

# Predictive Sensing and Adaptive Management For Real-Time Applications

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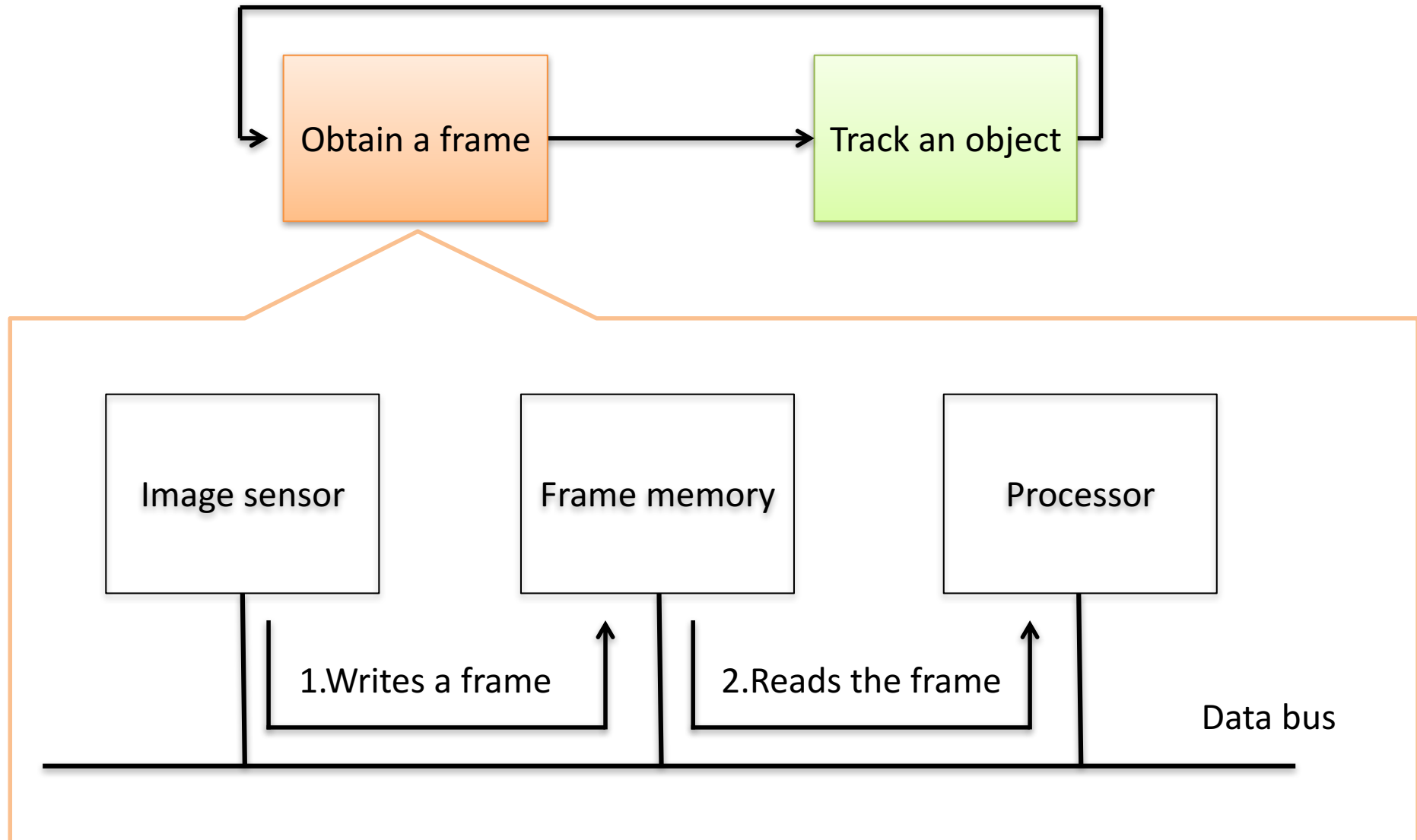
# Outline of this talk

Let's predict future and  
improve system management efficiency!

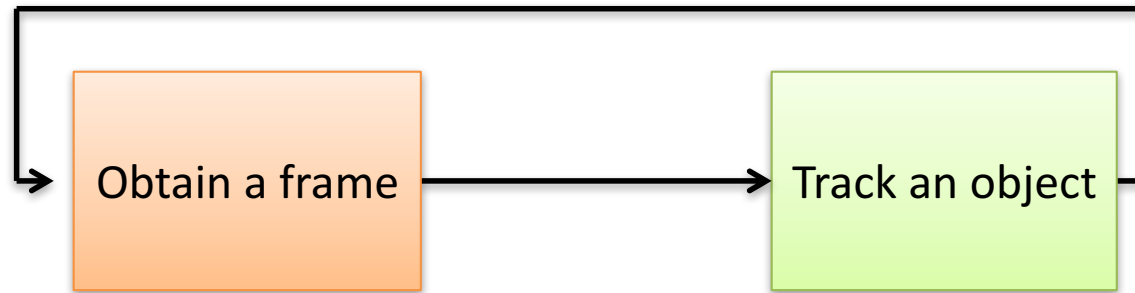
1: Improve energy efficiency of on-line object tracking

2: Accelerate performance of control systems

# Procedure of on-line object tracking



# Procedure of on-line object tracking



## 1. Decide a search-area

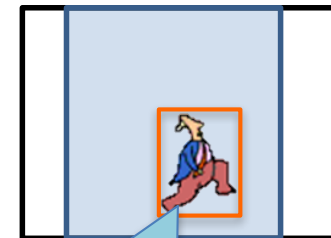
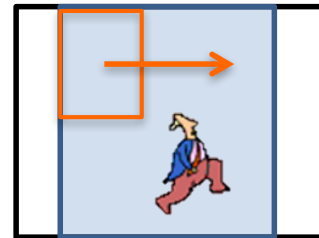


Low speed



High speed

## 2. Search the object with template matching



Find the object

Template image

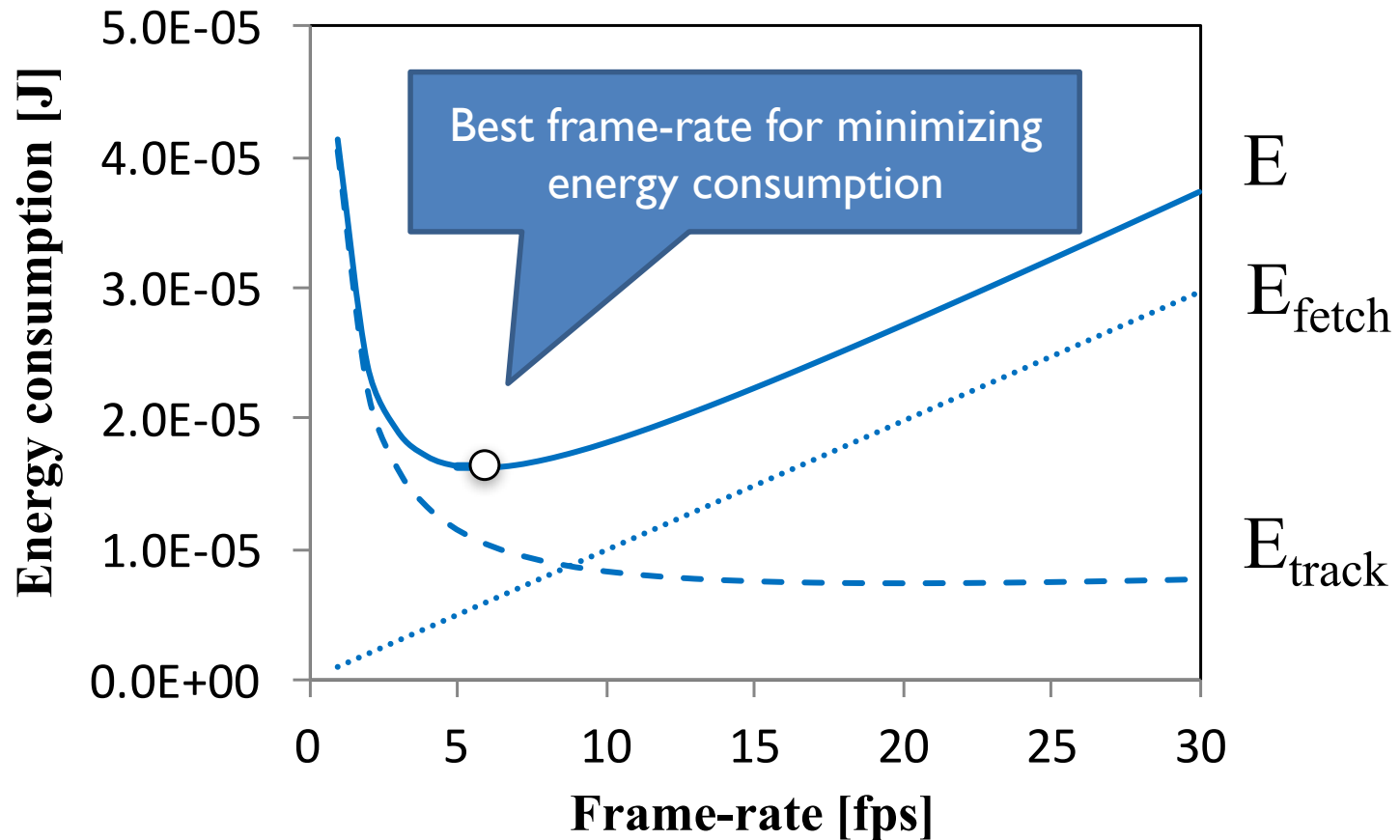


# Motivation (1/2)

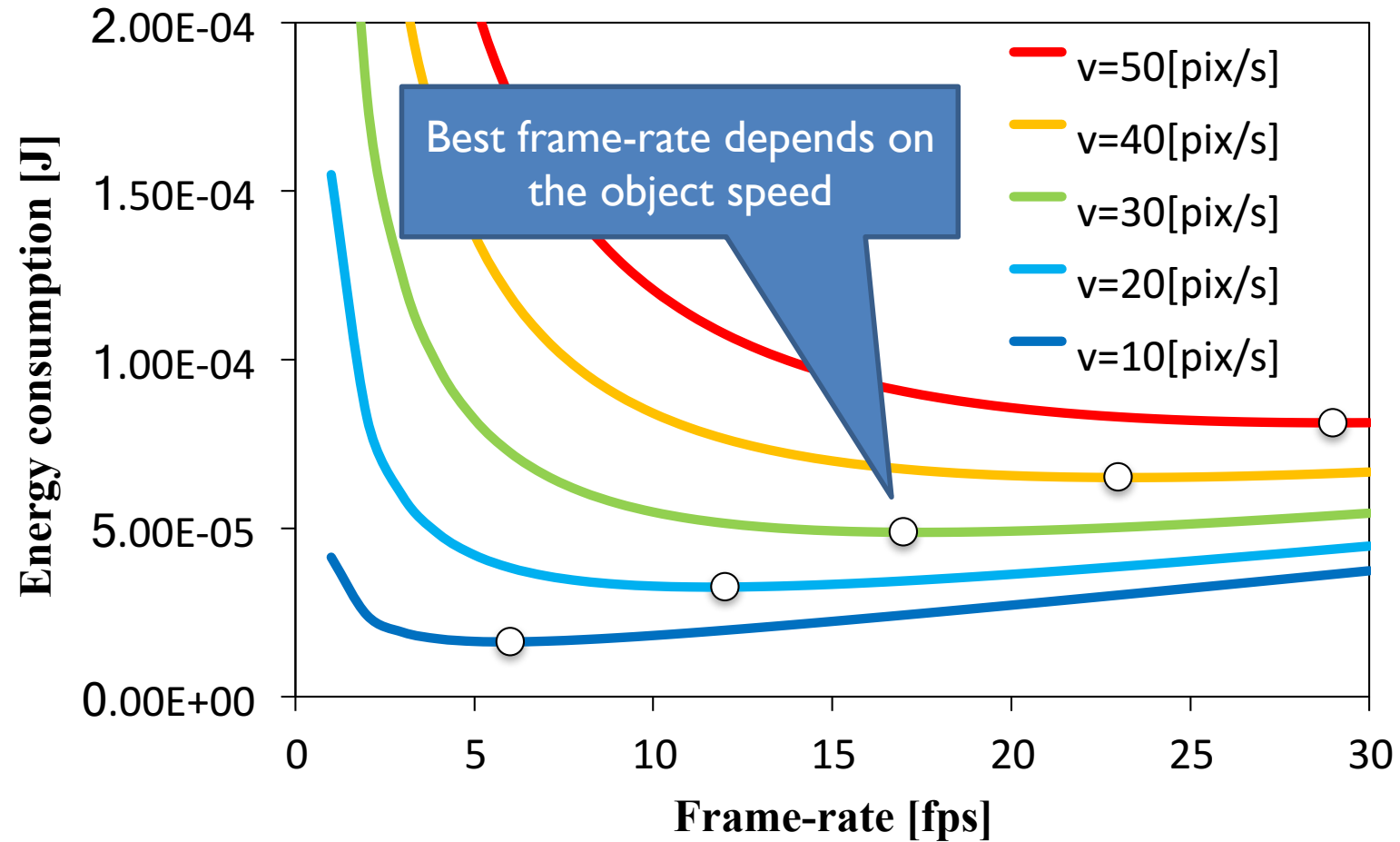
$E_{\text{fetch}}$  : Energy required for obtaining frames

$E_{\text{track}}$  : Energy required for object tracking

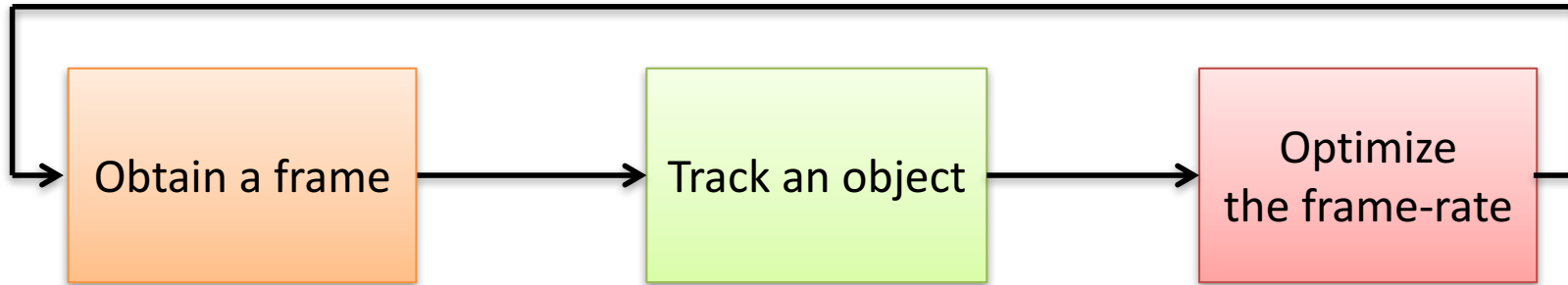
$E$  : Total Energy ( $E_{\text{fetch}} + E_{\text{track}}$ )



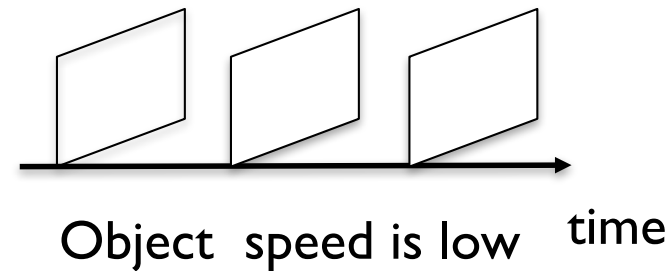
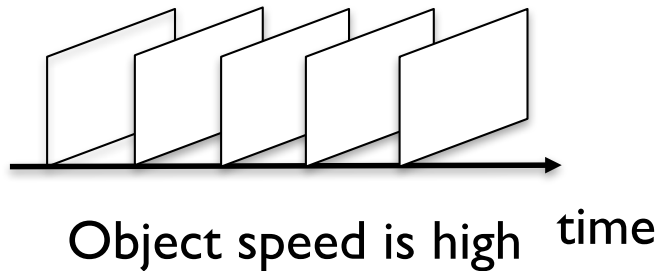
# Motivation (2/2)



# Adaptive frame-rate optimization

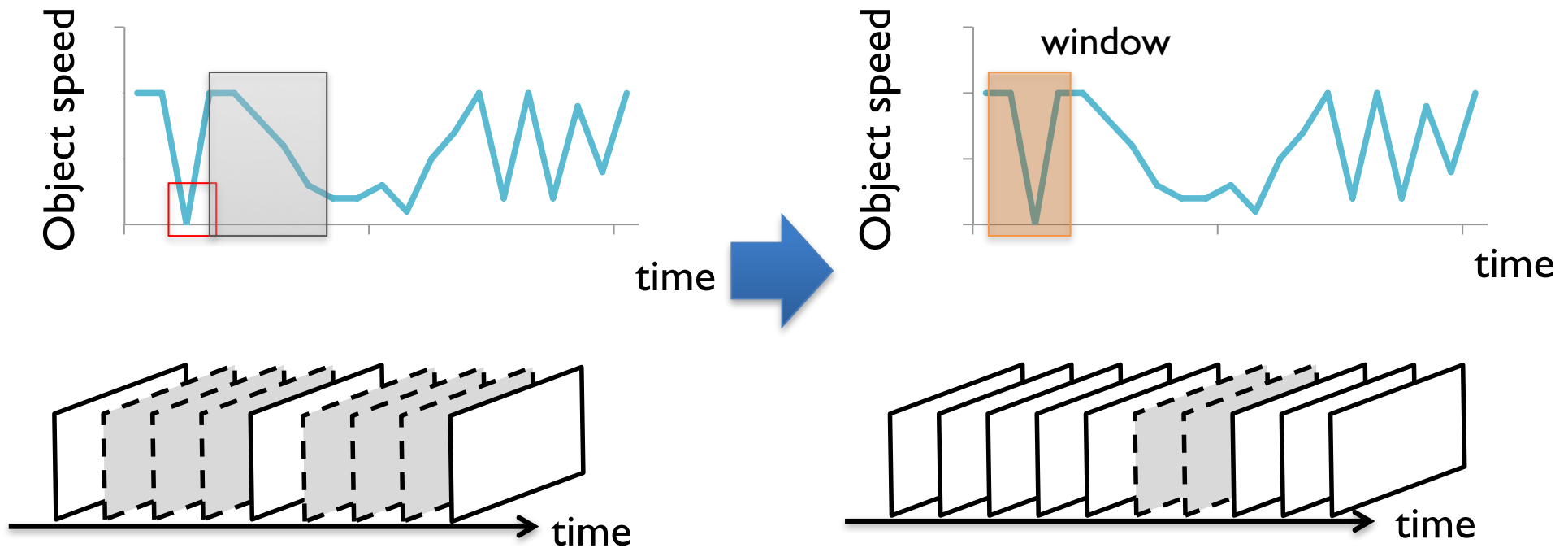


Decides frame-rate based on the object speed



# Accuracy oriented optimization

Proposed method with optimized frame-rate



Immediate frame-rate reduction worsens tracking accuracy.

Maintain the frame-rate IF the object speed variation in the window exceeds a threshold.



# Experiments (1/2)

- **Methodology**

- Simulator implemented by using the OpenCV library

- **Benchmark**

- Videos : Seven input videos from Tracker Benchmark[1]
- Features : Illumination variation, scale variation, etc.
- Target frames : ~ 600 frames

- **Evaluation models**

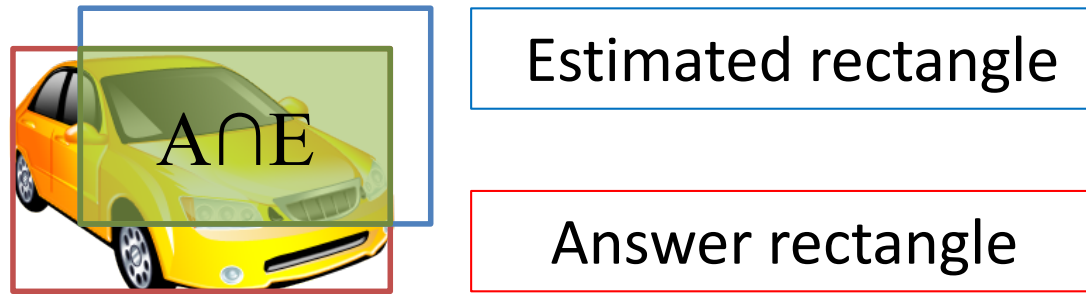
- FIX : Tracking with fixed frame-rate (30 fps)
- ADAPT : Adaptive frame-rate optimization

# Experiments (2/2)

- **Metrics**

- Tracking accuracy

Overlap ratio between two rectangles



$$\text{Accuracy} = \frac{\text{area}(A) \cap \text{area}(E)}{\text{area}(A) \cup \text{area}(E)} \times 100 [\%]$$

- Energy consumption

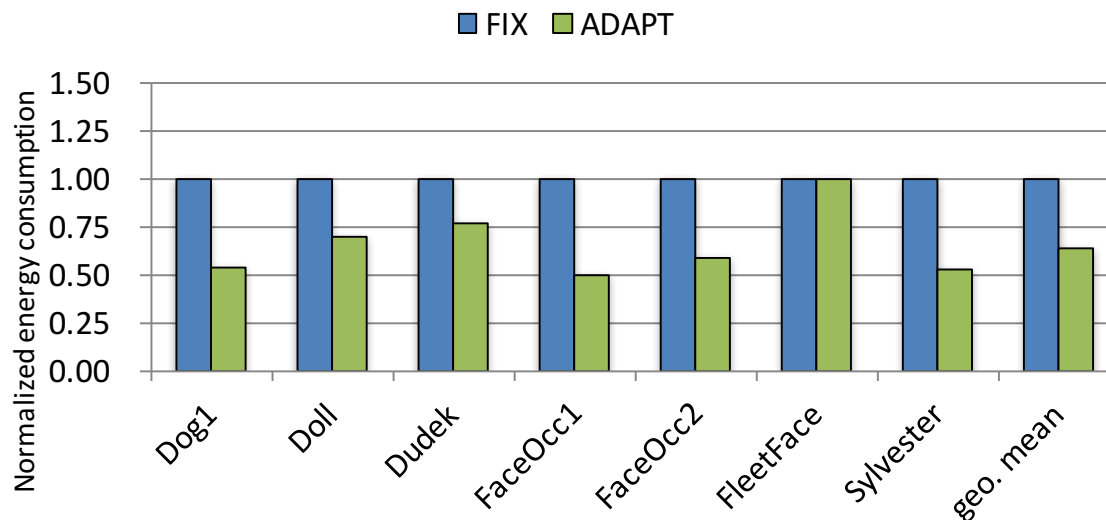
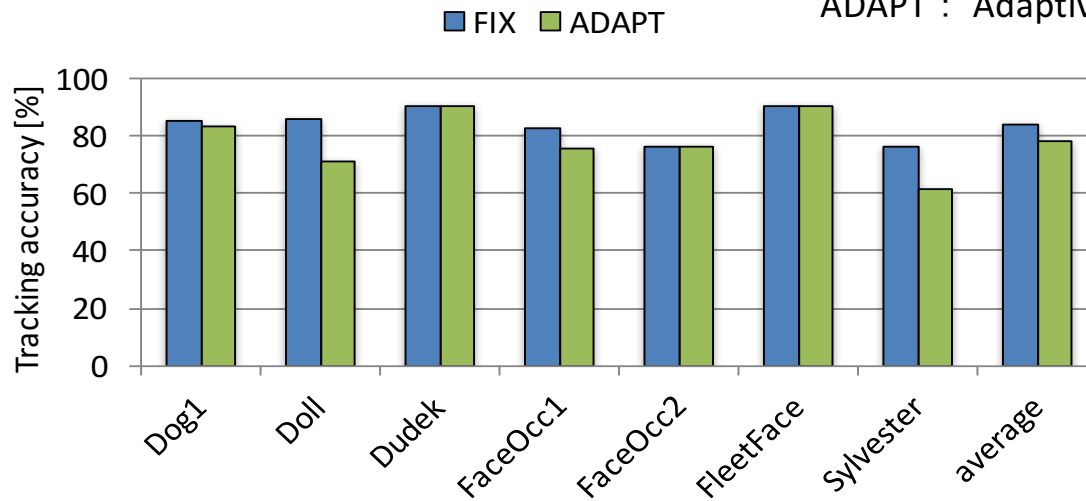
Energy model for object tracking system

$$E = E_{\text{fetch}} + E_{\text{track}}$$

# Tracking accuracy

FIX : Tracking with fixed frame-rate (30 fps)

ADAPT : Adaptive frame-rate optimization



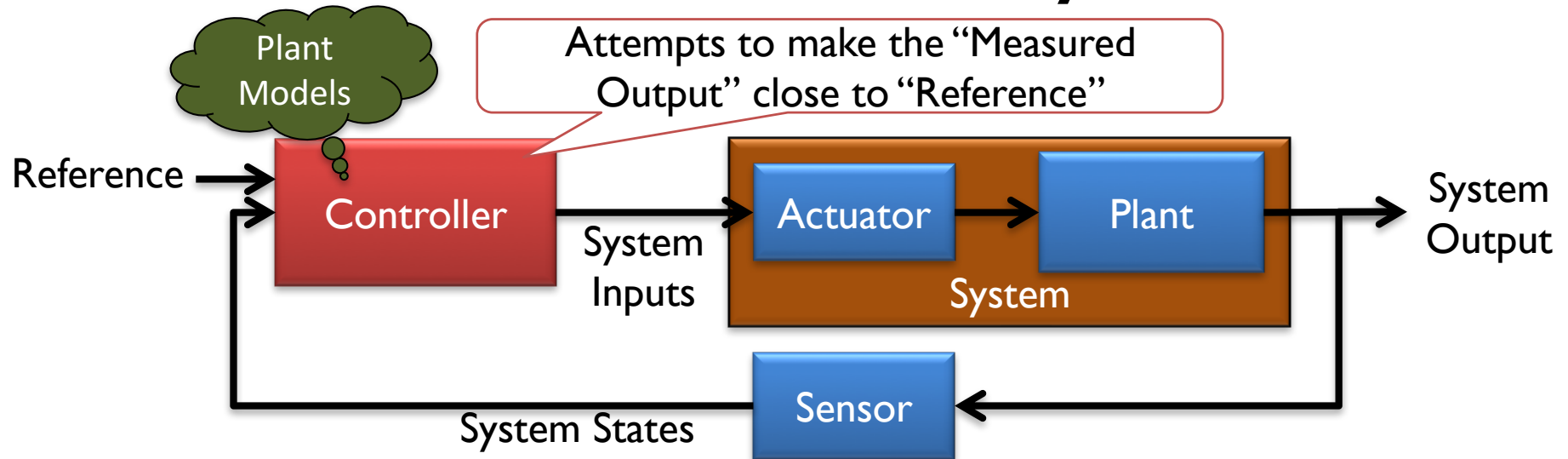
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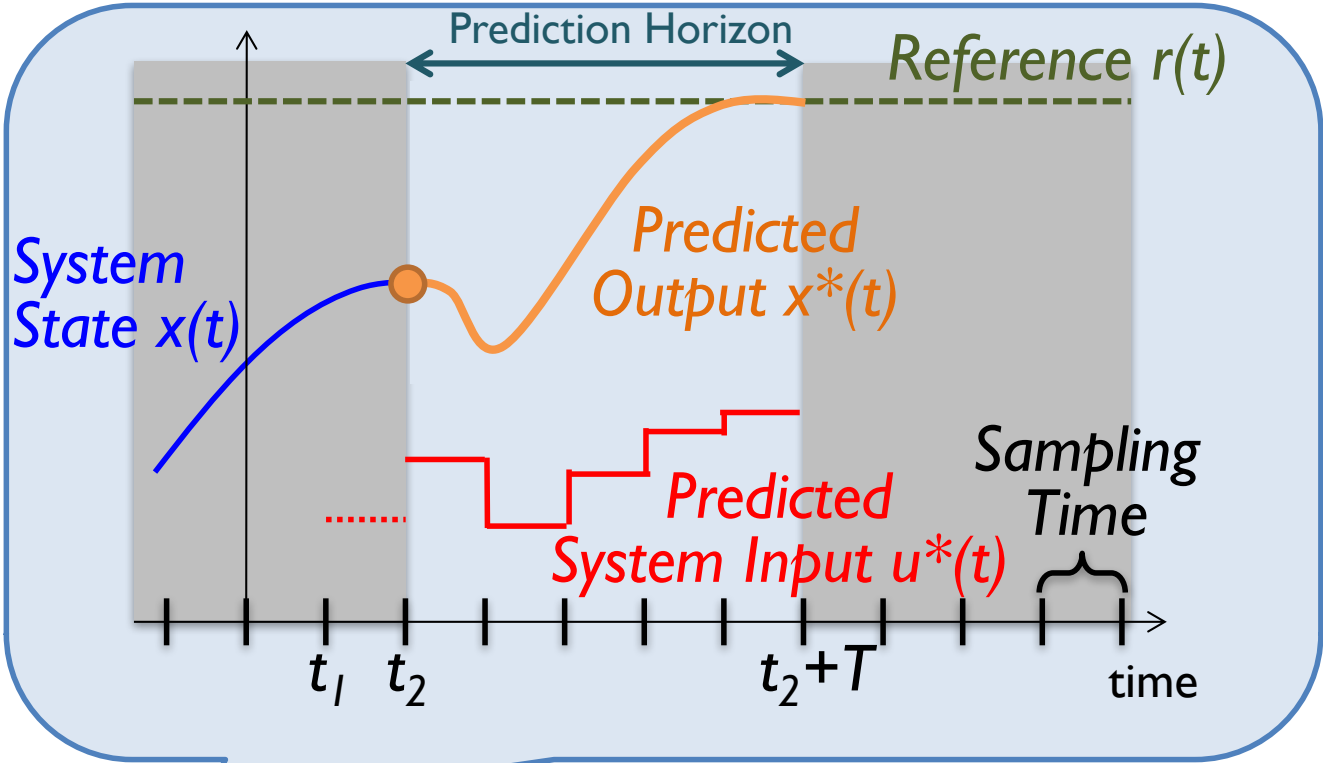
# Feedback Control Systems



## Real-Time Model Predictive Control (MPC)

- Features
  - Involves state equations (or **plant models**) in the controller
  - Decide how to manipulate the actuator based on predicted future plant behavior by solving **optimal control problems**
  - Needs to satisfy real-time periodical operations
- Problem
  - $O(N^3)$  computational complexity

# Overview of Model Predictive Control

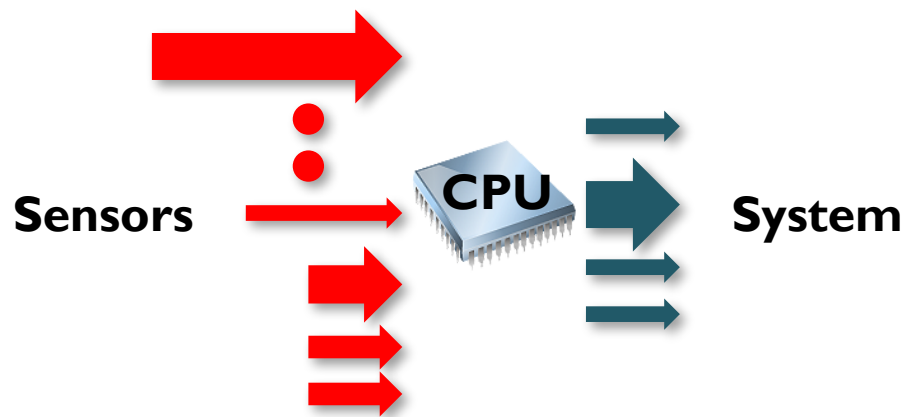


# Can Manycore be a Solution?

Data-Level Parallelism

→ NO!

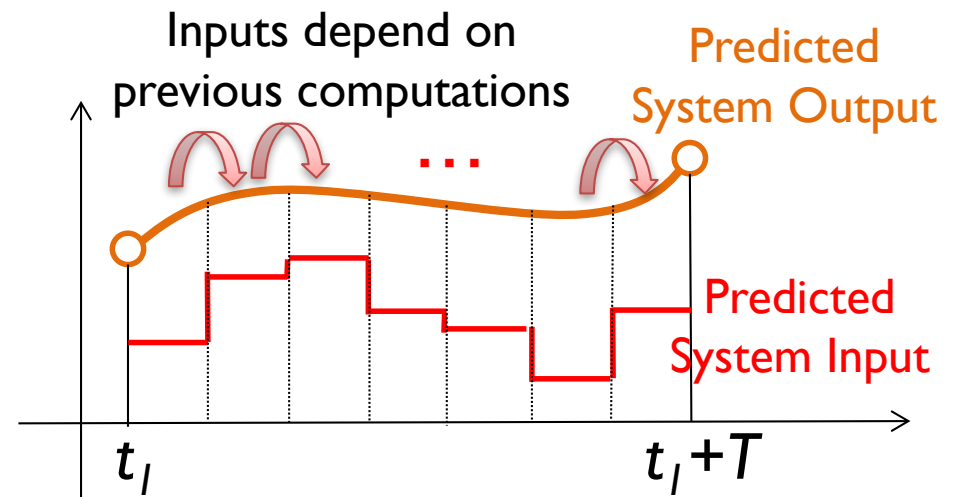
Small size data are fed sequentially!



Thread-Level Parallelism

→ NO!

Each step is executed sequentially!

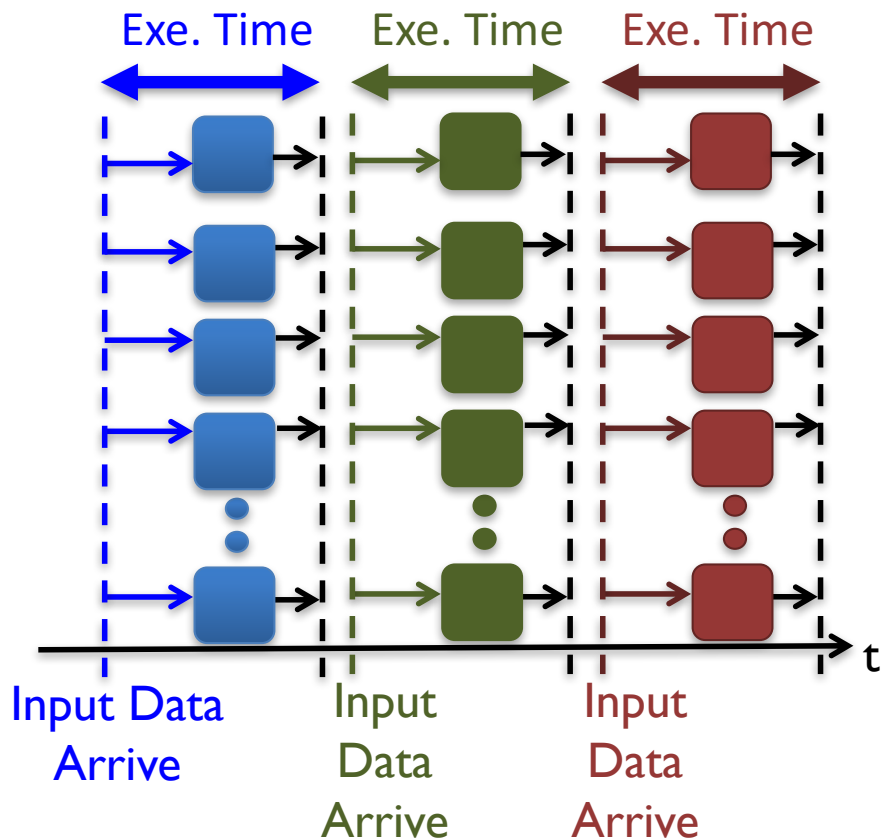


# Our Approach

~ Speculative Execution on Manycore ~

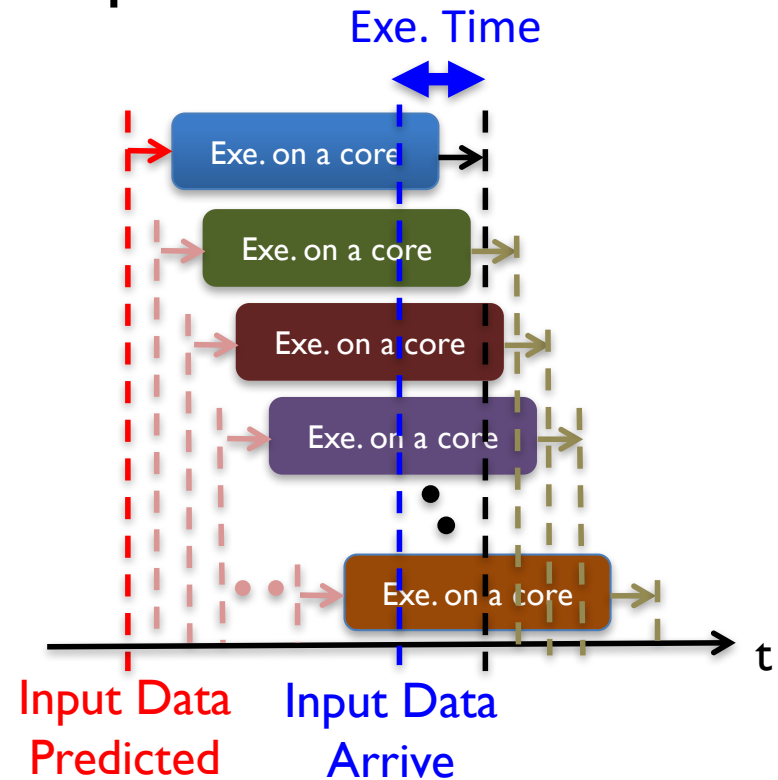
[Conventional]

Spatial Parallel Exe.



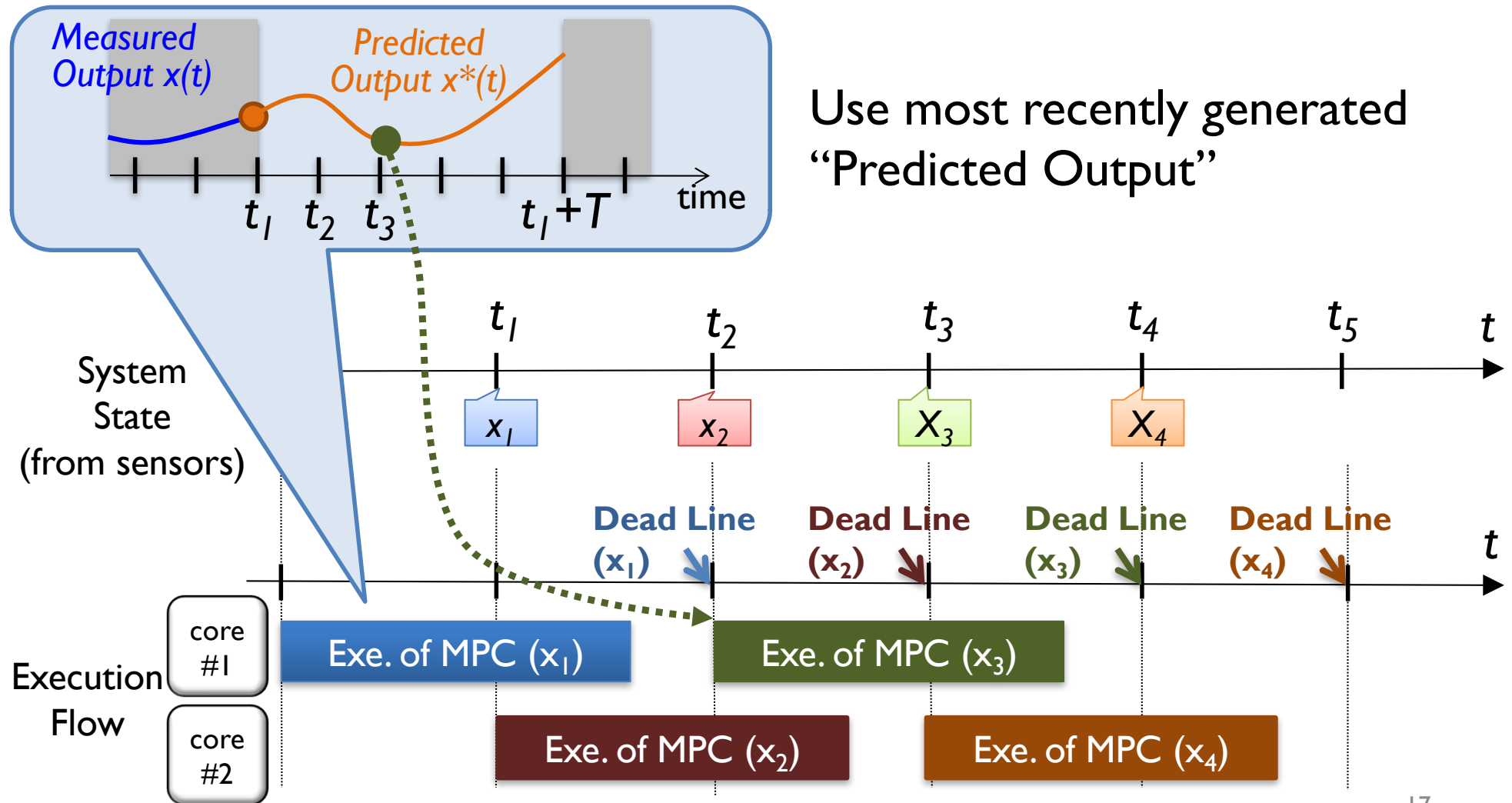
[Proposed]

Temporal Parallel Exe.  
w/ Input Value Prediction





# How Can We Predict Input Data for Speculative Executions?

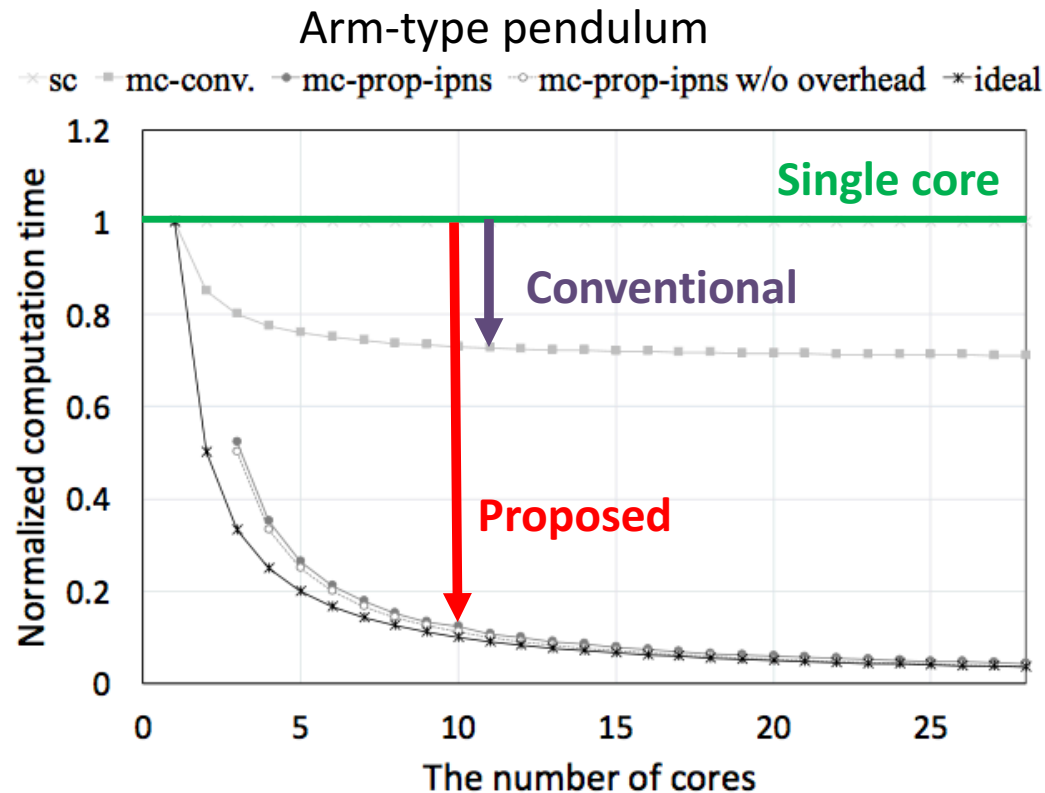


Use most recently generated "Predicted Output"



# Implementation Results

- Does not have any redundant cores.
- Implement a dedicated thread for prediction purpose.



# Conclusions

- You can predict physical world!
- Predict sensor inputs, and then:
  - Improve energy efficiency,
  - Boost system performance,
  - and so on.
- X-layer optimization (sensing and controlling) is a key challenge!