

# Inertial Motion Tracking using IMUs



# Inertial Measurement Unit (IMU)

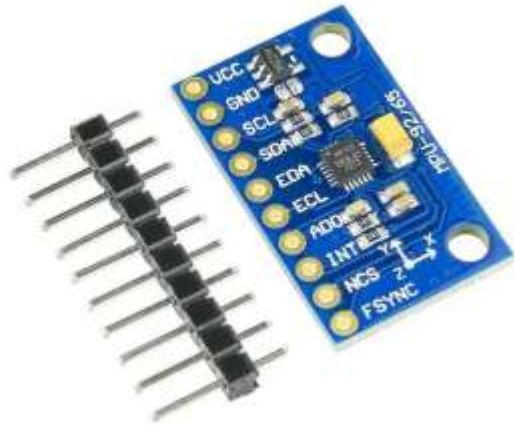


Accelerometer

Gyroscope

Magnetometer

# Inertial Measurement Unit (IMU)



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Gyroscope

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# Inertial Measurement Unit (IMU)



Accelerometer

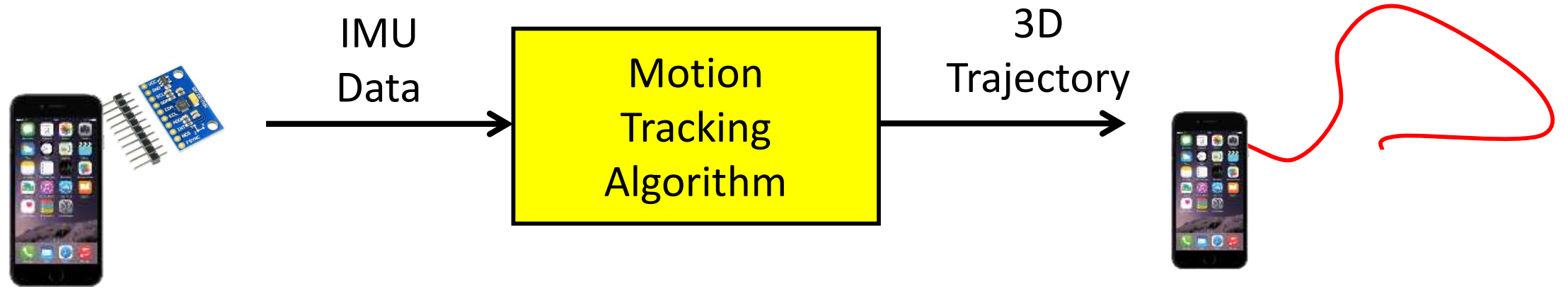
Gyroscope

Magnetometer



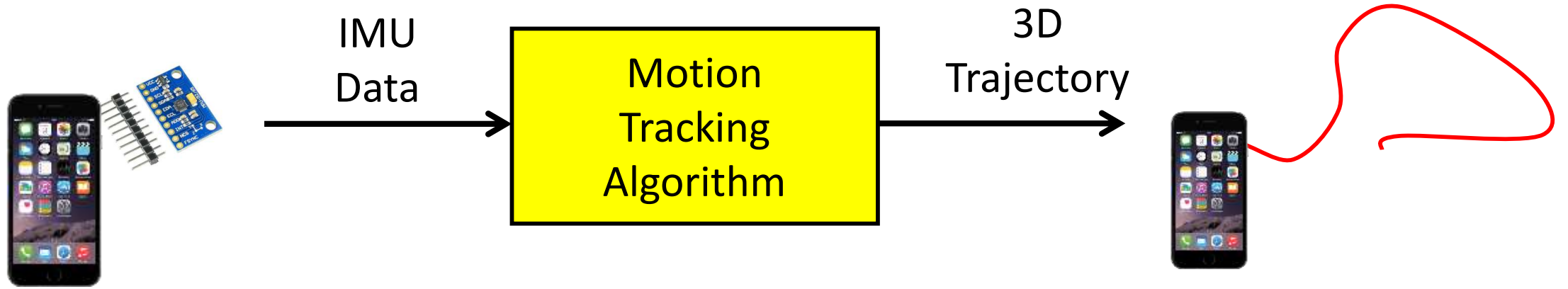
**Wide applications in motion tracking**

# Lot of work in inertial motion tracking



**Open problem in mobile computing**

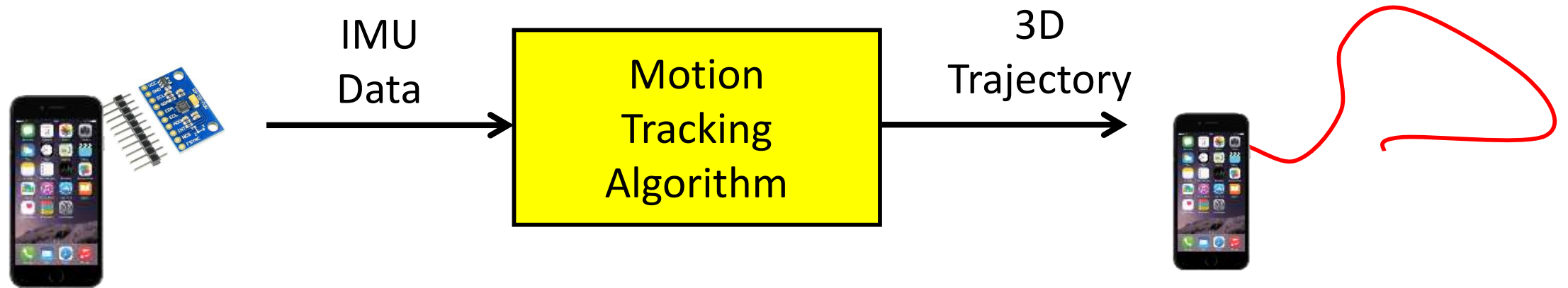
# Lot of work in inertial motion tracking



**Open problem in mobile computing**

**No one has the solution ... but people making progress**

# Lot of work in inertial motion tracking



**Open problem in mobile computing**

**No one has the solution ... but people making progress**

**Let's understand what's the real difficulty here ...**

# One Prerequisite Slide: Rotation Matrices

- Rotation is a function

$$\text{Rot}_{90^\circ} \left( \begin{array}{c} \text{y: } \begin{bmatrix} 0 \\ 1 \end{bmatrix} \\ \text{x: } \begin{bmatrix} 1 \\ 0 \end{bmatrix} \end{array} \right) = \begin{array}{c} \text{y: } \begin{bmatrix} -1 \\ 0 \end{bmatrix} \\ \text{x: } \begin{bmatrix} 0 \\ 1 \end{bmatrix} \end{array}$$

- Mathematically, rotation is a matrix

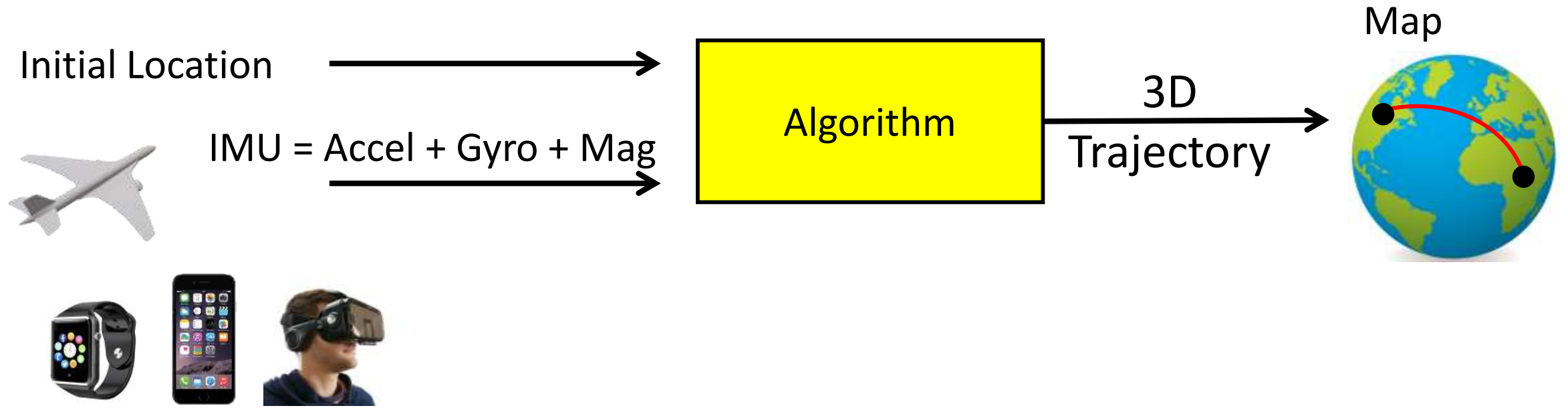
$$\begin{bmatrix} \cos 90^\circ & -\sin 90^\circ \\ \sin 90^\circ & \cos 90^\circ \end{bmatrix} \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} = \begin{bmatrix} 0 & -1 \\ 1 & 0 \end{bmatrix}$$

- Same for 3D Rotation

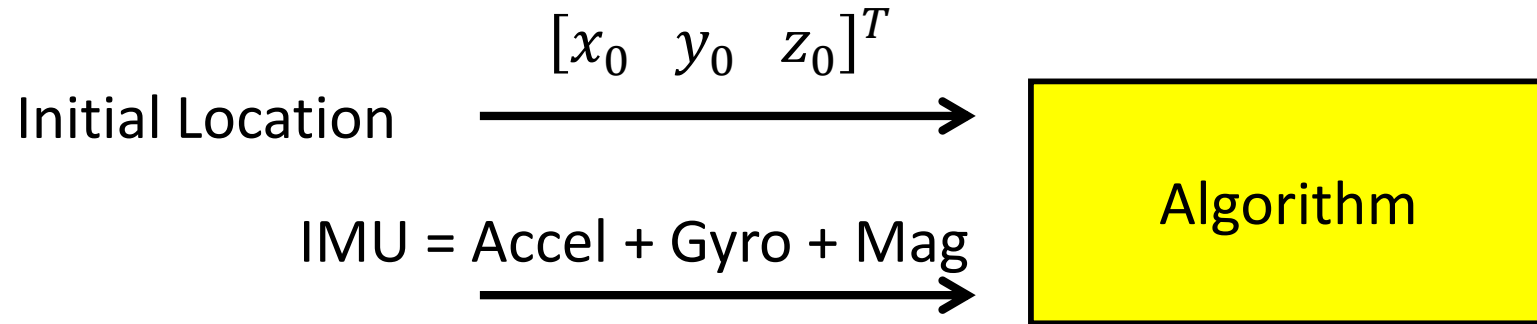
$$\begin{bmatrix} 3 \times 3 \\ \text{Rotation} \\ \text{Matrix} \end{bmatrix} \left[ \begin{array}{c} \text{3D coordinate system} \end{array} \right] = \left[ \begin{array}{c} \text{rotated 3D coordinate system} \end{array} \right]$$



# MUSE: Our Goal is 3D Localization



# Let's Understand the Inputs



Zoom into IMU data:

$$\text{Accel.} = \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix}$$

(Linear Acceleration)

$$\text{Gyro.} = \begin{bmatrix} g_x \\ g_y \\ g_z \end{bmatrix}$$

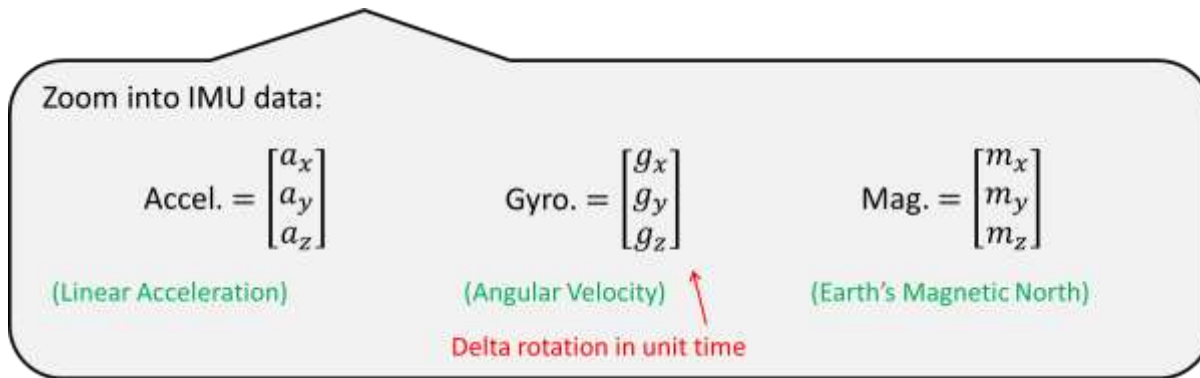
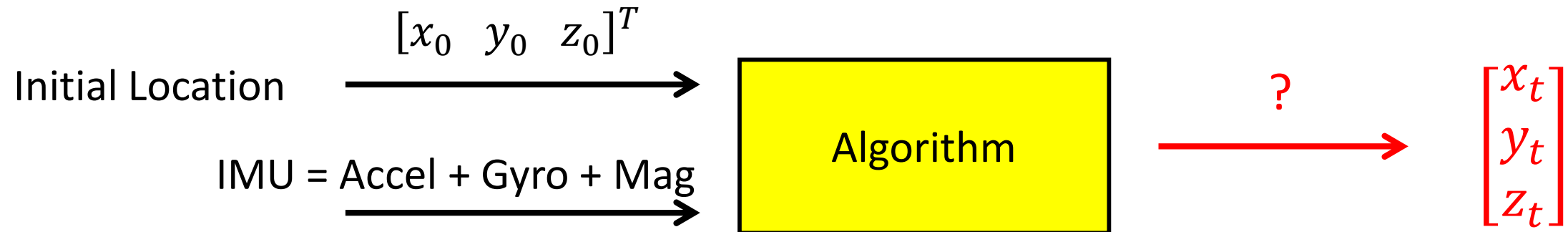
(Angular Velocity)

Delta rotation in unit time

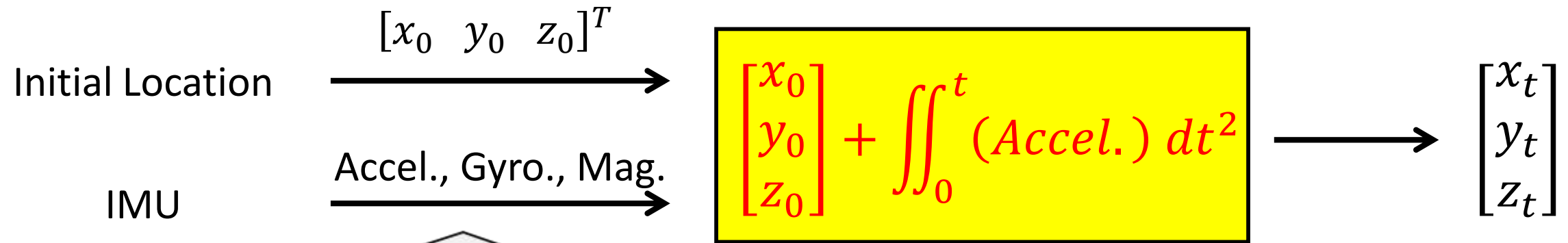
$$\text{Mag.} = \begin{bmatrix} m_x \\ m_y \\ m_z \end{bmatrix}$$

(Earth's Magnetic North)

# Can we solve localization with these inputs?



# One possibility is:



Zoom into IMU data:

Accel. = $\begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix}$ (Linear Acceleration)	Gyro. = $\begin{bmatrix} g_x \\ g_y \\ g_z \end{bmatrix}$ (Angular Velocity) <small>Delta rotation in unit time</small>	Mag. = $\begin{bmatrix} m_x \\ m_y \\ m_z \end{bmatrix}$ (Earth's Magnetic North)
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But there is one BIG problem: Accel. =  $\begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix}$  is in local reference frame

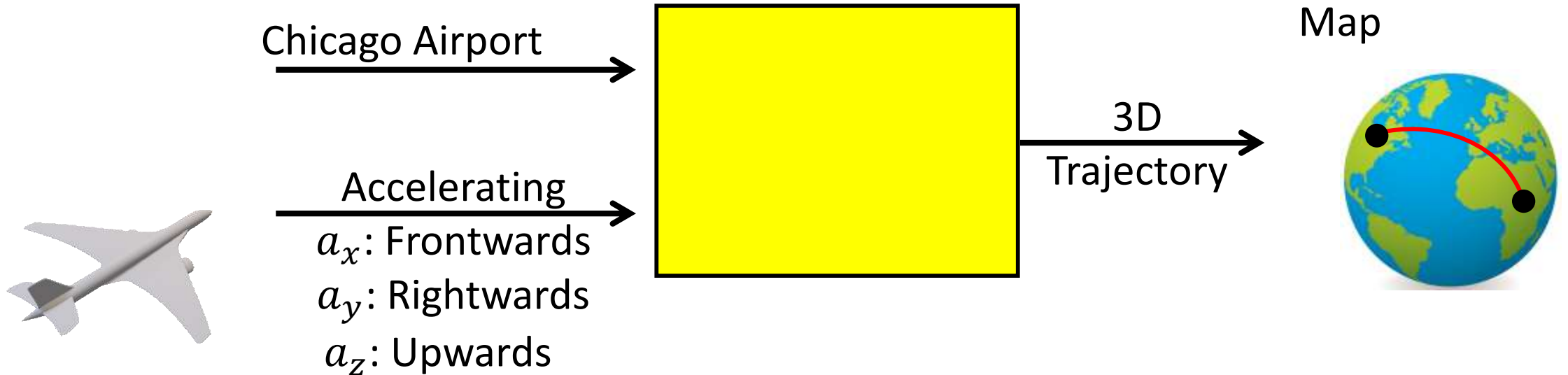
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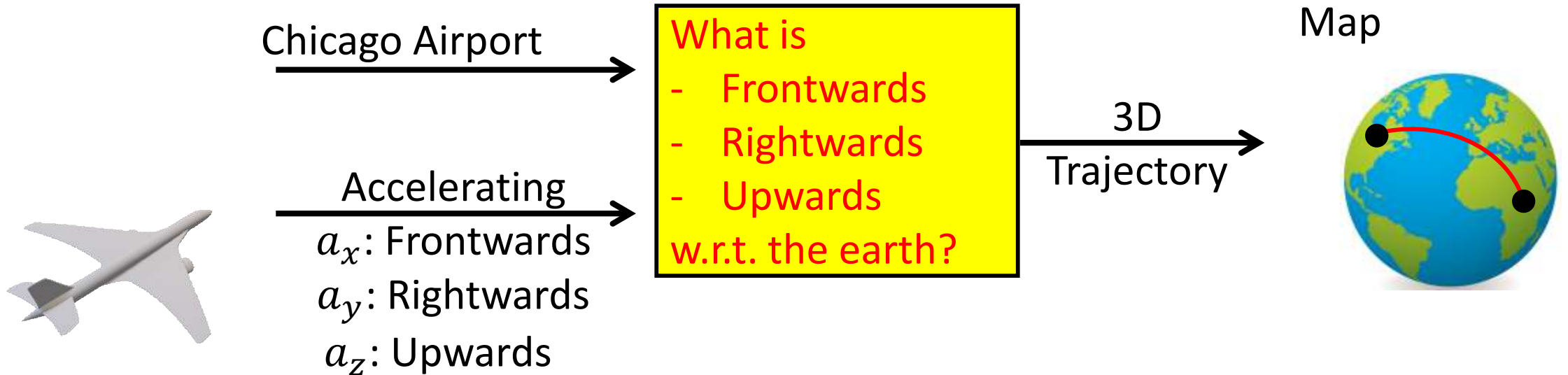
## As an analogy



But there is one BIG problem:

Accel. =  $\begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix}$  is in local reference frame

## As an analogy



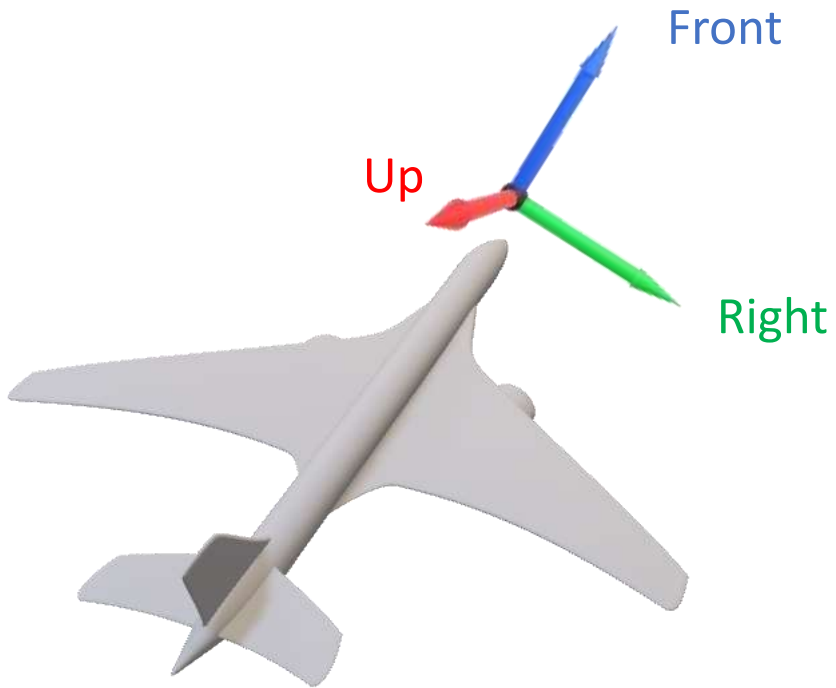
This makes orientation necessary



# This makes orientation necessary

- What is 3D orientation? Orientation is the **3D rotation needed** to make:

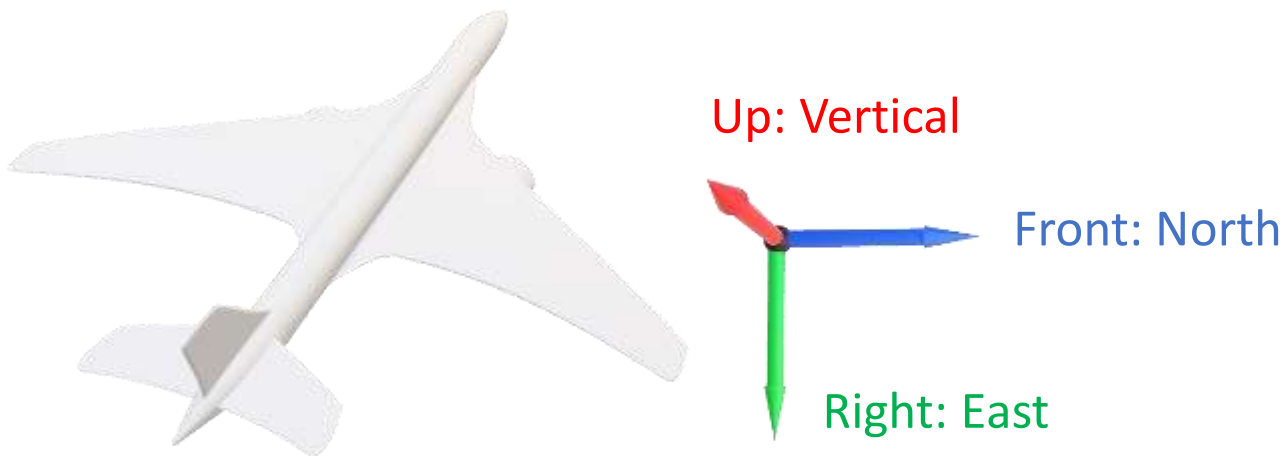
$$\text{Plane's Own} \begin{bmatrix} \text{Frontwards} \\ \text{Rightwards} \\ \text{Upwards} \end{bmatrix} \longrightarrow \begin{bmatrix} \text{Northwards} \\ \text{Eastwards} \\ \text{Vertical} \end{bmatrix}$$



# This makes orientation necessary

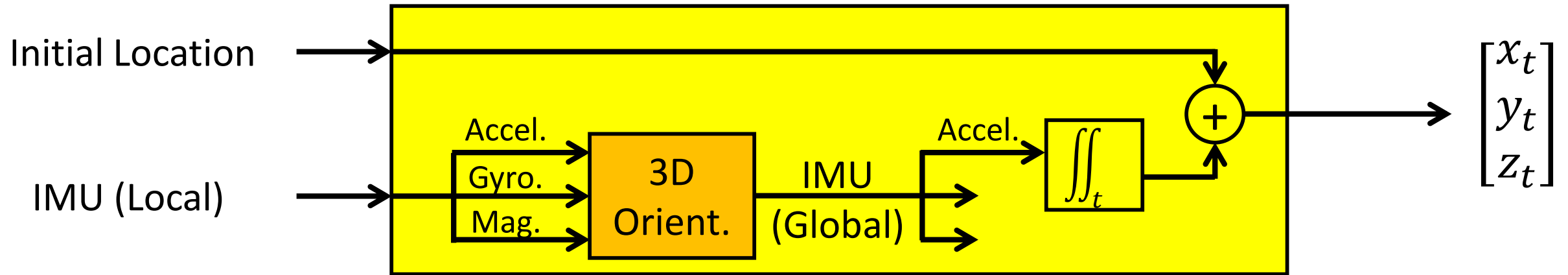
- What is 3D orientation? Orientation is the **3D rotation needed** to make:

$$\text{Plane's Own} \begin{bmatrix} \text{Frontwards} \\ \text{Rightwards} \\ \text{Upwards} \end{bmatrix} \longrightarrow \begin{bmatrix} \text{Northwards} \\ \text{Eastwards} \\ \text{Vertical} \end{bmatrix}$$



So, how will orientation solve the problem?

**What we need to do is:**



So 3D orientation is the key.

# So how to get 3D orientation?

2 Main Opportunities:

1. Gravity

2. Magnetic North



Both measurable by IMU

**Key idea: What rotation is needed such that**

- 1) Gravity** is exactly in my **downward** direction
- 2) North** is exactly in my **frontward** direction

# So how to get 3D orientation?

**Key idea: What rotation is needed such that**

- 1) Gravity** is exactly in my **downward** direction
- 2) North** is exactly in my **forward** direction

# So how to get 3D orientation?

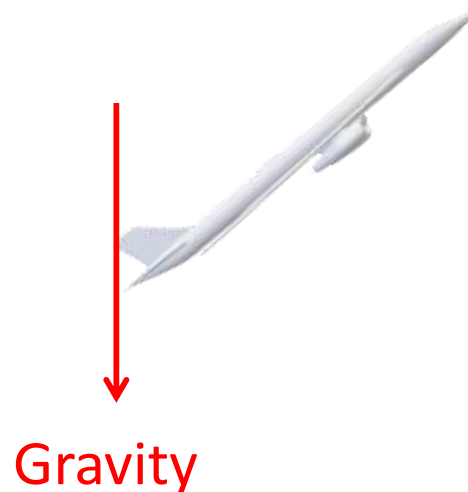
**Key idea: What rotation is needed such that**

- 1) **Gravity** is exactly in my **downward** direction
- 2) **North** is exactly in my **frontward** direction

$$\begin{bmatrix} 3 \times 3 \\ \text{Rotation} \\ \text{Matrix} \end{bmatrix} \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ -9.8 \end{bmatrix}$$

Tilt is determined (2 out of 3 DoFs)

Gravity says a lot about orientation,  
but not sufficient



Downward

# So how to get 3D orientation?

**Key idea: What rotation is needed such that**

- 1) Gravity is exactly in my downward direction
- 2) **North** is exactly in my **frontward** direction

$$\begin{bmatrix} 3 \times 3 \\ \text{Rotation} \\ \text{Matrix} \end{bmatrix} \begin{bmatrix} a_x \\ a_y \\ a_z \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ -9.8 \end{bmatrix}$$

Tilt + Heading is determined (all 3 DoFs)

$$\begin{bmatrix} 3 \times 3 \\ \text{Rotation} \\ \text{Matrix} \end{bmatrix} \begin{bmatrix} a_x & m_x \\ a_y & m_y \\ a_z & m_z \end{bmatrix} = \begin{bmatrix} 0 & 0 \\ 0 & 100 \\ -9.8 & 0 \end{bmatrix}$$



My orientation



North

Frontward

So is Gravity + North enough to get 3D Orientation?

Only when object is **static** ... but not otherwise. **Why?**



So is Gravity + North enough to get 3D Orientation?

Only when object is **static** ... but not otherwise. **Why?**

Because any motion of the object will reflect  
in the accelerometer ... thereby  
**polluting the gravity estimate**

# So how to get 3D orientation? (Another idea)

**Another Idea for Orientation:** Integrate angular velocity from gyro

Initial  
Orientation

+

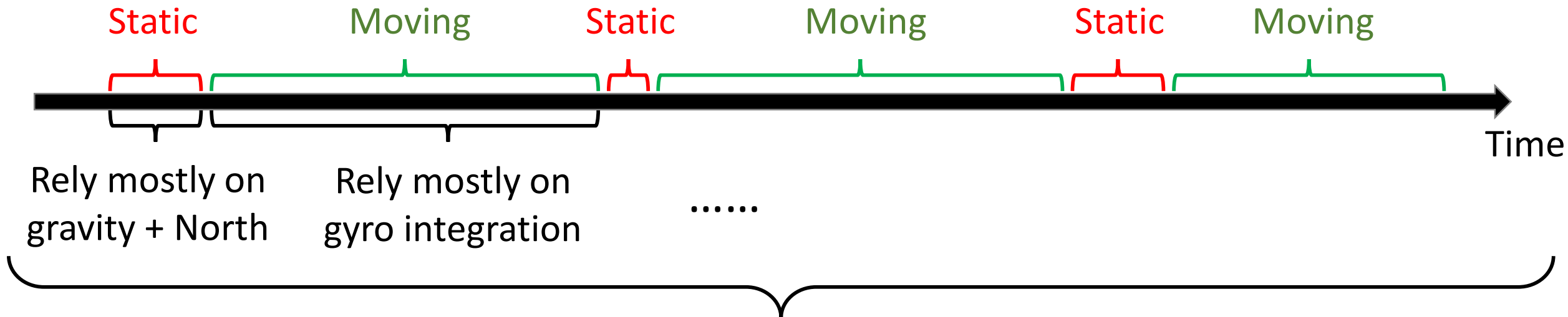
$$\int_0^t (\text{Gyro.}) dt$$

=

New  
Orientation (at time  $t$ )

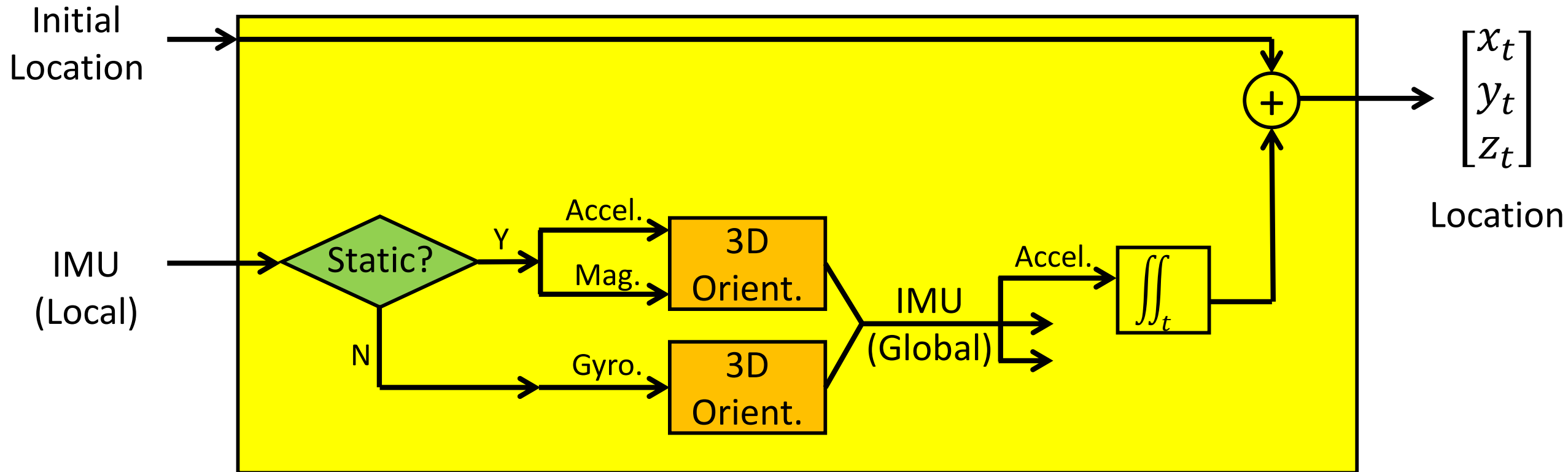
But gyro drifts, so only useful in short time scales

# State of the art today: Sensor Fusion

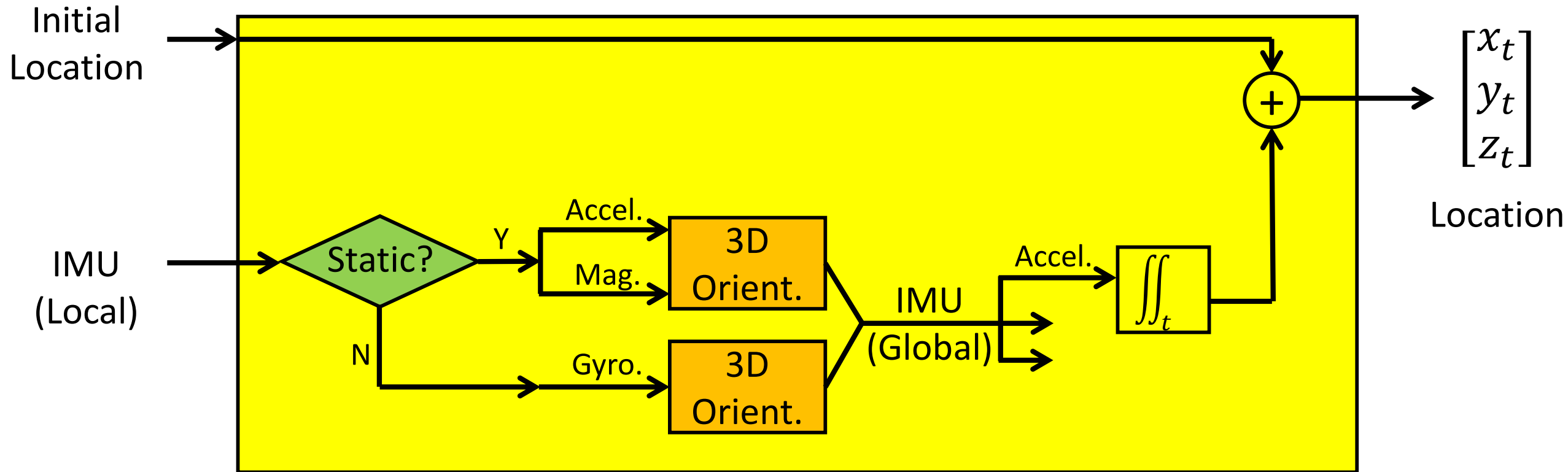


Always know 3D orientation

# Getting back to our goal



# Getting back to our goal



Main take away: Gravity is the main anchor for 3D orientation

But what if object is **not often static**

# But what if object is **not often static**



# But what if object is **not often static**



No good solution today ...



Your job to solve the problem ...

Questions ?