

Smart Systems for a Sustainable Future: The Anatomy of Intelligent Design

Applying Sensing, Communication, and Computation to Solve Real-World Challenges

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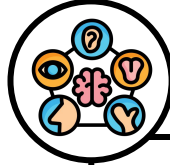
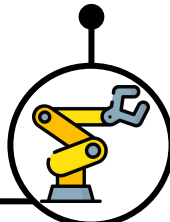
Reconfigurable Robotics Laboratory

EPFL, Switzerland

02/10/25

Sensor Fusion

Combining Information



Communication

Connecting the pieces

Computation

Thinking and Deciding



Online Demo

Give it a try!

The Shift in Automation's Purpose

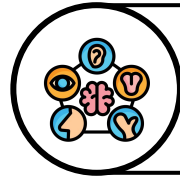
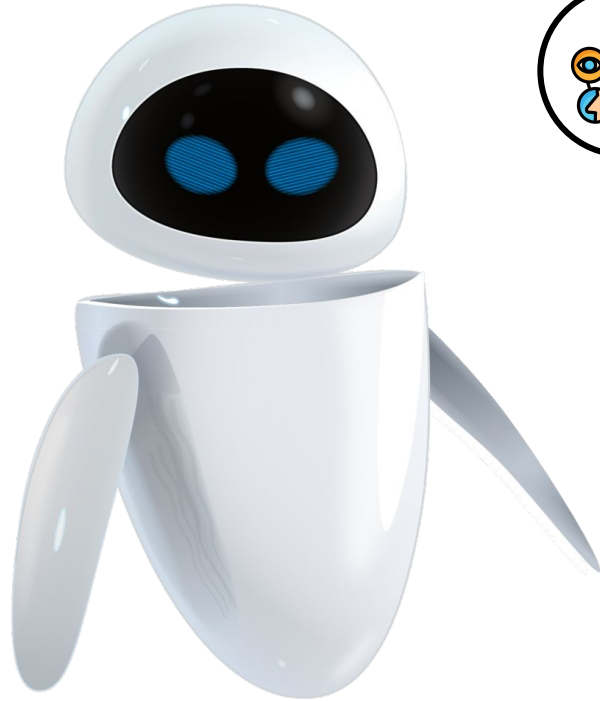


Automation = **Replacing** human labor, increasing speed, ensuring **repeatability**.

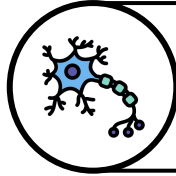


Automation = **Augmenting** systems for **optimal** performance. It's about making systems *aware, responsive, and efficient*.

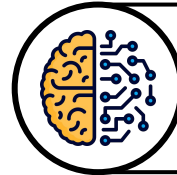
The System as a Living Organism



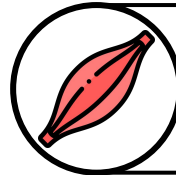
Sensing & Fusion



Communicating

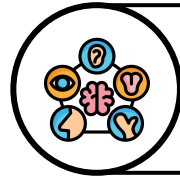
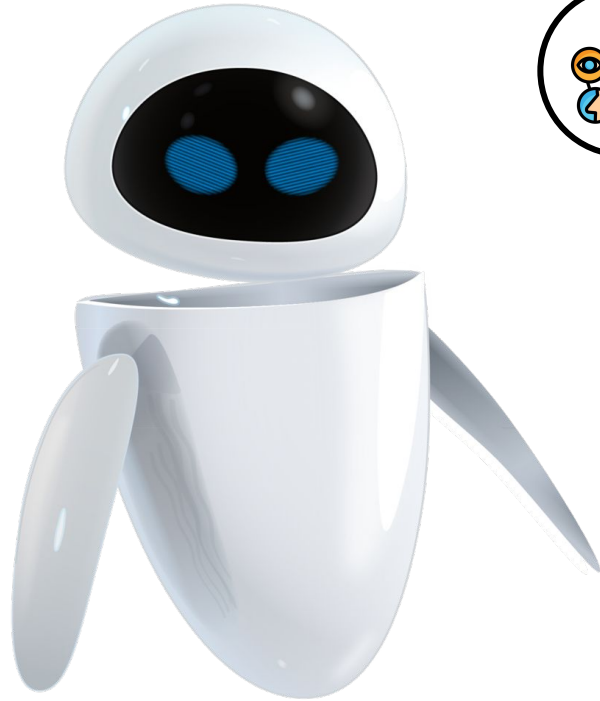


Computing

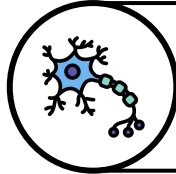


Actuating

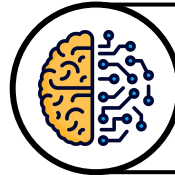
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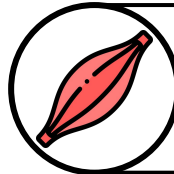
What is the world's state?



How does
information travel?



What should I do?



Actuating

What Do We Need to Sense?

Proprioception

(Self-awareness)

*Is the hydraulic press at
the right pressure?*

*Is the motor
overheating?*

Exteroception

(External Awareness)

*Is there a person
nearby?*

*Is the raw material
correctly aligned?*



"What info does the robot
absolutely need to know?"

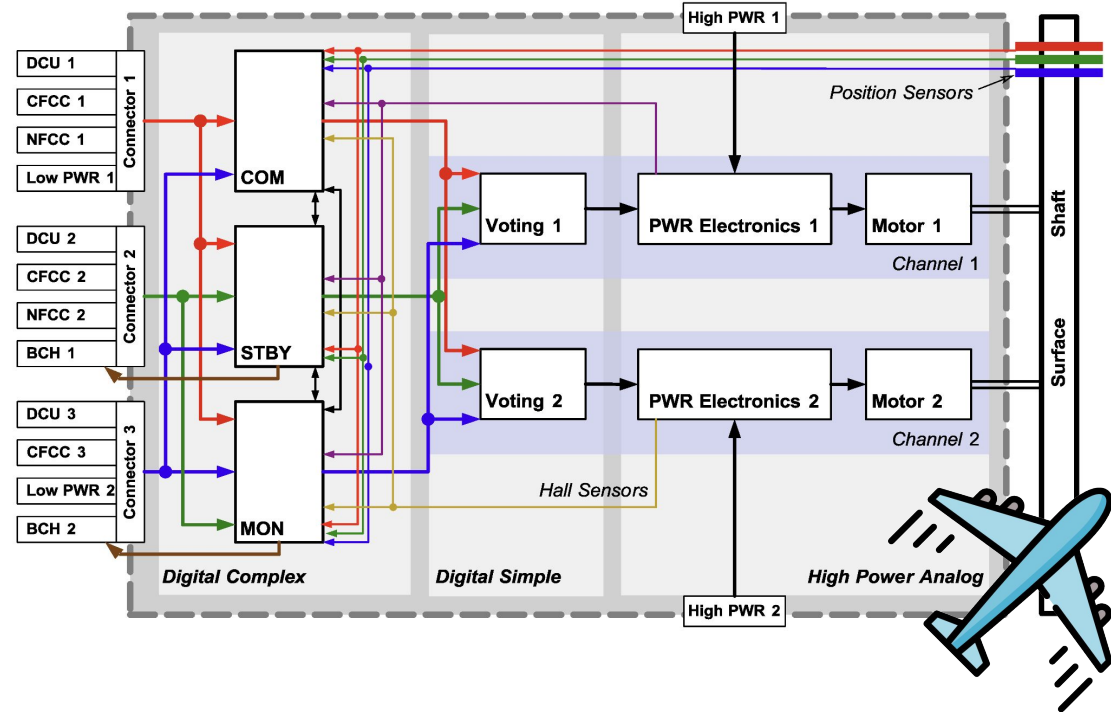


"Sensing enables you to
Manage & Optimize"

Sensor Fusion



"Critical systems **never** trust a **single source** of information."



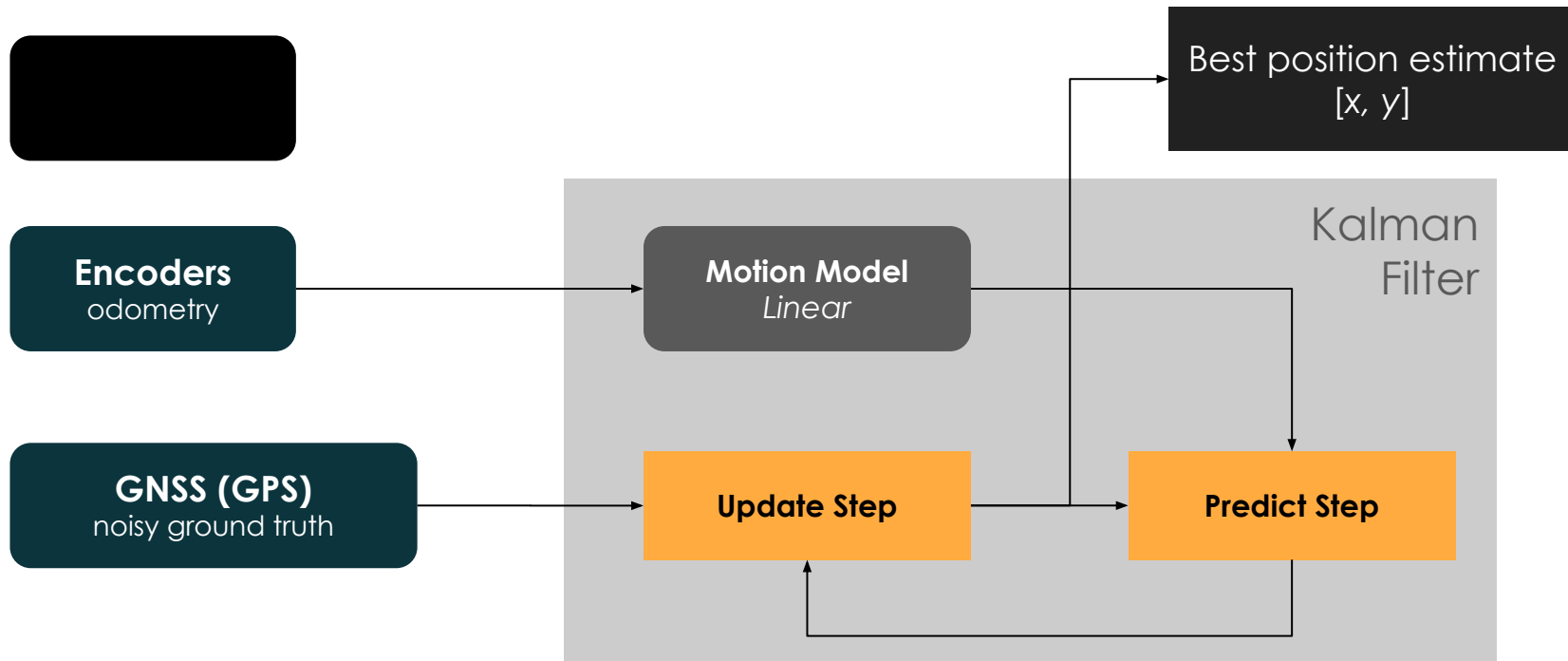
Design rules for trustworthy fusion

- **Diverse physics > duplicate parts**
e.g., person detection from *vision + thermal + ultrasonic cameras*
- **Time sync is king (!)**
consistent timestamps beat any algorithm
- **Know your error budget**
bias vs noise vs drift; track units and covariances
- **Calibrate & align**
intrinsic calibration per sensor and *extrinsics* between them (e.g., camera ↔ LiDAR).
- **Guard against correlated failures**
place sensors independently; consider 2oo3 (two-out-of-three) voting for safety-critical channels.
- **Graceful degradation**
define fallback modes when a sensor goes stale or saturated

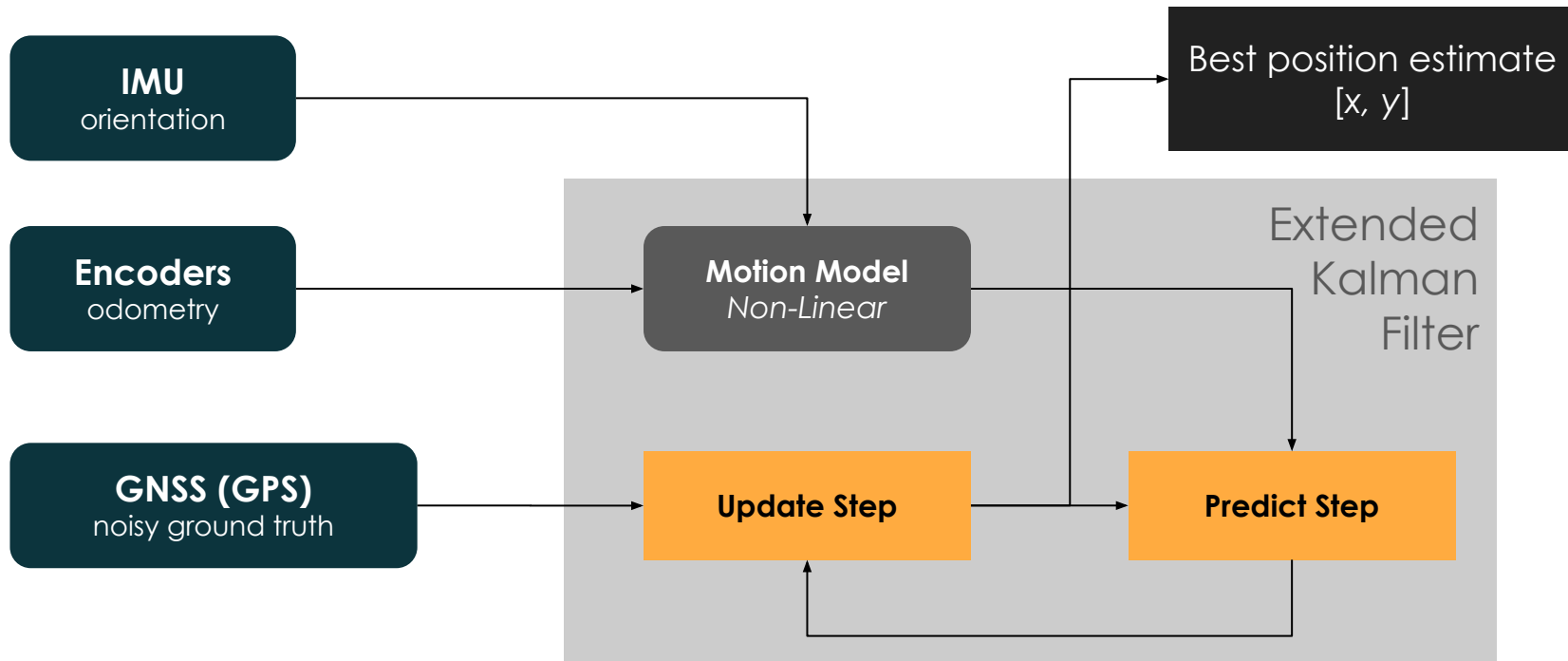
Fusion Techniques (among others...)

Technique	Core Idea <i>The Analogy</i>	Best For <i>The Use Case</i>
Kalman Filter	Predict & Correct	Linear Systems: When combining noisy measurements to track a single, smoothly changing state.
Extended KF / Unscented KF	Handling Curves	Moderately Non-Linear Systems: When estimating states in systems with curved or nonlinear dynamics.
Particle Filter	The Search Party	Highly non-linear or multi-modal systems: When there may be multiple plausible states.
Complementary Filter	The Fast Talker & the Slow Thinker	Resource-limited real-time fusion: Combining fast-drifting and slow-stable sensors.
Neural Networks	The Black Box Learner	Extremely Complex Systems with lots of data: When the physics is too hard or impossible to model.

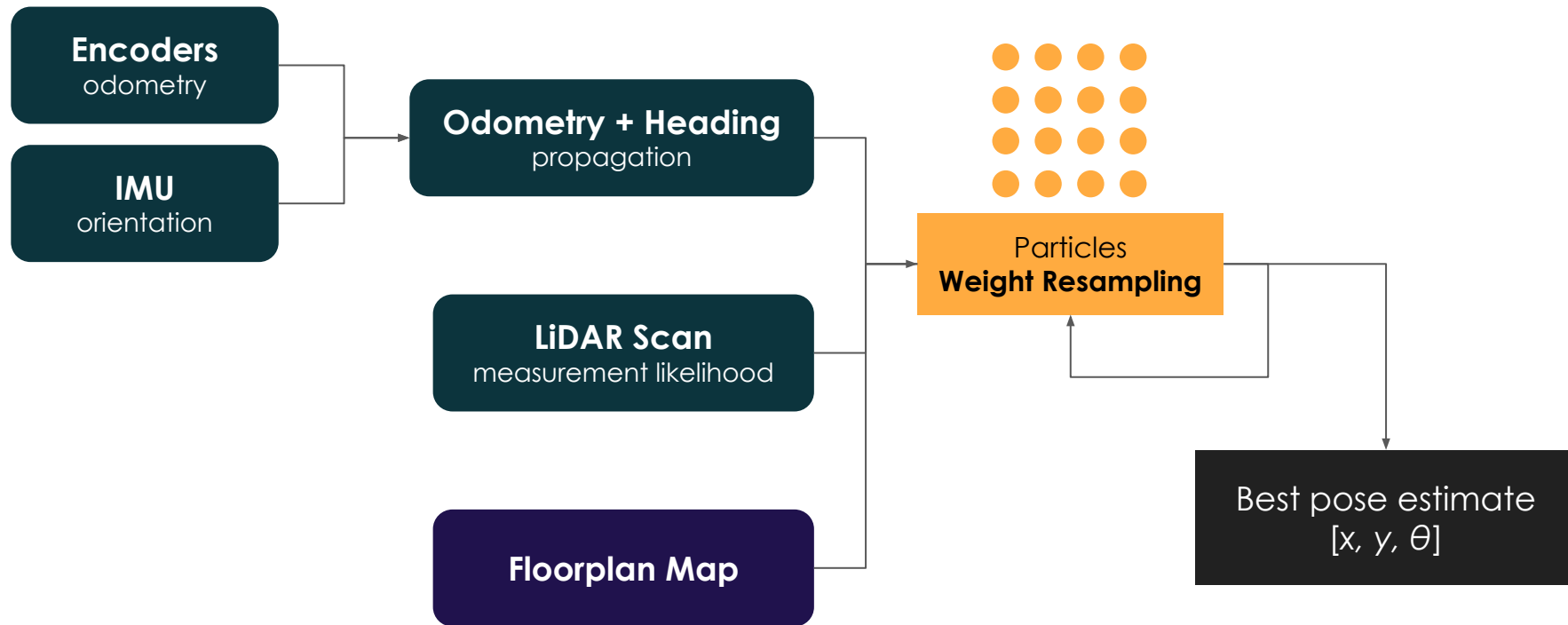
Robot Localization in open-field (straight)



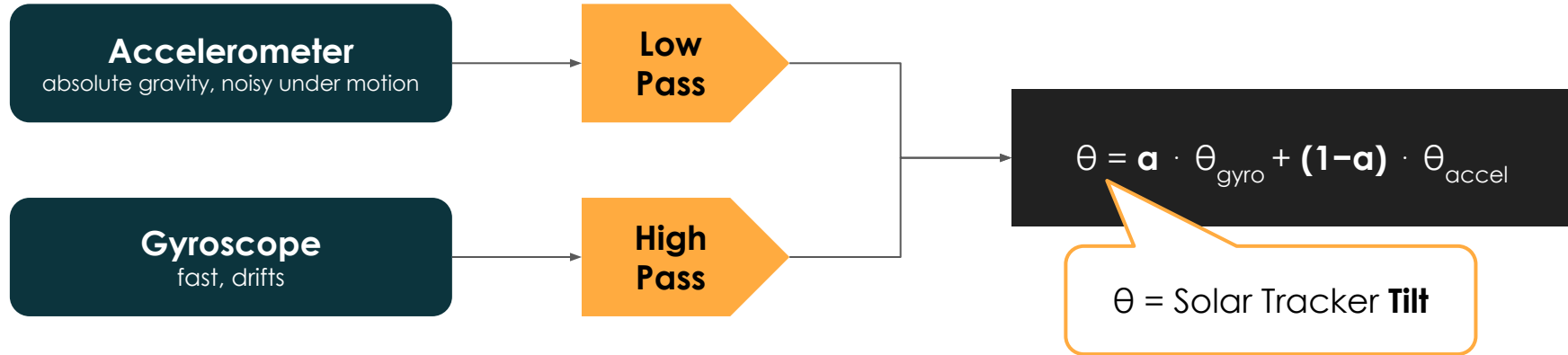
Robot Localization in open-field (curved)



Robot Localization in a building

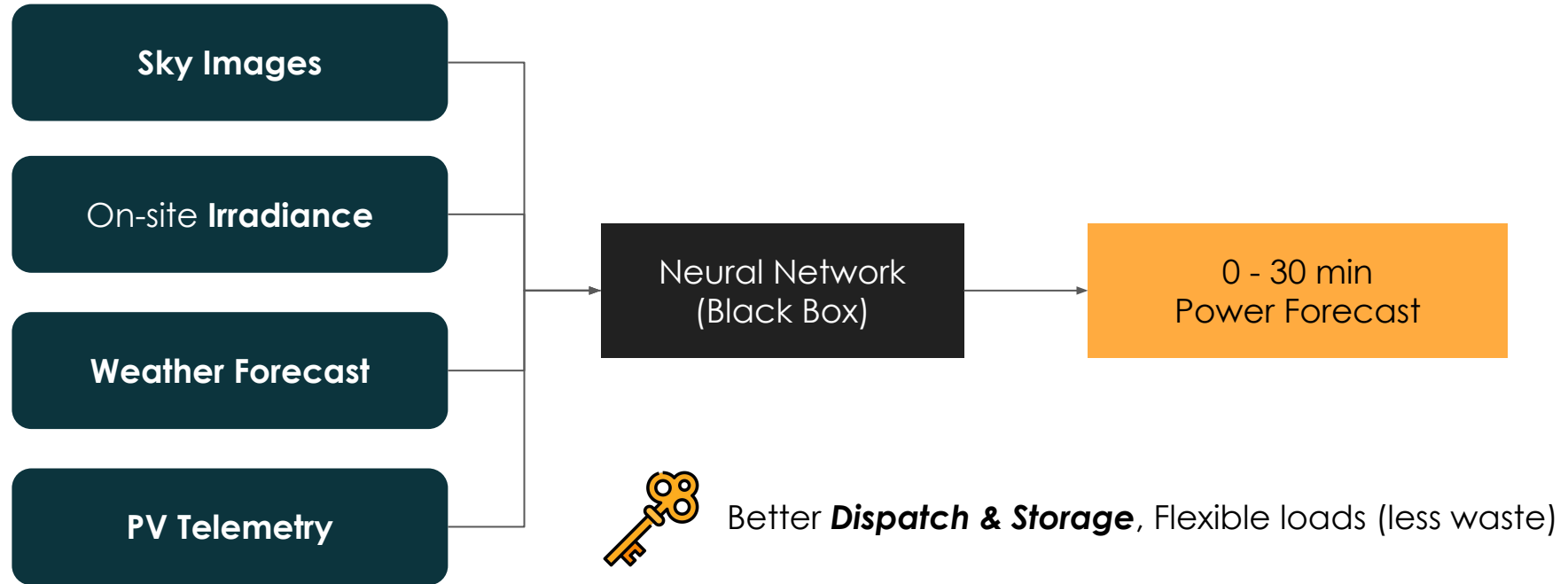


Tilt Estimation

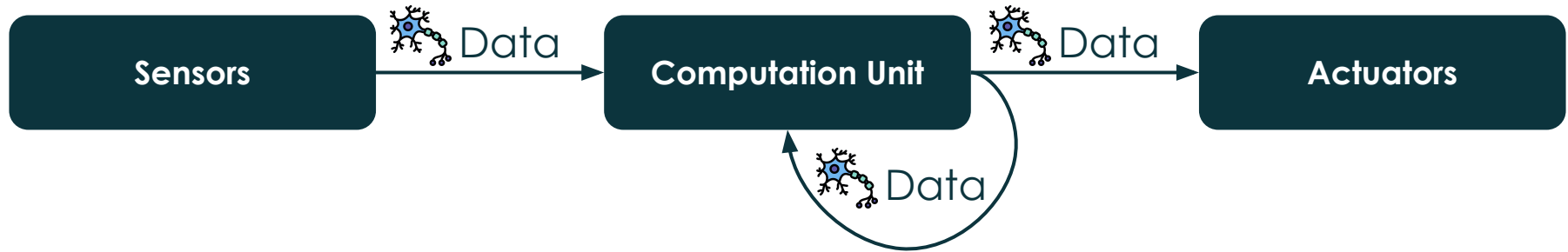


Better **pointing** → More kWh/day without expensive sensors.

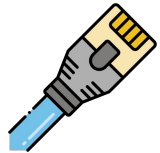
Photovoltaic (PV) Power Nowcasting



The Nervous System



Key Considerations:



vs

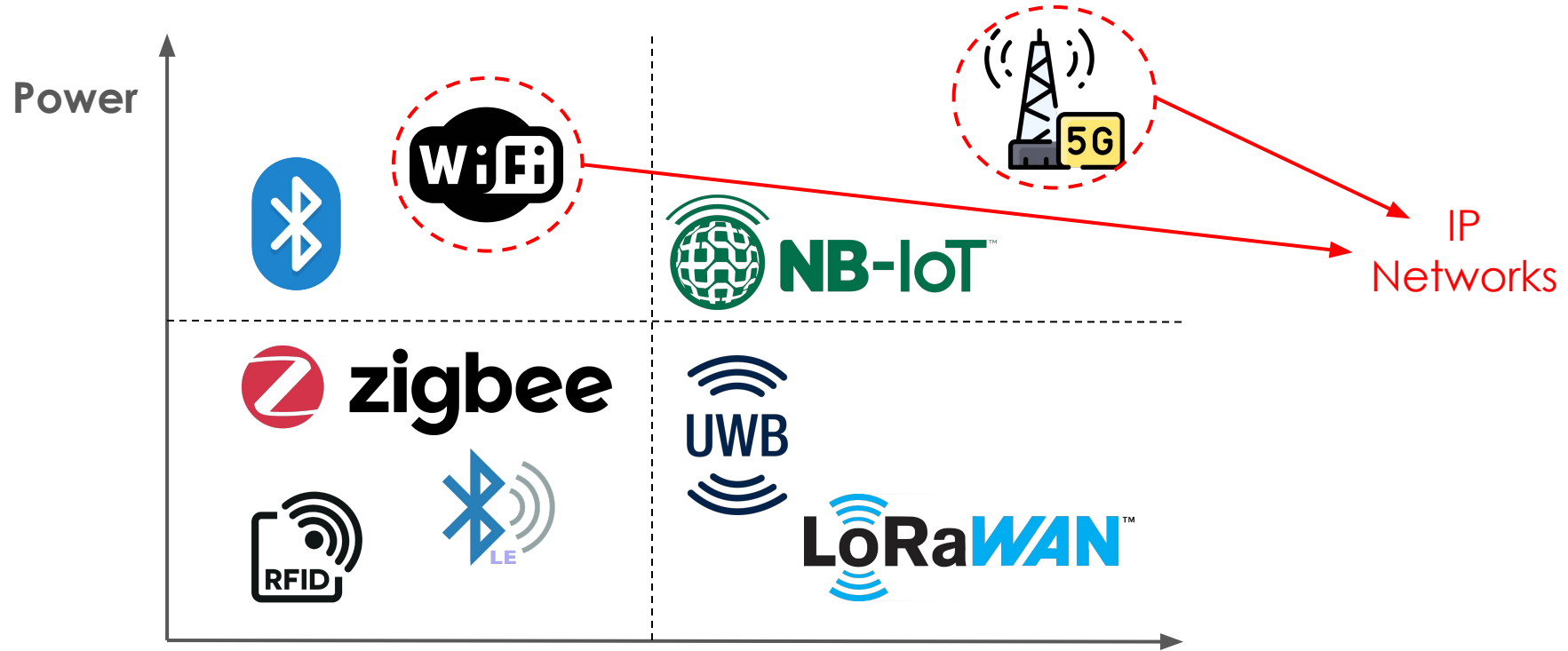


Power
Consumption



Range &
Bandwidth

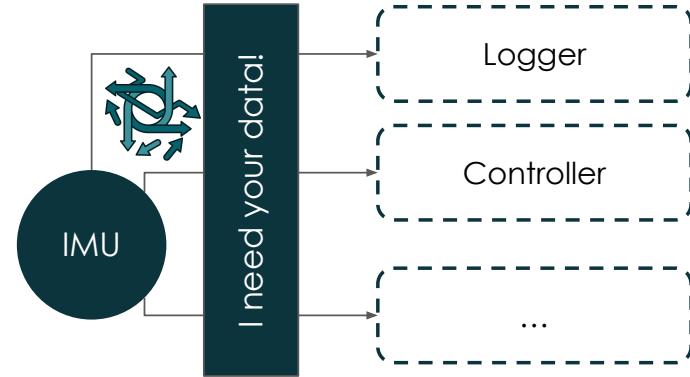
A Spectrum of Choices



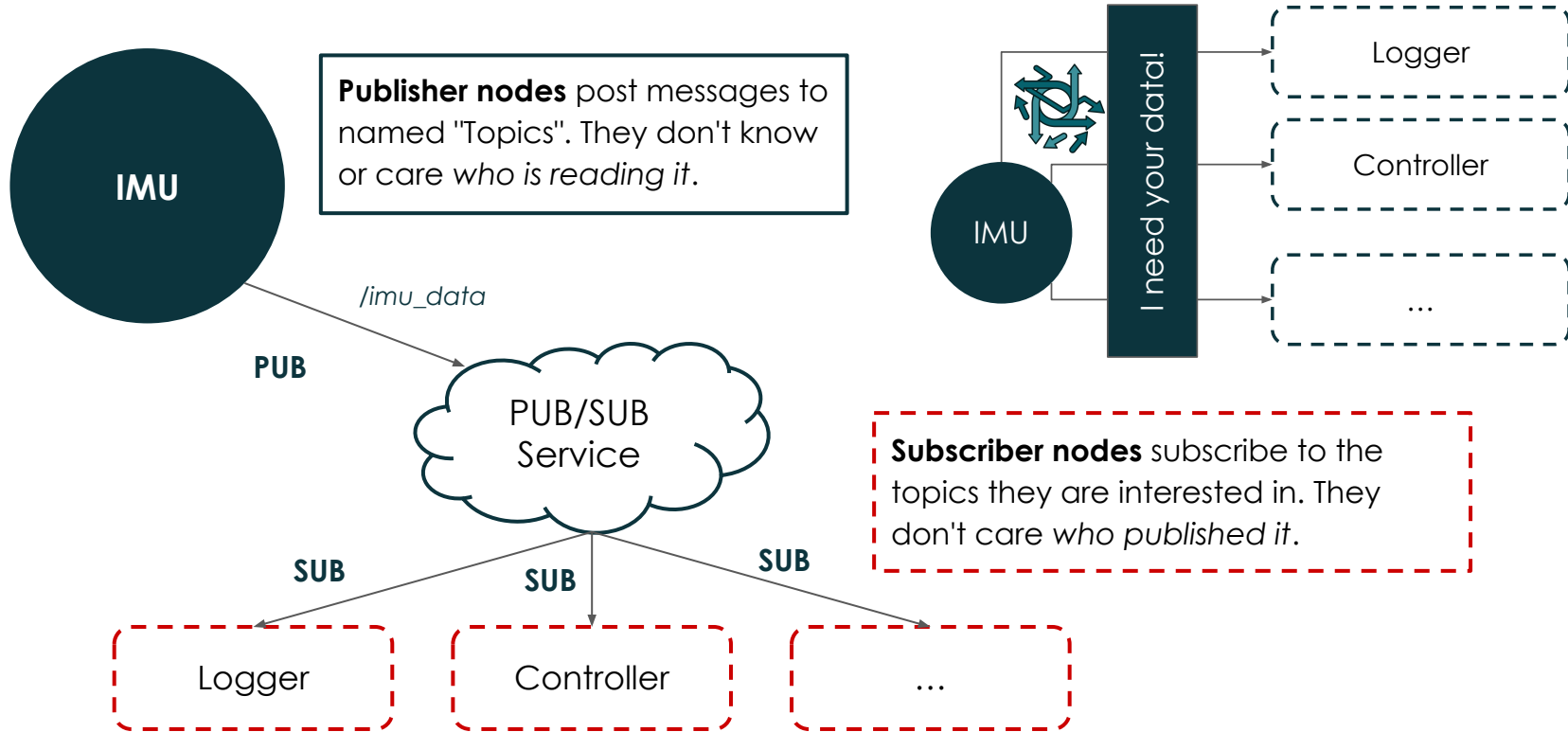
IP
Networks

Range

IP Networks - The Pub/Sub Pattern



IP Networks - The Pub/Sub Pattern



IP Networks - Middleware & Brokers

The ROS logo consists of a 3x3 grid of blue dots to the left of the letters "ROS" in a bold, blue, sans-serif font.

ROS (Robot Operating System): Widely used in academic robotics. A popular middleware implementation of the Pub/Sub pattern, with lots of tools for robotics.

The MQTT logo features a purple icon of three curved lines representing signal waves above the letters "MQTT" in a bold, purple, sans-serif font.

MQTT: Lightweight, publish–subscribe network protocol for message queuing service. It is designed for connections with devices with resource constraints or **limited network bandwidth**, such as in the Internet of things (IoT).

Among Others:



The Spectrum of "Brains"

Cloud Services

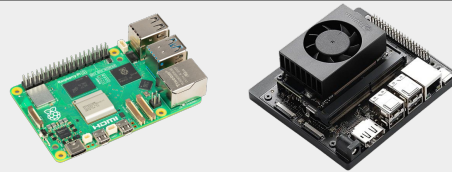
Extending the capabilities



- Massive computational power.
- Great for: analyzing historical data, training AI models, and managing a fleet of devices.

Single-Board Computers (SBCs)

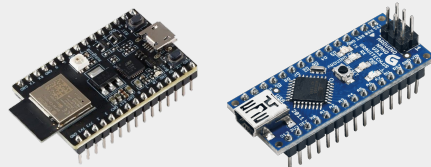
Handling the thinking



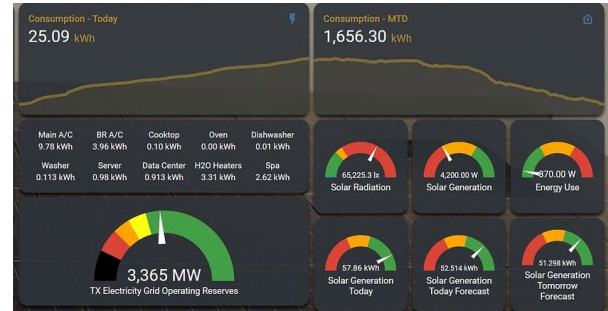
- High-level logic
- Runs a full OS (Linux).
- Great for: sensor fusion, running AI models, logging data, providing a user interface, and complex decision-making.

Microcontrollers (MCUs)

Handling the reflexes



- Hard real-time tasks
- Deterministic and Reliable
- Great for: Reading sensors at a fixed high rate, running fast control loops (e.g., a PID loop for a motor), generating PWM signals



Robustness in Software



A system must do many things at once. How you structure this is a key design choice for reliability.

Multithreading



“They can work fast but might bump into each other or grab the same knife”

Multiprocessing



“Safer and more organized, but they need to use a service window to pass ingredients”

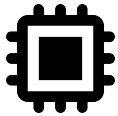
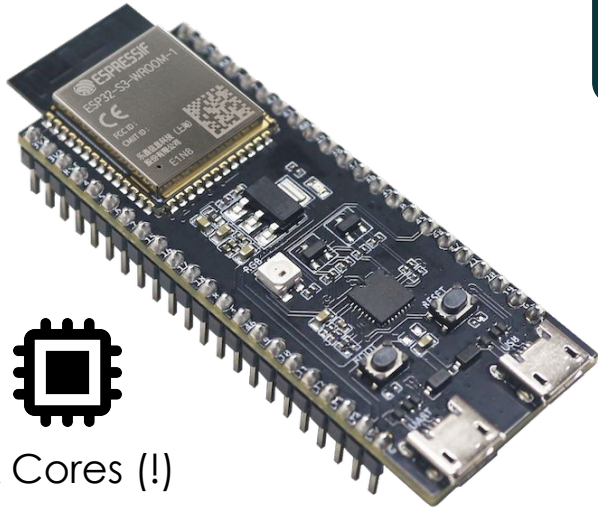
Tools = Memory

Robustness in Software

	Pros	Cons
Multithreading	Very fast communication between threads.	Dangerous due to Race Conditions that can lead to data corruption. Mutexes (locks) are a sufficient solution.
Multiprocessing	Safer and more robust, as memory is isolated . If one process crashes, it doesn't bring down the whole system.	Communication between processes is slower (Inter-Process Communication or IPC)



Demo (online): Try these concepts!



2x Cores (!)

Kinda Multithreading
(FreeRTOS tasks pinned in **same** core)

Kinda Multiprocessing
(FreeRTOS tasks pinned in **both** cores)

**MQTT Broker connection
and Pub/Sub**



WiFi
Connected

Thank you!
Questions?