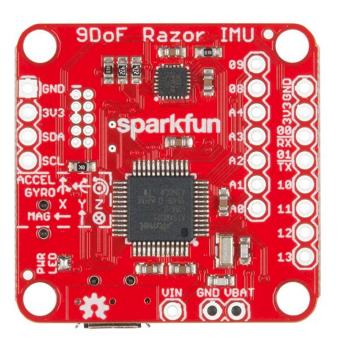
# Adapted From: Inertial Measurement Units

Aditya Chaudhry, Chris Shih, Alex Skillin, Derek Witcpalek

#### **IMUs**

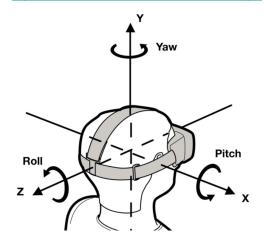
An IMU, inertial measurement unit, is a sensor package containing 3 discrete sensors that can be used to track movement and orientation of objects



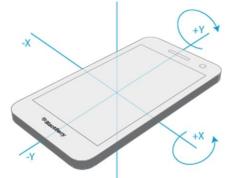
http://www.robo-dyne.com/en/shop/sparkfun-9dof-razor-imu-m0/

# What can you use it for?

- Motion Capture
  - o Gaming controllers for motion (Wii), VR Headsets
- Vehicle Tracking
  - IMU with GPS can keep track of moving ground vehicles
- Attitude and Heading Reference System
  - Calculate a vehicle's heading relative to magnetic north
- Orientation Sensors
  - Phones, tablets, smart watches use to keep track of their orientation



<u>Inertial Sensors - Dr. Kostas</u> <u>Alexiswww.kostasalexis.com/inertial-sensors.html</u>



#### What is in an IMU?

Fusion of three sensor types

Gyroscopes -> Angular Velocity (rad/s or deg/s)

Accelerometer -> Linear Acceleration (m/s^2 or g)

Magnetometer -> Magnetic field strength (micro-Tesla or Gauss)

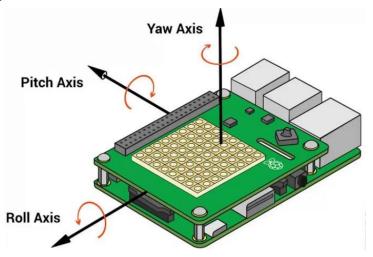
Using a combination of multiple outputs allows us to build robust, complex systems that can achieve higher levels of accuracy

# Degrees of Freedom

Typically, one sensor per type needed on each axis

- 6DOF 3-axis accelerometer + 3-axis gyroscope
- 9DOF 6DOF + 3-axis magnetometer
- 10DOF 9DOF + barometric pressure sensor
- 11DOF 10DOF + GPS

Some manufacturers make other combinations
(Digikey lists accelerometer+magnetometer 6-axis IMUs)



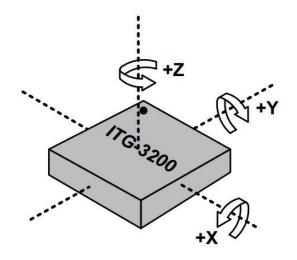
https://projects-static.raspberrypi.org/projects/generic-theory-pitch-roll-yaw/1da6c9e518533fe8c1f70d7445fd6880d7dac12a/en/images/orientation.png

# Gyroscope

Gives angular velocity in degrees/second

Has constant bias which is affected by temperature

Bias changes over time (bias stability)



<u>Gyroscope - learn.sparkfun.com/tutorials/qyroscope/all?print=1</u>

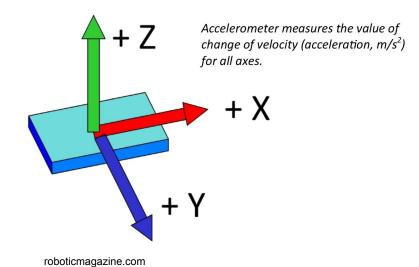
#### Accelerometer

Essentially measuring displacement value of a system for acceleration

Measured in terms of  $m/s^2$  or g

At rest an accelerometer measures the gravity vector pointing up

Accurate long term (no drift) but not short term (noise)



# Magnetometer

Measures magnetic field strength on each axis

Measured in Gauss (unit of magnetic flux) or μT (unit of magnetic field strength)

Points generally towards magnetic north

Can be distorted by nearby metals or electronics



http://www.iconarchive.com/show/small-n-flat-icons-by-paomedia/compass-icon.html

# Choosing an IMU

#### Principal considerations:

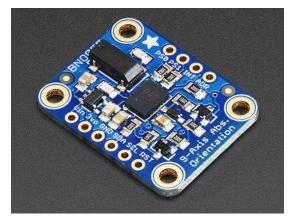
- Price
- Range and Resolution
- Degrees of Freedom
- Interface (Analog/Digital, which bus type)

#### More considerations:

- Noise distribution
- Power Consumption
- Gyro temperature offset

# Option A (<u>Adafruit 9-DOF</u> <u>Absolute Orientation IMU</u>)

Cost: ~\$36



https://cdn-shop.adafruit.com/145x109/2472-00.jpg

# Option B (<a href="PhidgetSpatial">PhidgetSpatial</a> <a href="Precision">Precision</a>)

Cost: ~\$140



https://www.phidgets.com/productfiles/1044/1044\_0/Images/31 50x-/0/1044\_0.jpg

# Comparison

	A (Adafruit 9-DOF IMU)	B (PhigetSpatial Precision)
Cost	\$36	\$140
Resolution	<mark>244.2μg, 0.06°/s</mark> , 300nT	<mark>76.3μg, 0.02°/s</mark> , 303nT
Range	±2g/±4g/±8g/±16g ±125°/s to ±2000°/s ±1300μT (x-, y-axis), ±2500μT (z-axis)	±2g/±8g ±400°/s or ±2000°/s ±550μT
Interfaces	I2C, UART	USB
DOF	9	9
Current Draw (max)	12.3 mA (@100Hz)	55 mA (@ 250Hz)
Bonus	Sensor fusion outputs, temperature sensor	Backup sensors for higher range with less precision

# Processing the data

Often want more data than what the sensor directly measures

Position, Velocity, Orientation

#### Examples:

Orientation: Gyroscope gives us our angular velocity, integrating will get position

Linear Velocity: Accelerometer gives us acceleration, integration gives velocity

Position: Knowing orientation and velocity we can predict location based off time

# Integrated Orientation

Estimate orientation by integrating angular velocities

Gyroscope data outputs angular velocity (deg/s)

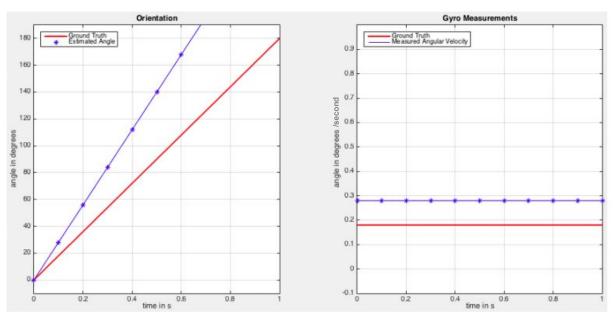
Riemann sum provides discrete-time approximation of integration

Riemann Sum Estimation of Orientation:

• 
$$\theta_{approx}(t) = \theta_{approx}(t-1) + \omega(t-1)^*\Delta t$$

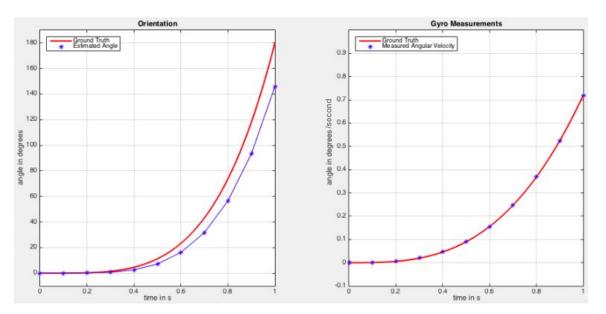
# Integrated Orientation: Error due to sensor bias

Gyro Integration: linear motion, no noise, bias



# Integrated Orientation: Error due to sampling rate

Gyro Integration: nonlinear motion, no noise, no bias



https://stanford.edu/class/ee267/lectures/lecture9.pdf

#### Solution: Sensor Fusion

Combination of multiple sensors to extract one measurement

Between IMU sensors: Attitude Heading Reference System (AHRS)

Can also fuse IMU with other sensors (e.g. GPS)

Helps to minimize effects of bias

Many approaches and types of filters/algorithms

Some sensors do these calculations onboard

# Gravity and Magnetic Field as References

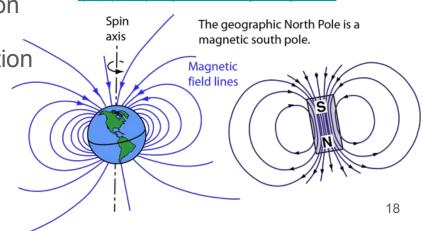
Two natural phenomena that provide valuable references

Acceleration due to gravity: 1g up

Magnetic Field Vector: Points generally "north"

If location known, can find real direction

Can utilize these values to supplement integration



hyperphysics.phy-astr.gsu.edu/hbase/magnetic/MagEarth.html

# Many algorithms, each with their own strengths

#### **Complementary Filter**

Easy to visualize and implement

#### Kalman filter

High performance, but complex and computationally expensive

#### Madgwick Filter

Computationally efficient for use in low-resource systems

# Example: Complementary Filter to Find Orientation

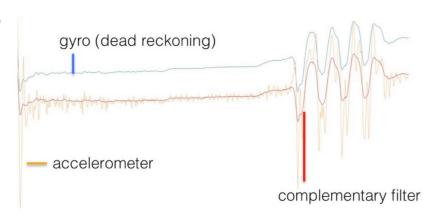
Gyroscope, Accelerometers, Magnetometers provide relevant data

Accelerometers can measure pitch/roll at rest, but suffer from noise when moving

Integration of gyroscope compounds low-frequency bias over time

Low-pass filter on accelerometers, magnetometer

High-pass filter on gyroscopes



https://stanford.edu/class/ee267/lectures/lecture9.pdf

# **Example: Real Time Navigation**

#### Problem:

Plane navigation systems and local robots cannot rely on GPS to give them accurate position

#### Goal:

Create a device that can process current data to get a sense of its direction without the use of a dedicated GPS system

# Real Time Navigation

Data we have:

- Our last position
- Orientation measurements
- Velocity measurements

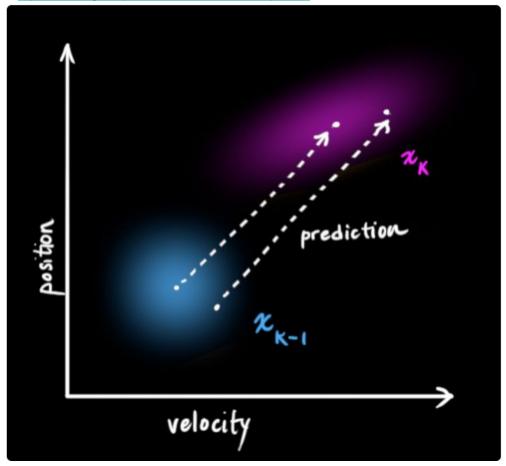
Let that be the data we input into a filter and let the output be our position now

Such a filter is called a Kalman Filter

#### Kalman Filter

- A recursive algorithm to predict current state by combining real time measurements, a mathematical model of the system, and our previous states
  - Kalman(last position, current\_orientation, current\_velocity, mathematical model) → current position
- This prediction algorithm is more accurate than just taking one single variable (i.e. just our previous trajectory or just current measurements)

http://www.bzarg.com/p/how-a-kalman-filter-works-in-pictures/



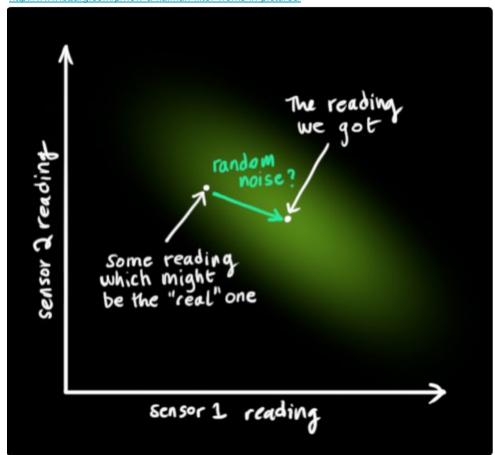
#### Step 1:

At t0, keep track of a previous state distribution (estimation of location and all possible locations) -- blue

Step 2:

At t1, create a new probability distribution of location based off your previous state (mathematical model) -- pink

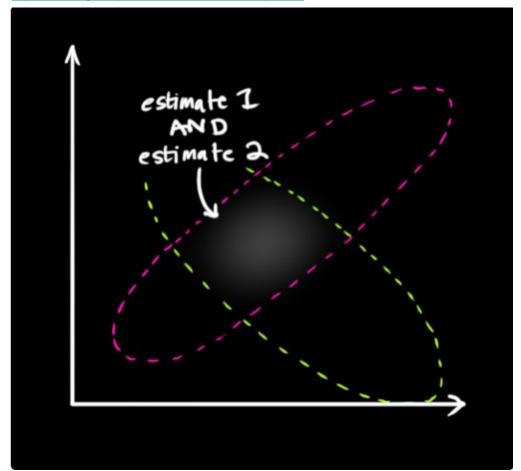
http://www.bzarg.com/p/how-a-kalman-filter-works-in-pictures/



#### Step 3:

At t1, take measurements and create probability distribution of a location based on the data (measurement model)

http://www.bzarg.com/p/how-a-kalman-filter-works-in-pictures/



#### Step 4:

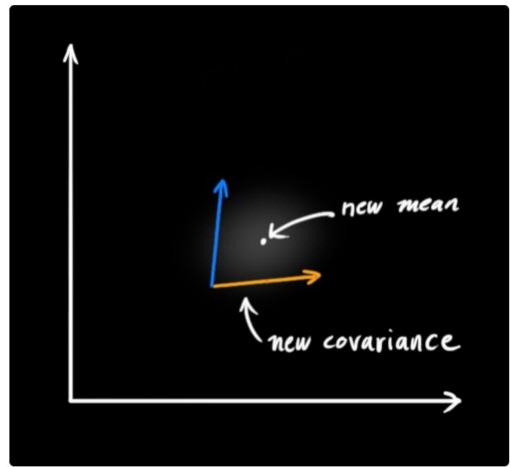
At t2, create a new distribution that is intersection of the two models

Pink: probability model

Green: measurement model

White: intersection of models

http://www.bzarg.com/p/how-a-kalman-filter-works-in-pictures/



#### Step 5:

At t2, the new distribution is now the previous state and repeat steps 1 - 4

#### Conclusion

- Where IMUs are used
  - See them in multiple industries being used for movement tracking
- What makes up an IMU
  - 3 sensors and outputs:
    - Accelerometer for linear acceleration
    - Gyroscope for angular velocities
    - Magnetometer for heading
- How to choose one
  - o Pay attention to price, range and resolution, and degrees of freedom
- How to get useful data
  - Sensor Fusion helps us combine multiple sensor to get more accurate readings
    - Multiple techniques: Kalman, Complementary and Madgwick filtering

#### Sources

- https://www.samba.org/tridge/UAV/madgwick\_internal\_report.pdf
- https://stanford.edu/class/ee267/lectures/lecture9.pdf
- <a href="https://www.navlab.net/Publications/Introduction to Inertial Navigation and Kalman Filtering.pdf">https://www.navlab.net/Publications/Introduction to Inertial Navigation and Kalman Filtering.pdf</a>
- http://hyperphysics.phy-astr.gsu.edu/hbase/magnetic/MagEarth.html
- https://electroig.com/2010/11/introduction-to-mems-gyroscopes/
- https://learn.sparkfun.com/tutorials/accelerometer-basics/all
- https://www.vectornav.com/support/library/gyroscope
- https://www.sparkfun.com/pages/accel\_gyro\_guide
- https://www.adafruit.com/product/2472
- https://www.phidgets.com/?tier=3&catid=10&pcid=8&prodid=1038
- <a href="http://www.bzarg.com/p/how-a-kalman-filter-works-in-pictures/">http://www.bzarg.com/p/how-a-kalman-filter-works-in-pictures/</a>
- http://www.pieter-jan.com/node/11