

APM Python / MATLAB Tutorial



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- Overview of Advanced Process Monitoring (APM)
- Recent Applications of APM
 - Solid Oxide Fuel Cells
 - Boundary Management of a Thermal Oxidizer
 - Virus and Biological Modeling
 - Unmanned Aerial Vehicles
- Tutorial Examples
 - Parameter estimation with PRBS data
 - Nonlinear control
 - Optimization
 - Parallel processing
- Getting Started with APM

Overview of APMonitor



APMonitor Modeling Language

The APMonitor Modeling Language is optimization software for differential and algebraic equations. It is coupled with large-scale nonlinear programming solvers for data reconciliation, real-time optimization, dynamic simulation, and nonlinear predictive control. It is available as a free web service or for commercial licensing.



Try Example Optimization Problems - Demo

Browse or modify example problems to start solving nonlinear programming problems with up to 10 million variables through a web-interface.



Documentation

APMonitor Documentation Wiki gives details of the modeling language and example applications. [Compare](#) to other popular modeling languages.



Discussion Forum and Webinars

Users share experiences and collaborate through an online discussion forum and regularly scheduled webinars.



Premium Account Login

Registered users manage applications, view optimization results, and collaborate with other users.



APM Python Interface

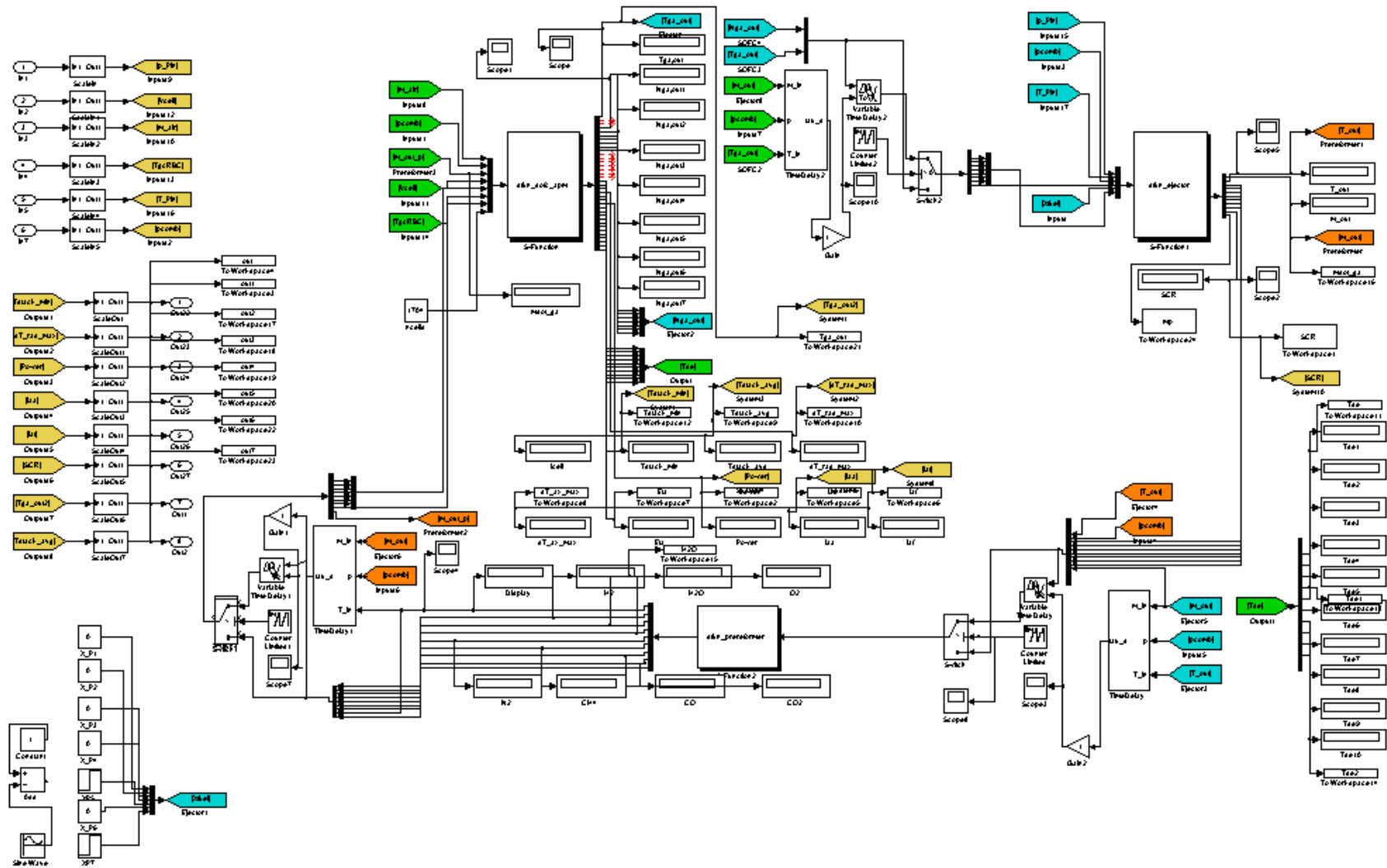
Python gives users an open-source option for solving nonlinear programming problems with a growing community of users.



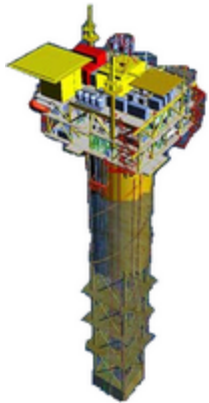
APM MATLAB Interface - Demo

MATLAB provides a powerful mathematical scripting language to improve the capability of optimization solutions.

Comprehensive Model Capability (SOFC)



Remote Viewing and Control



Pressure Overview

[All Pressures \(psig\) last 24 hrs](#)
[All Pressures \(psig\) last month](#)

FLMT #2 (18 miles)

T °F

[Temperature \(°F\) last 24 hrs](#)
[Temperature \(°F\) last month](#)

P psig

[Pressure \(psig\) last 24 hrs](#)
[Pressure \(psig\) last month](#)

Temperature Overview

[All Temperatures \(°F\) last 24 hrs](#)
[All Temperatures \(°F\) last month](#)

FLMT #1 (36 miles)

T °F

[Temperature \(°F\) last 24 hrs](#)
[Temperature \(°F\) last month](#)

P psig

[Pressure \(psig\) last 24 hrs](#)
[Pressure \(psig\) last month](#)

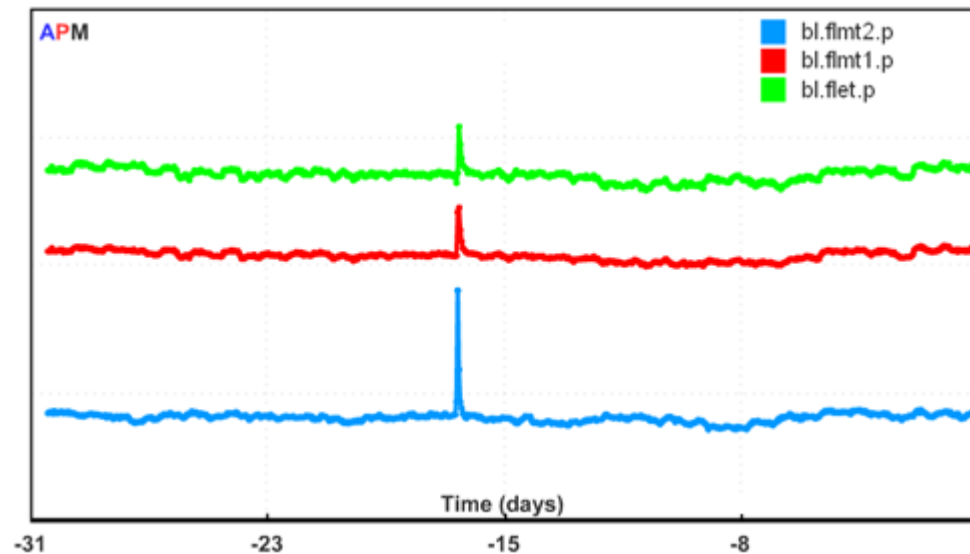
FLET (57 miles)

T °F

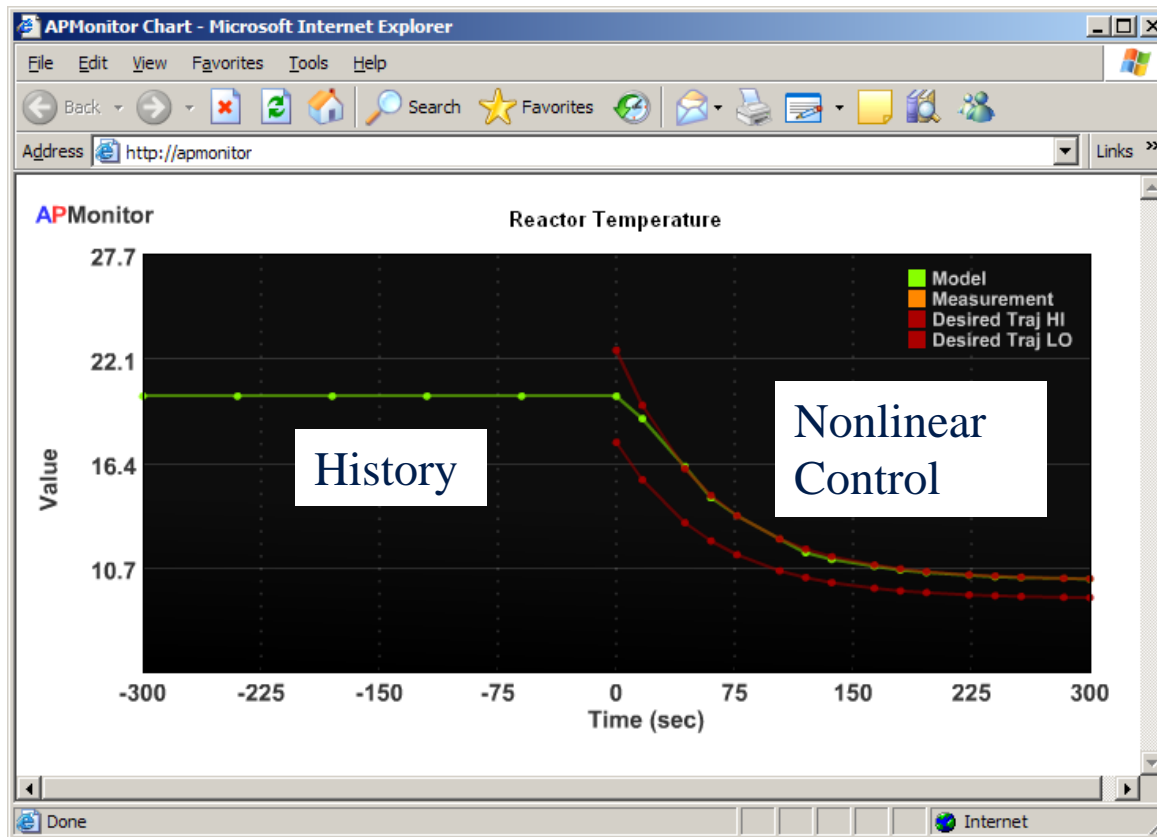
[Temperature \(°F\) last 24 hrs](#)
[Temperature \(°F\) last month](#)

P psig

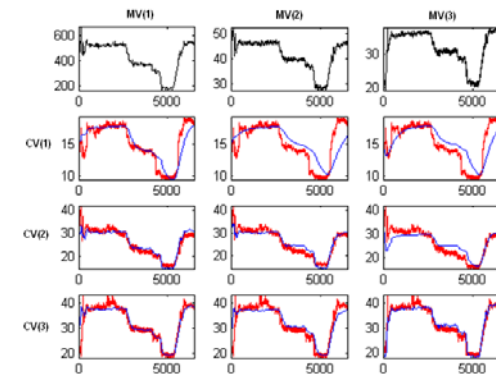
[Pressure \(psig\) last 24 hrs](#)
[Pressure \(psig\) last month](#)



Combine Empirical and Fundamental



Empirical Models



First Principles Models

$$0 = f\left(\frac{\partial x}{\partial t}, x, u\right)$$

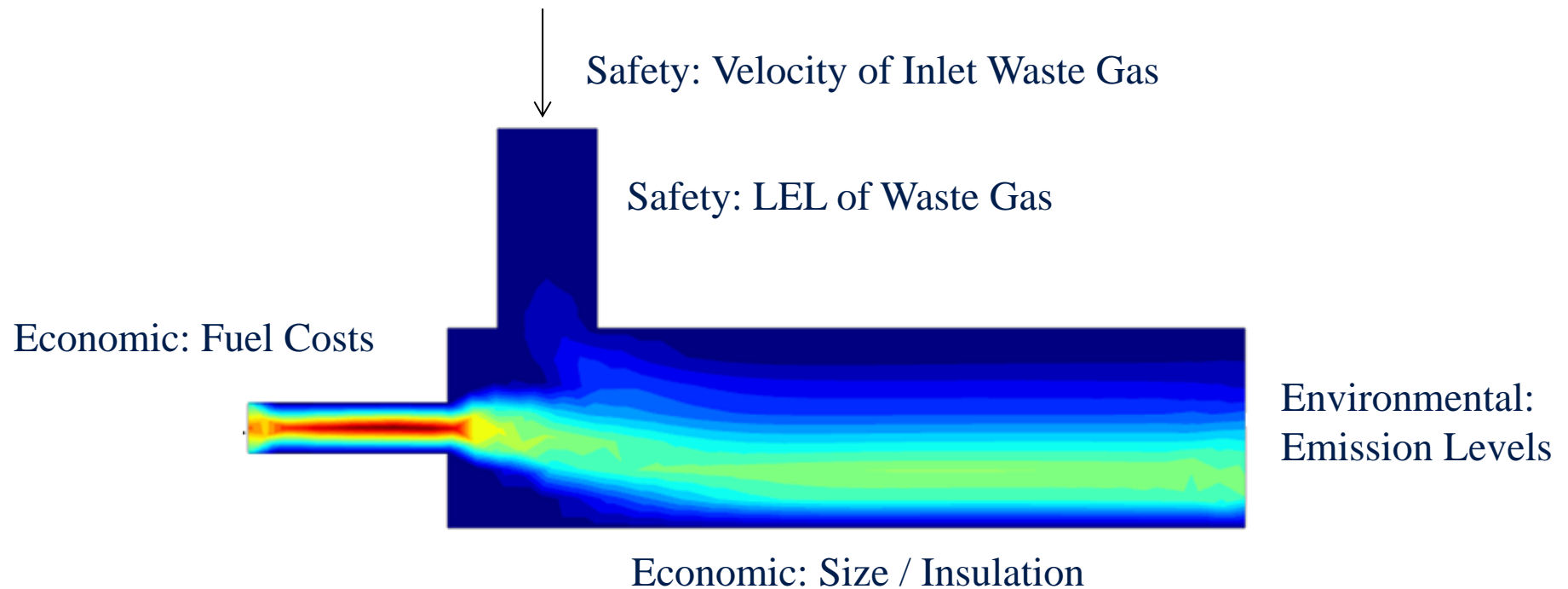
$$0 = g(x, u)$$

$$a \leq h(x, u) \leq b$$

RTO: Dynamic Optimization



- Model predicts boundary values for safe, responsible, and economic operating conditions





Safety Constraints

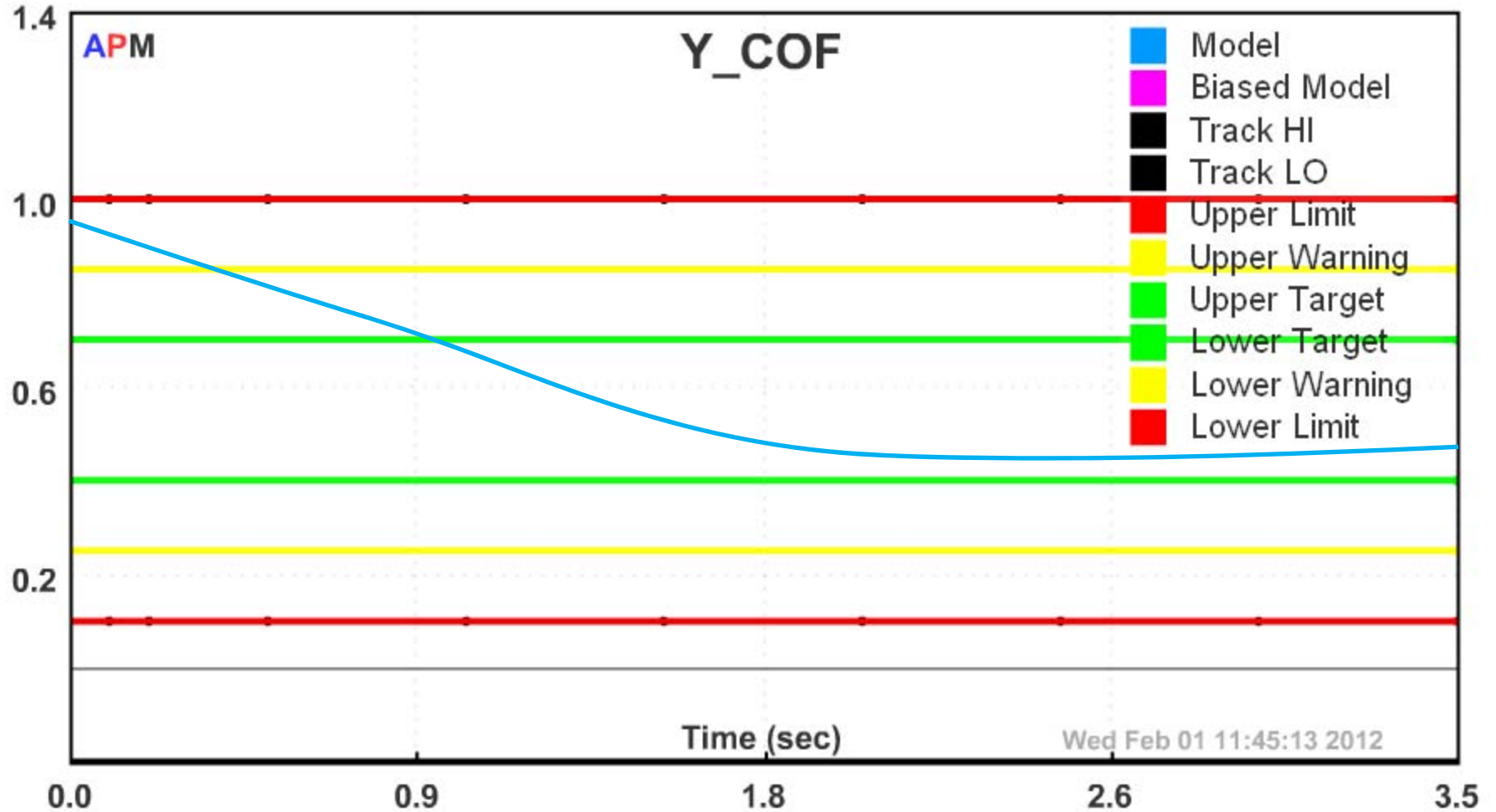
- LEL (lower Explosion Limit)
 - Inlet gas composition $< 25\%$ of LEL
- Minimum oxygen concentration
- Flashback Velocity
 - Inlet gas velocity $>$ minimum safety limit
- Failure to observe safety constraints may lead to deflagration of waste gases back to operating units



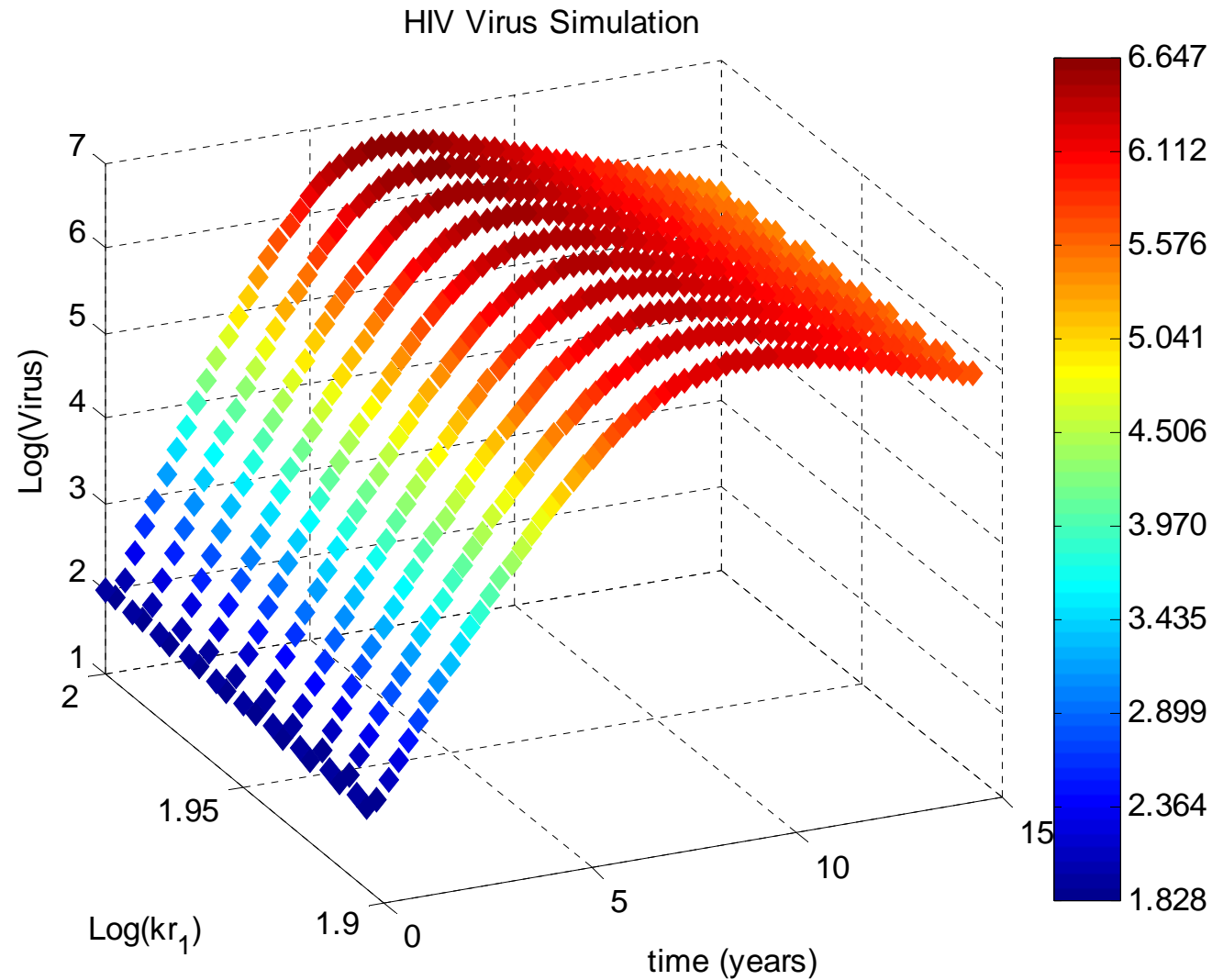
Monitor Critical Parameters



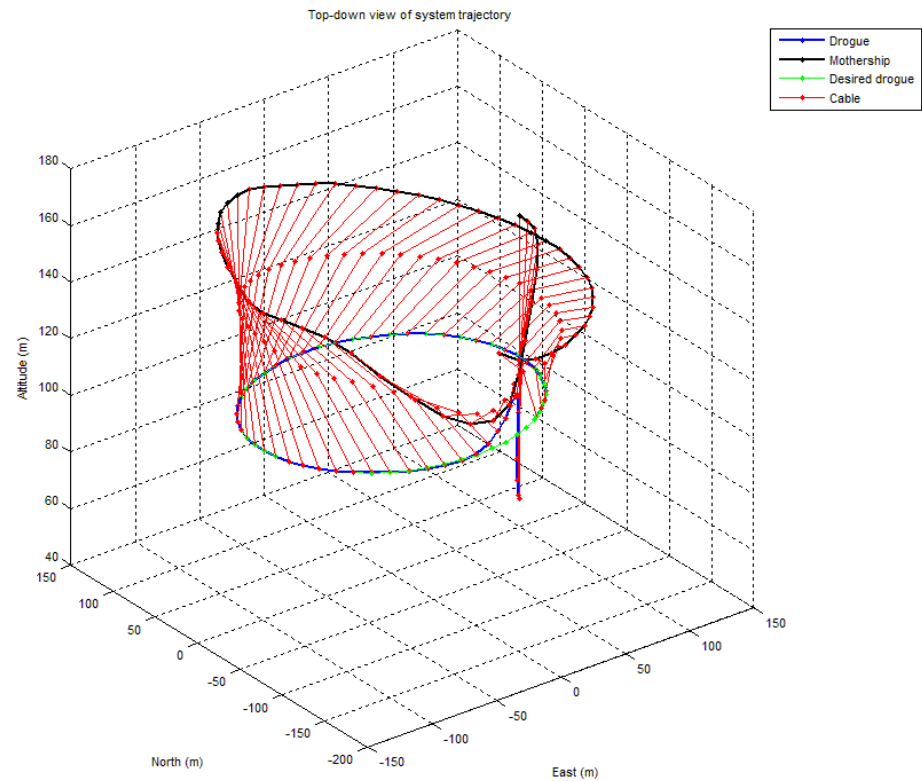
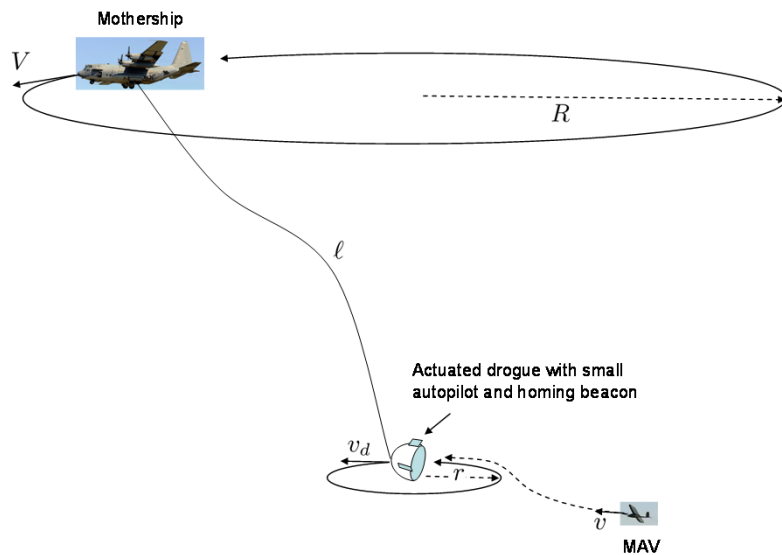
Emissions of CO in Waste Gas



Parallel Processing with APM



Dynamic Optimization of UAV Flight



Tutorial Examples



- Tutorial Examples
 - Parameter estimation with PRBS generated data
 - Nonlinear control
 - Optimization
 - Parallel processing
- Download APM Python/MATLAB from APMonitor.com



APM MATLAB



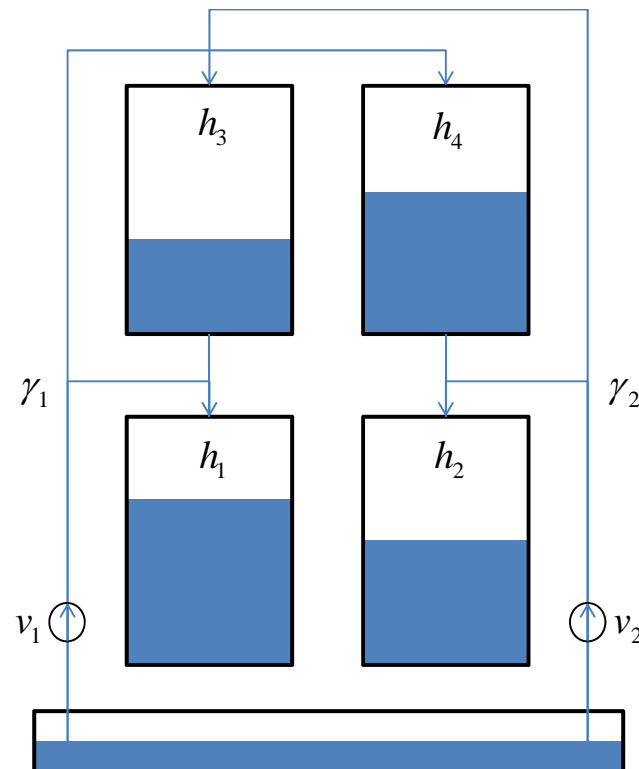
APM Python

Tutorial Examples



➤ Tutorial Examples

- Parameter estimation with PRBS generated data
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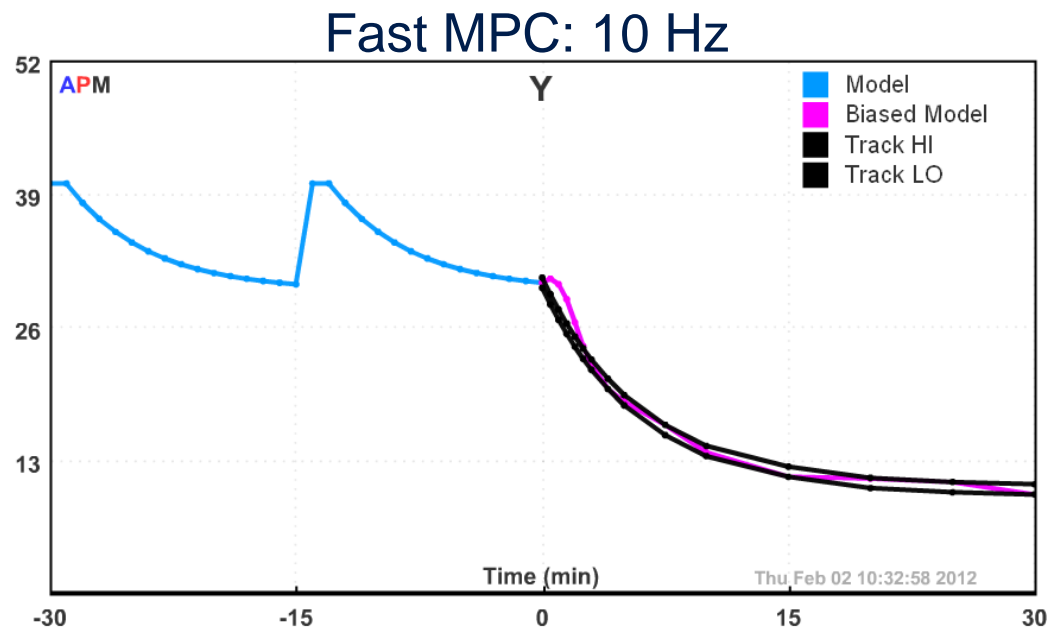


Tutorial Examples



➤ Tutorial Examples

- Parameter estimation with PRBS generated data
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Tutorial Examples

➤ Tutorial Examples

- Parameter estimation with PRBS generated data
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$$\min \quad x_1 x_4 (x_1 + x_2 + x_3) + x_3$$

$$\text{s.t.} \quad x_1 x_2 x_3 x_4 \geq 25$$

$$x_1^2 + x_2^2 + x_3^2 + x_4^2 = 40$$

$$1 \leq x_1, x_2, x_3, x_4 \leq 5$$

$$x_0 = (1, 5, 5, 1)$$

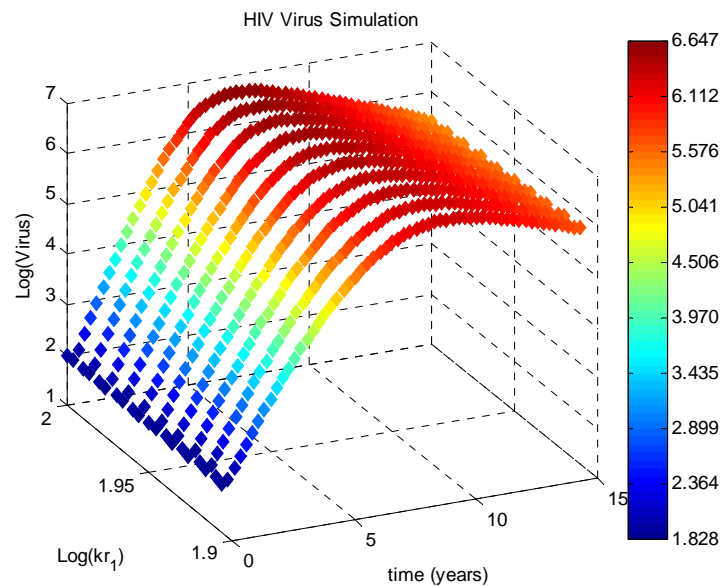
Name	Lower	Value	Upper
ss.x[1]	1.0000E+00	1.0000E+00	5.0000E+00
ss.x[2]	1.0000E+00	4.7430E+00	5.0000E+00
ss.x[3]	1.0000E+00	3.8212E+00	5.0000E+00
ss.x[4]	1.0000E+00	1.3794E+00	5.0000E+00
ss.slk_1	0.0000E+00	1.3237E-08	---

Tutorial Examples



➤ Tutorial Examples

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- Nonlinear control
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Getting Started with APM



- **APM as a Free Web-Service**
 - Academic or Industrial use
- **APM User's Group**
 - E-mail Group: groups.google.com/group/apmonitor
 - Bi-weekly Webinars
 - Support e-mail: support@apmonitor.com
- **Corporate Licensing Options**
 - Linux Cluster Version
 - Windows Server Version

