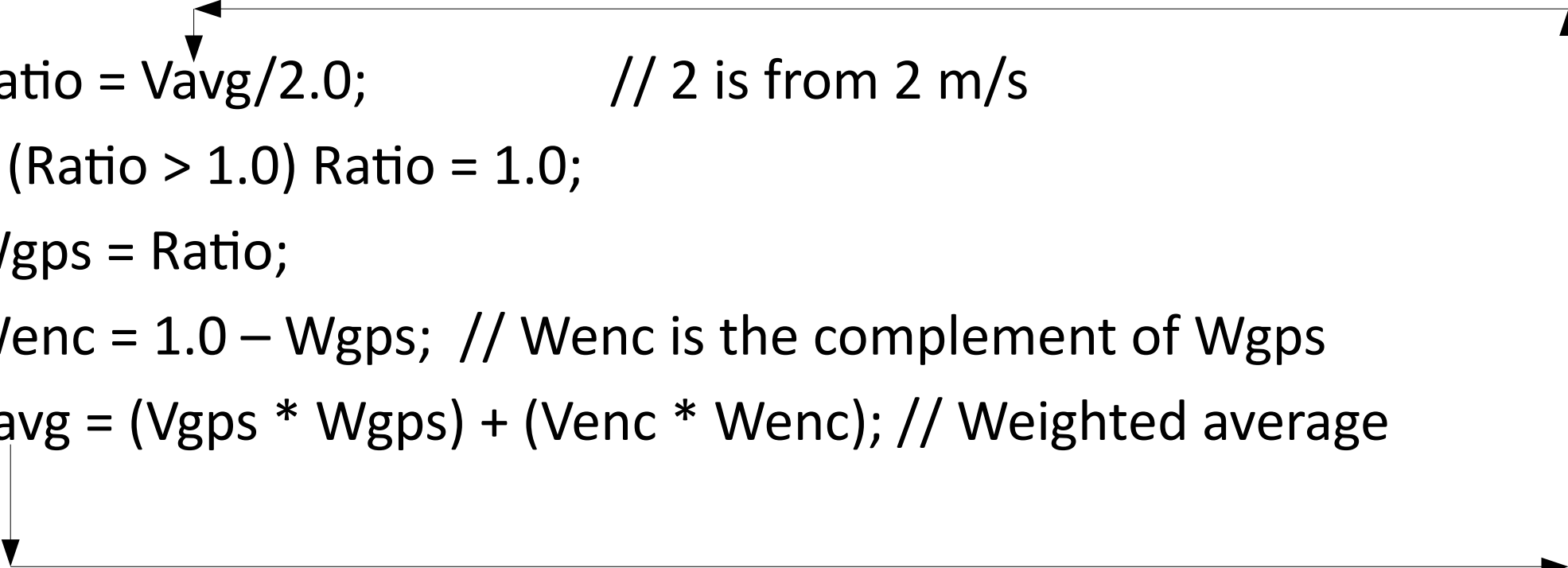


# Example 1

- GPS speed is assumed perfect when going above 2 m/s (100%)
- Encoders are assumed worthless when going above 2 m/s (0%)



# Example 1

- `Ratio = Vavg/2.0;` // 2 is from 2 m/s
  - `If (Ratio > 1.0) Ratio = 1.0;`
  - `Wgps = Ratio;`
  - `Wenc = 1.0 – Wgps;` // Wenc is the complement of Wgps
  - `Vavg = (Vgps * Wgps) + (Venc * Wenc);` // Weighted average
- 

## Example 2

- Compute heading of a robot with magnetometer, GPS, and gyro.
- Magnetometer is useless if motors are turned on.
- GPS heading is useless unless moving at 2 m/s
- Gyro heading degrades over 120 seconds since last discipline.
  
- This is not an easy split of weights as last time!

# Gyro Discipline

- A gyro provides an angular rate output not an angle.
- You can integrate the rate to get an angle.
- That angle is not absolute but relative.
- Somehow you need to set the gyro what the real heading is.
- This is called disciplining a gyro.
- It can be done lots of ways including:
  - Pointing the robot north than pressing a button.
  - Transferring the heading from another sensor (like a compass)

# Example 2

Weight for the magnetometer

```
If (ESC == 0.0) { // Electronic Speed Control
    Wmag = 1.0;
} else {
    Wmag = 0.0;
}
```

## Example 2

Weight for the GPS heading

Ratio = speed/2.0; // 2 m/s

If (Ratio > 1.0) Ratio = 1.0;

Wgps = Ratio;

# Example 2

Weight for the Gyro

```
tRatio = 1.0 - timeSinceLastDisciplineInSeconds / (2*60);
```

```
If (tRatio > 1.0) tRatio = 1.0;
```

```
If (tRatio < 0.0) tRatio = 0.0;
```

```
Wgyro = tRatio;
```

# Not Complementary

- The weights as just computed are not guaranteed to be complementary.
- If the robot has been stationary for a while, then
  - $W_{mag} = 1.0$
  - $W_{gps} = 0.0$
  - $W_{gyro} = 1.0$ ; // Constant disciplining.
- If the robot is creeping along
  - $W_{mag} = 0.0$
  - $W_{gps} = 0.0$
  - $W_{gyro} =$  Depends on last time the gyro was disciplined
- If the robot is moving quickly
  - $W_{mag} = 0.0$
  - $W_{gps} = 1.0$
  - $W_{gyro} =$  Depends on last time the gyro was disciplined



# Normalizing the weights

- $\text{sum} = W_{\text{gps}} + W_{\text{mag}} + W_{\text{gyro}}$
- $W_{\text{gps}} = W_{\text{gps}}/\text{sum}$
- $W_{\text{mag}} = W_{\text{mag}}/\text{sum}$
- $W_{\text{gyro}} = W_{\text{gyro}}/\text{sum}$
  
- Watch out should sum be zero!
  
- Other ways might be more appropriate for your situation

# Sidebar on Averaging Headings

- Angles are a pain because they are 'circular'.
- There is a discontinuity when you go from 359 to 0 degrees.
- Or at +/- 180 for 'half circle angles'.
- Average of 359 and 1 degree should be 0/360 but gives you 180!
- It is very difficult to write exception code to take this into account.
- It is even more difficult to do this with differing weights.
- But there is a trick!

# Averaging Headings

$\text{sumSines} = \sin(H1)*W1 + \sin(H2)*W2 + \dots + \sin(Hn)*Wn;$

$\text{sumCosines} = \cos(H1)*W1 + \cos(H2)*W2 + \dots + \cos(Hn)*Wn;$

$\text{avg} = \text{atan2}(\text{sumSines}, \text{sumCosines});$

Computationally a bit expensive, but it solves the logic issues.

Just be careful when both sums are zero!

## Example 3

Drone with an accelerometer and a gyro trying to determine pitch.

The accelerometer works very well over long periods of time.

The gyro works well over short periods of time.

Sounds like a job for “Complementary Man”!

# Example 3

$$W_{\text{Accel}} = 0.8$$

$$W_{\text{Gyro}} = 1.0 - W_{\text{accel}}$$

$$\text{Pitch}_{\text{Avg}} = \text{Pitch}_{\text{Accel}} * W_{\text{accel}} + \text{Pitch}_{\text{Gyro}} * W_{\text{gyro}}$$

“Lets take most of the accelerometer and only mix in a bit of the gyro.”

# Time Filter For Noisy Data

A small variant of this filter is very useful for time averaging noisy inputs.  
(exponential averaging)



$$\text{Volt}_{\text{Avg}} = \text{Volt}_{\text{Avg}} * (1-w) + \text{Volt}_{\text{Raw}} * (w)$$

$w = 1 - e^{-\Delta t / \tau}$  Where  $\Delta t$  is the sample time and  $\tau$  is the time constant.

“Take a chunk of the old average and add in a bit of the new value.”

# Kalman Filter

- Kalman filter is not much more than a glorified complementary filter
- Differences
  - The weights are computed using statistics.
  - One of the inputs is a math model of how the system should work.

Questions?