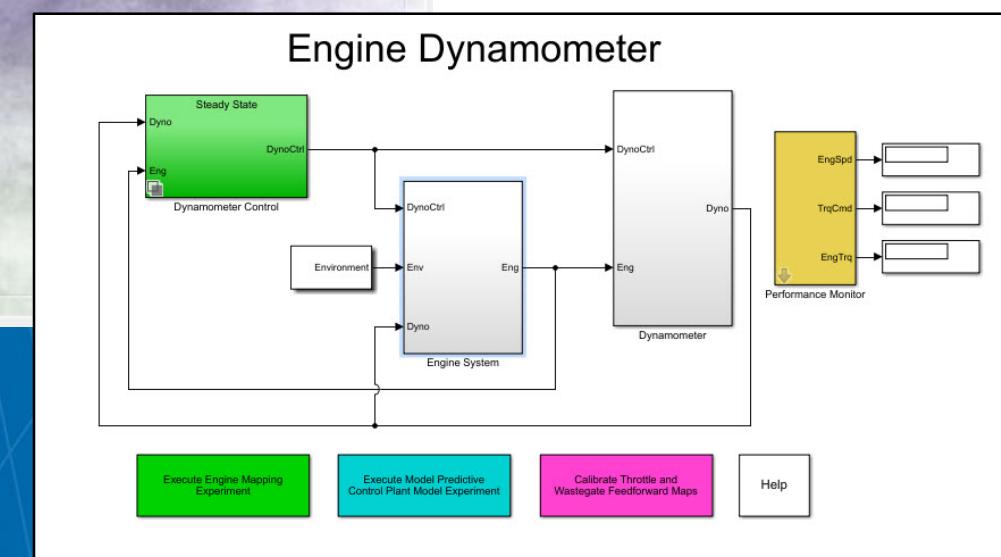
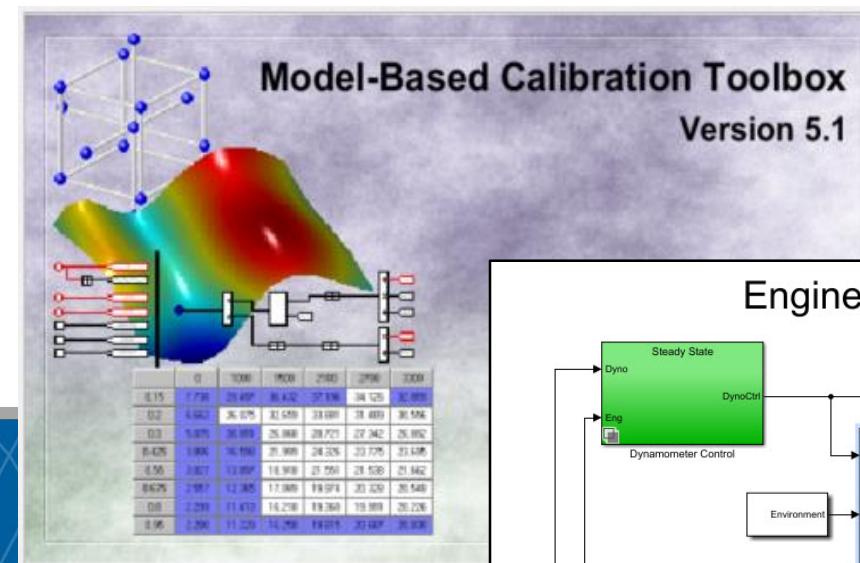


Engine Plant Model Development and Controller Calibration using Powertrain Blockset™

Brad Hieb
Scott Furry

Application Engineering
Consulting Services



Key Take-Away's

- Engine model parameterization is a very non-trivial task
- Engine controller calibration is a very non-trivial task
- **MathWorks has tools to help make these two tasks more manageable**



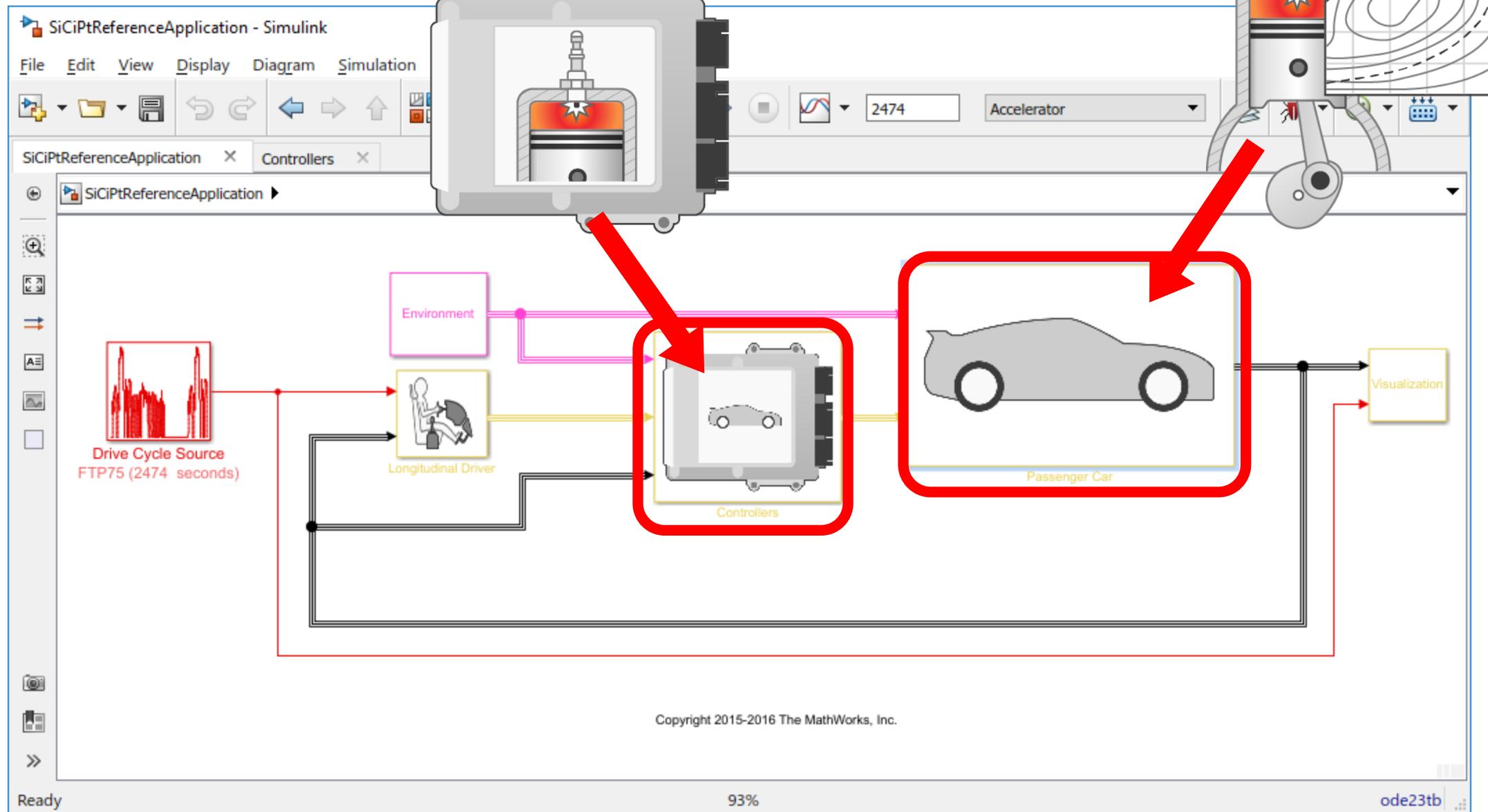
Problem Statement

- How do I use the Powertrain Blockset engine and controller models for my application so I can:
 - Design engine controls?
 - Perform fuel economy and emissions studies?
 - Create and validate dynamometer test plans?

What we'll Cover Today

- Parameterizing a Powertrain Blockset engine model
 - Workflow
 - Example: parameterizing a mapped engine model
- Calibrating a Powertrain Blockset engine controller
 - Workflow
 - Example: calibrating an engine controller

What are we Parameterizing and Calibrating?

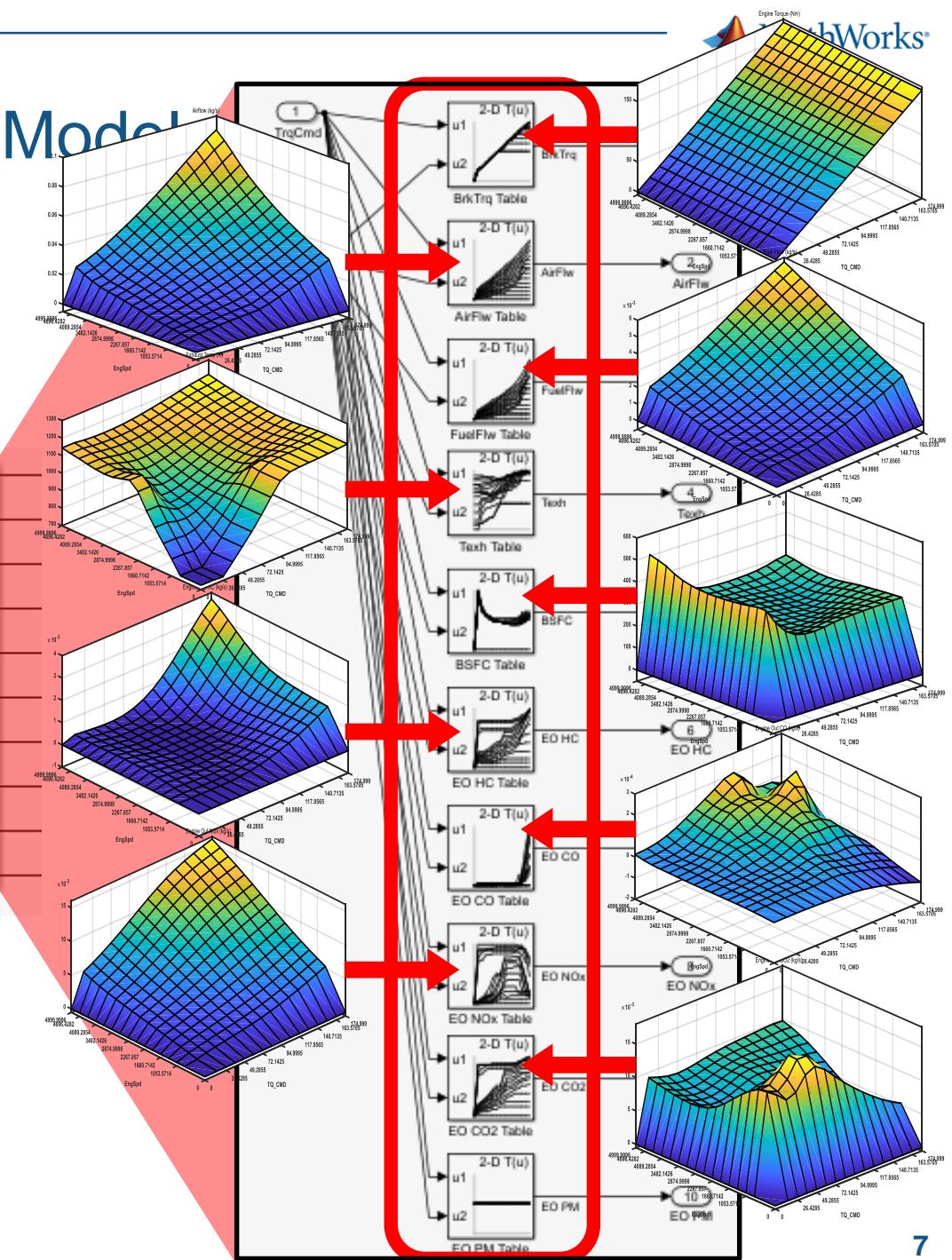
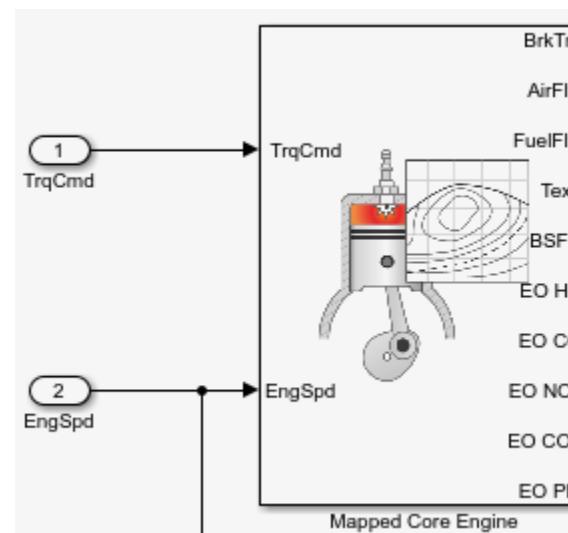


What we'll Cover Today

- **Parameterizing a Powertrain Blockset engine model**
 - Workflow
 - Example: parameterizing a mapped engine model
- Calibrating a Powertrain Blockset engine controller
 - Workflow
 - Example: calibrating an engine controller

Powertrain Blockset Si Mapped Engine Model

- Contains 2D LUT's for each model output
- Easy to parameterize
- Great for system level design and development

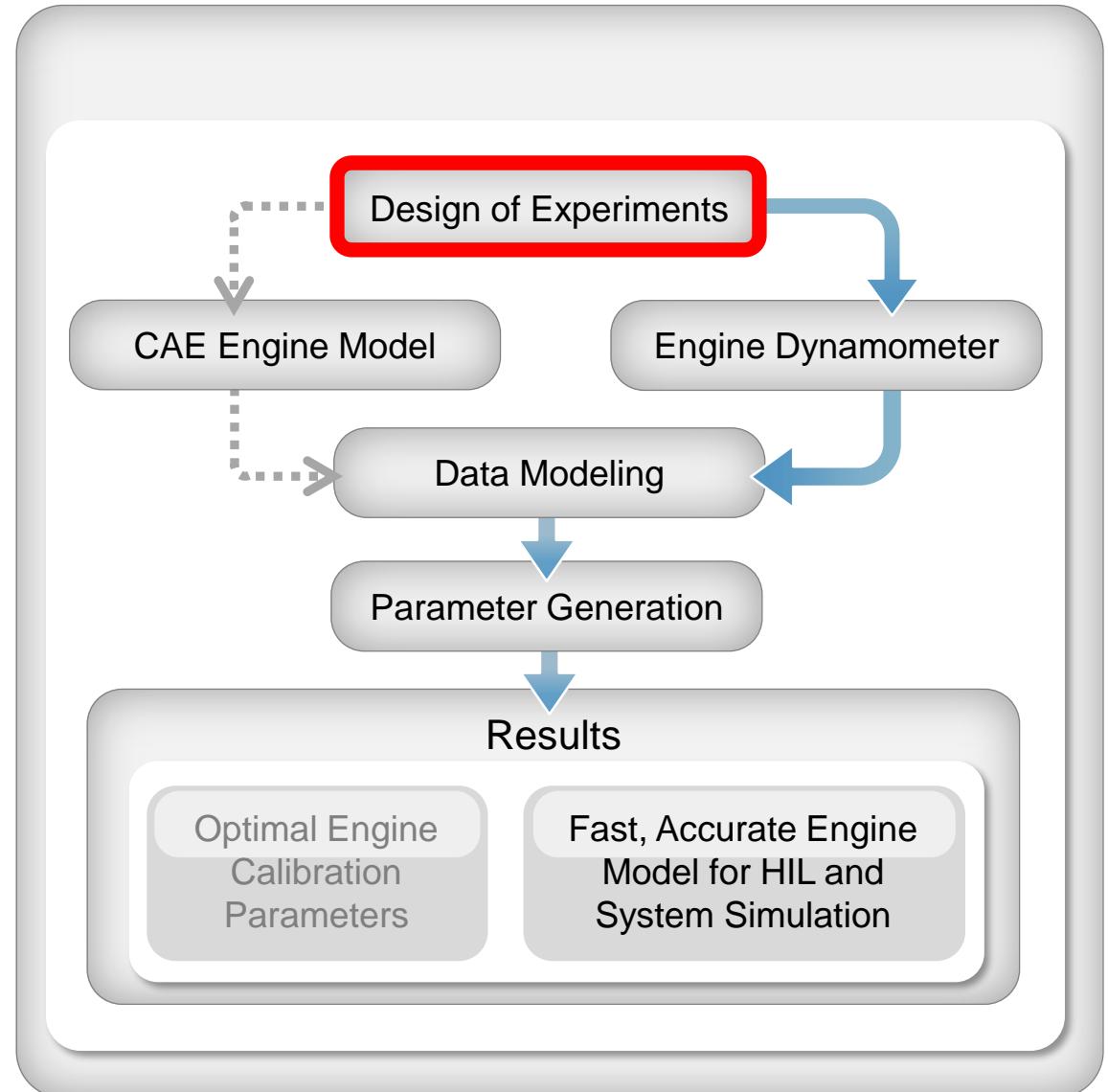


Parameterizing an Engine Model

- Workflow

- Model-Based Calibration Toolbox provides tools for the process:

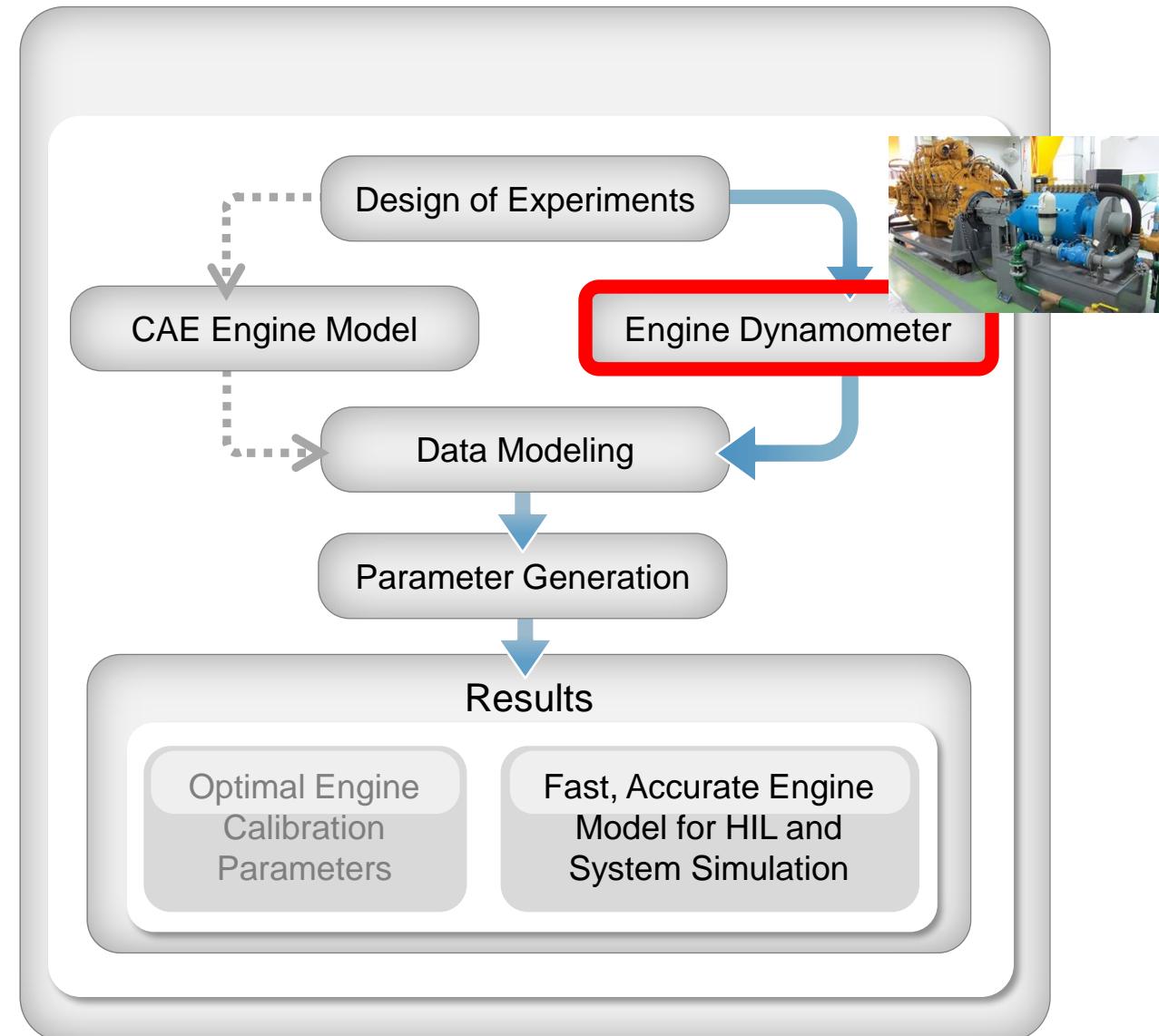
- **Creating the Design of Experiments**



Parameterizing an Engine Model

- Workflow

- Model-Based Calibration Toolbox provides tools for the process:
 - Creating the Design of Experiments
 - **Gather the data**

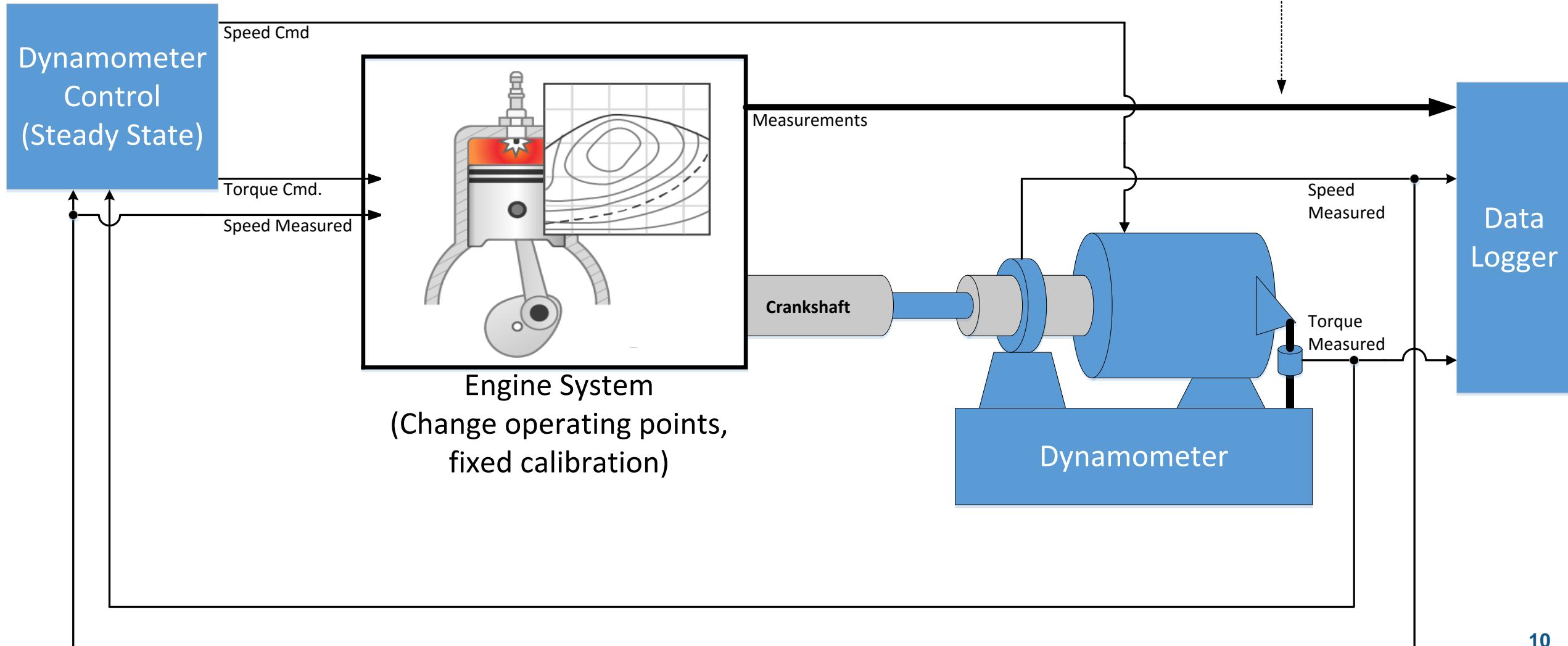


Parameterizing an Engine Model

- Get the data “as calibrated”

Measurements

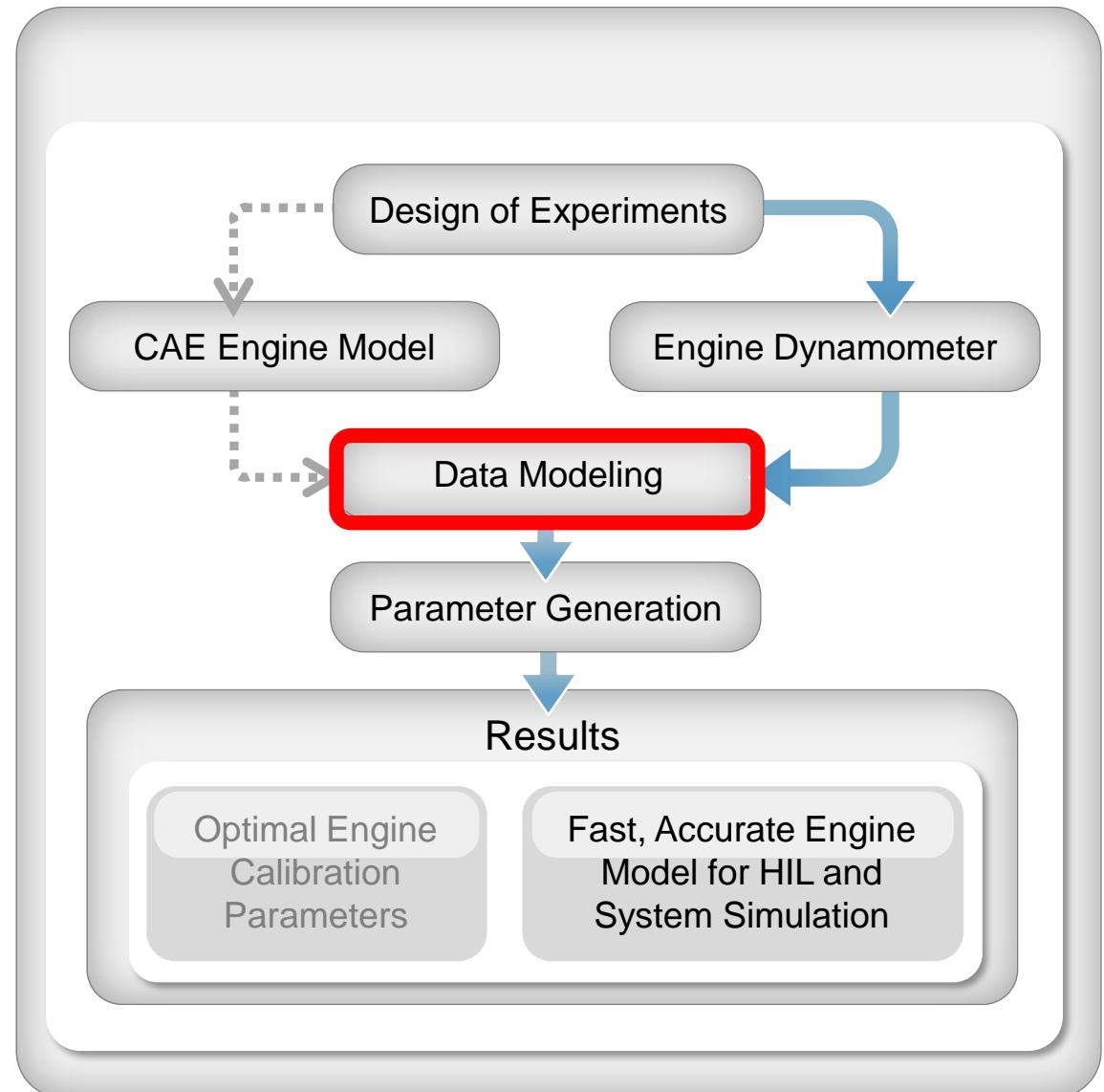
- Air Flow
- Fuel Flow
- Exhaust Temp
- Emissions
- BSFC



Parameterizing an Engine Model

- Workflow

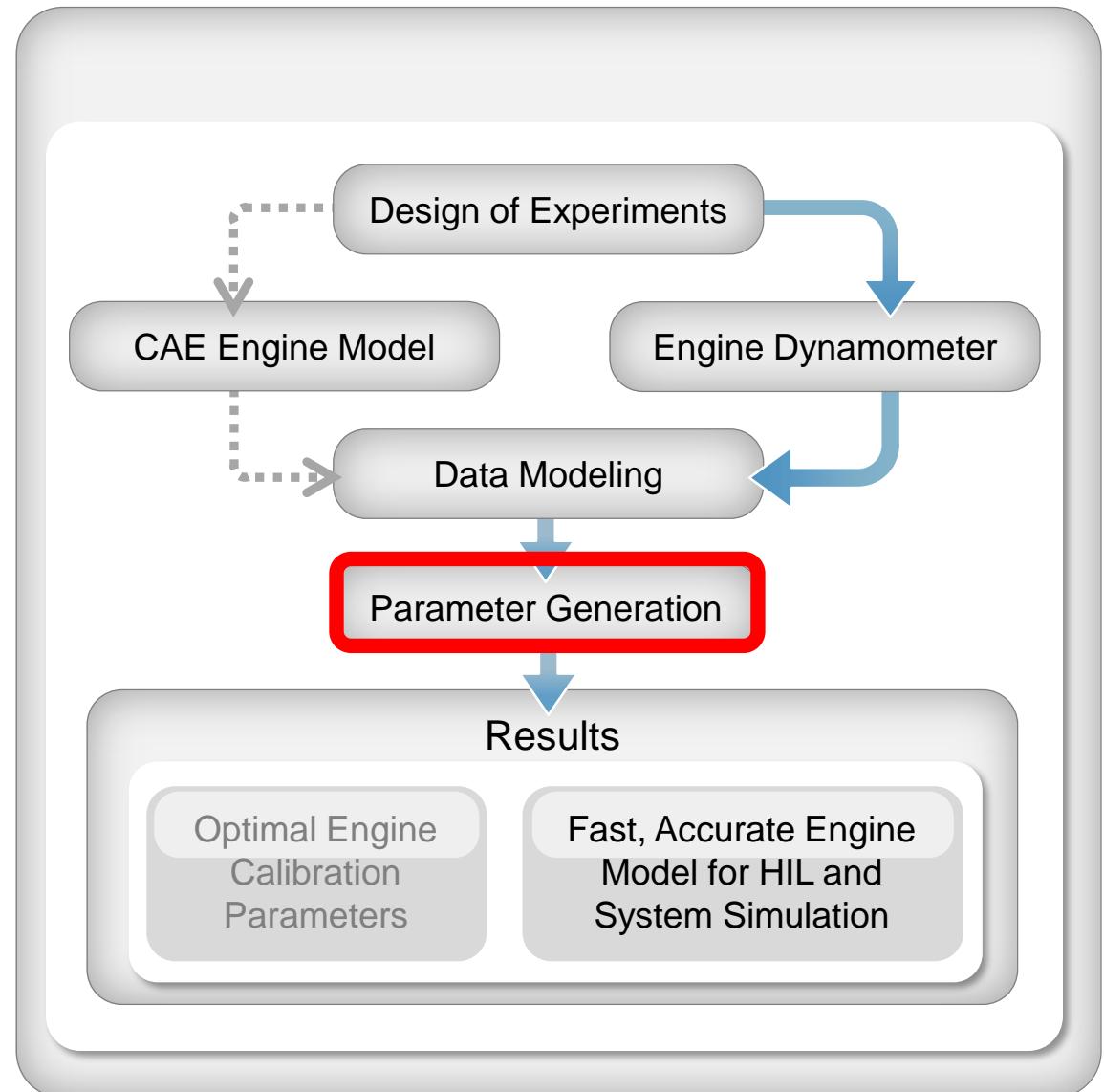
- Model-Based Calibration Toolbox provides tools for the process:
 - Creating the Design of Experiments
 - Gather the data
 - **Fitting response surface models (RSM, statistical) to the data**



Parameterizing an Engine Model

- Workflow

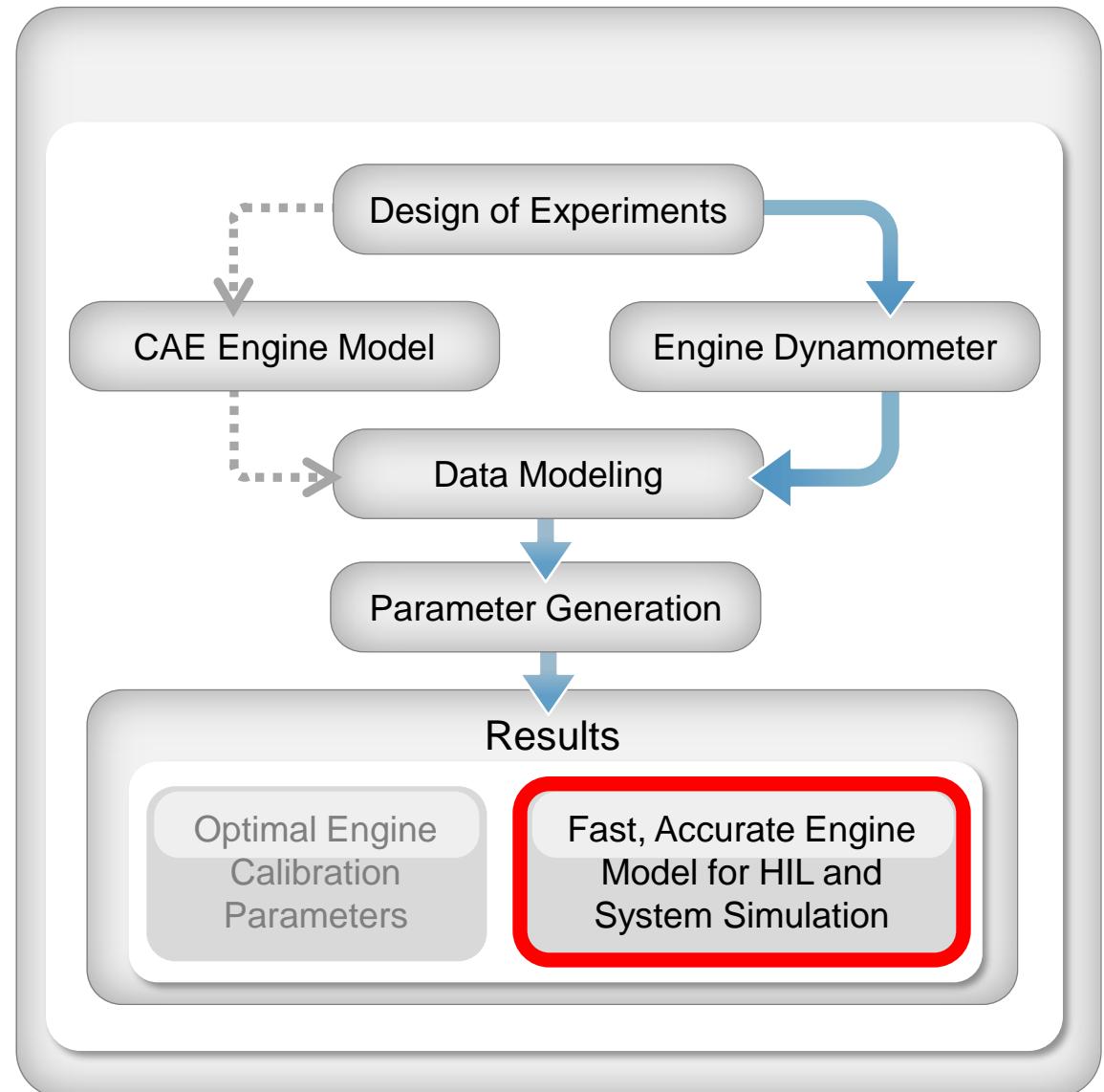
- Model-Based Calibration Toolbox provides tools for the process:
 - Creating the Design of Experiments
 - Gather the data
 - Fitting response surface models
 - **Developing engine performance maps from RSM's**



Parameterizing an Engine Model

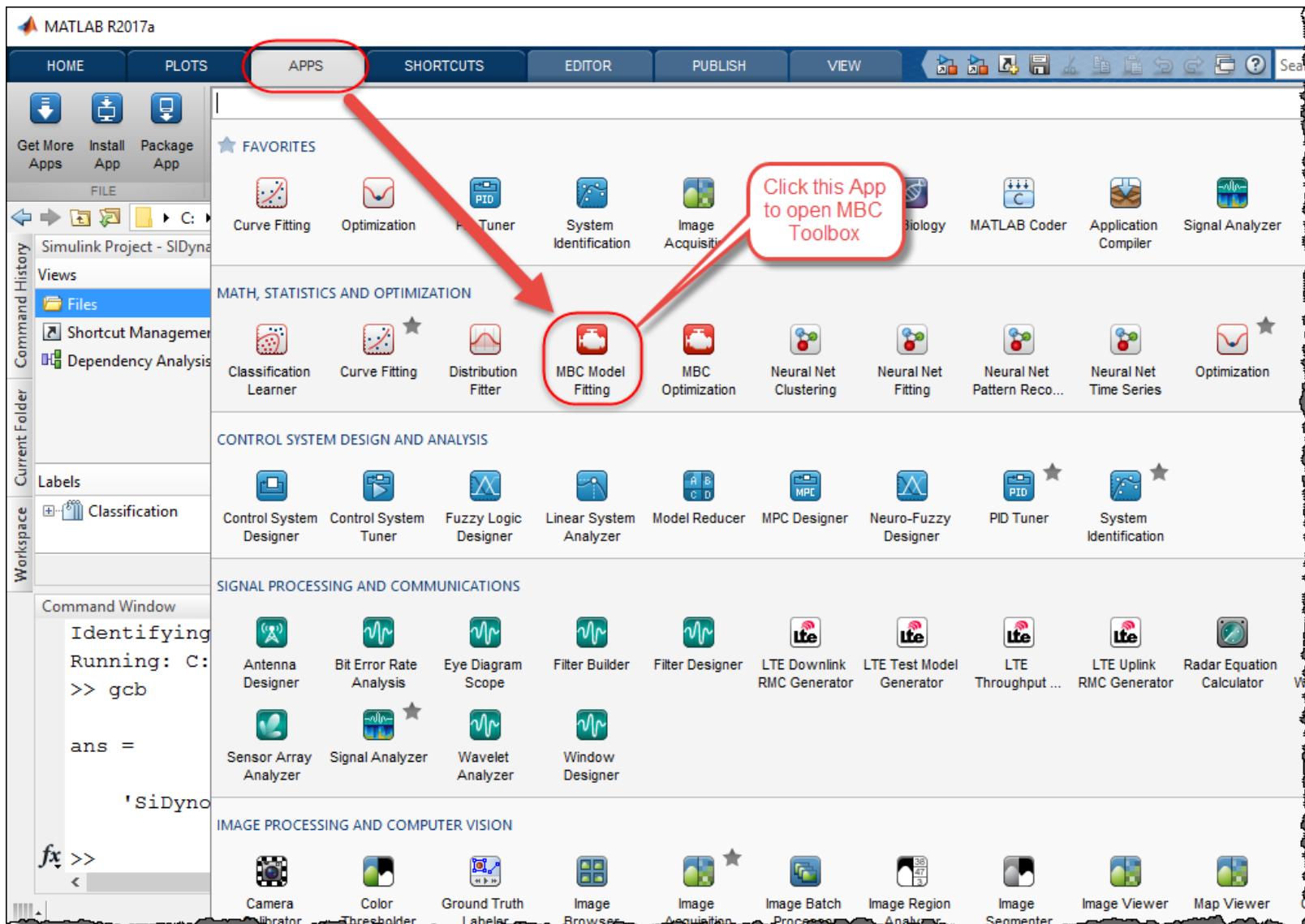
- Workflow

- Model-Based Calibration Toolbox provides tools for the process:
 - Creating the Design of Experiments
 - Gather the data
 - Fitting response surface models
 - Developing engine performance maps
 - **Validate the result**

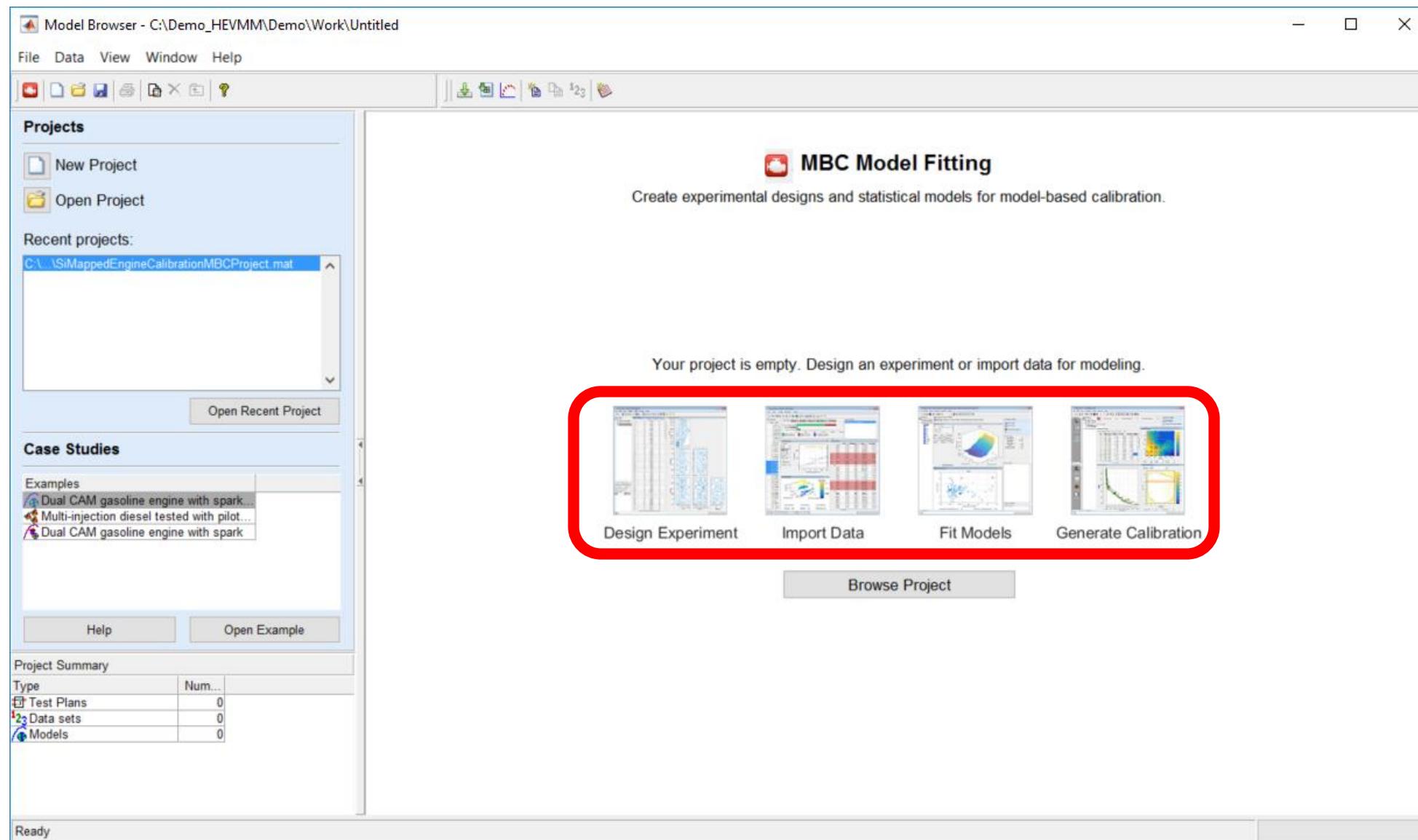


Launch MBC Toolbox

- From Apps tab
- From command line
 >> mbcmode



Launch MBC Toolbox



Parameterizing a Mapped Engine Model

- Importing existing data

- Mapped engine model workflow:

- Importing existing data

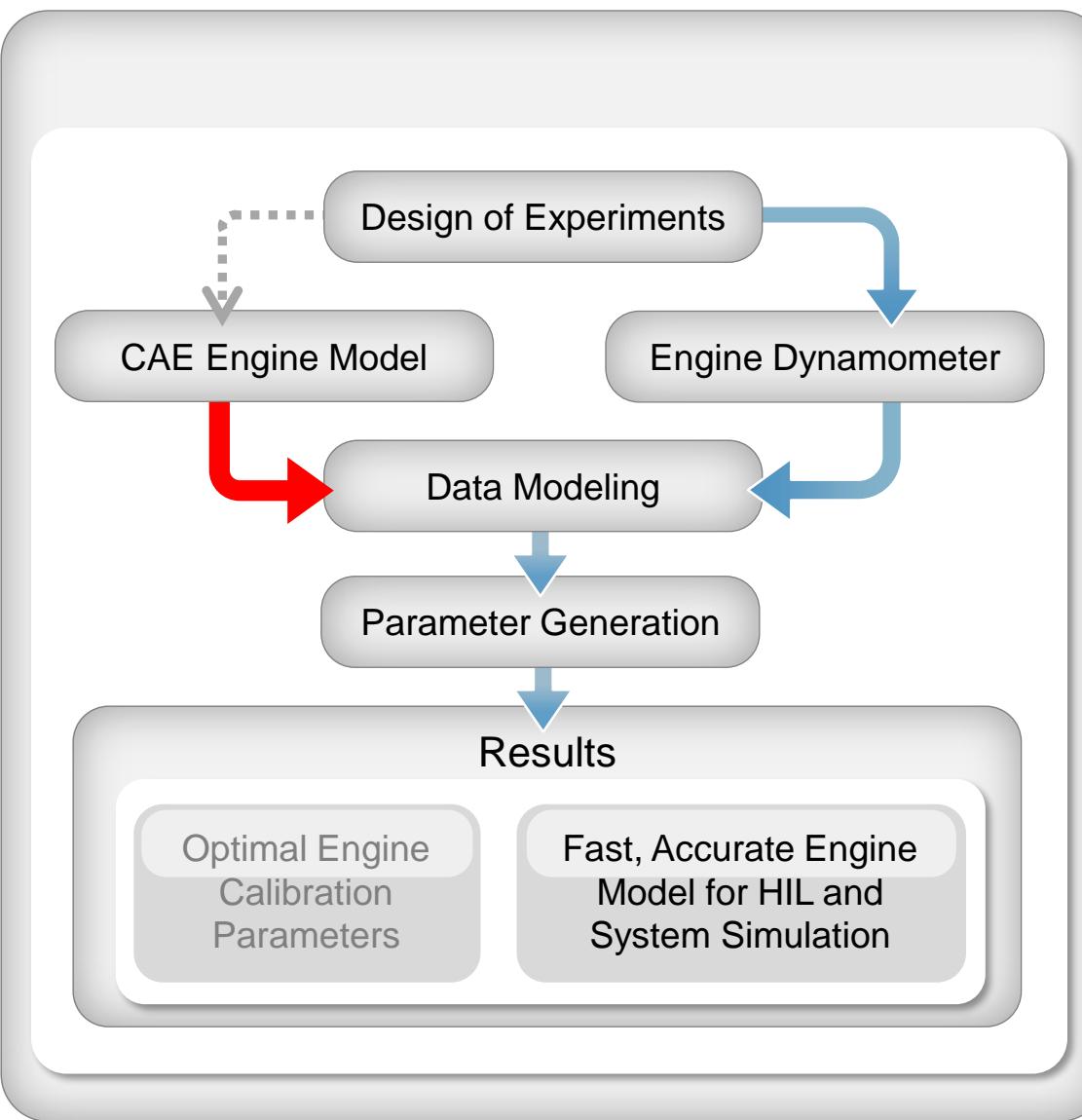
	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R		
NO.	EngSpeed RPM	TQ_CMB Nm	MAT g/kg	AirFlow lb/s	SpkA deg	Lam	ICP	ECP	CrAdd	DegTDC	%	N	RPM	Nm	torque	TorqueOvConstraint	BMEP	R#1	KIT1	K
1	650	45	30.2358	3.97219	41	7.45	1	0	0	0.937775	45	1	3.75826	13.03276	0.705455					
2	700	25	33.0297	3.847983	41	14.3	1	0	0	0.934282	100	24.99674	25	1	2.08415	18.20444	0.731948			
3	700	50	53.03702	4.519883	41	10.25	1	14	1	0.983554	100	49.98501	50	1	4.16591	20.02691	0.77236			
4	750	25	52.72737	3.025519	41	15.3	1	0	0	0.67528	100	25.00004	25	1	2.083347	17.63783	0.35643			
5	750	35	51.52398	3.75846	41	11.95	1	0	0	0.844225	100	34.99958	35	1	2.91664	14.62676	0.499917			
6	750	70	52.72737	3.025519	41	11.95	1	29	46	0.983554	100	27.67454	43.64574	0	1.80001	13.74776	1.34223			
7	800	40	54.64347	3.431115	41	12.0	1	5	11	0.791246	100	29.20001	40	1	2.49154	20.02691	0.77236			
8	800	40	53.39864	6.721616	45	0	1	33	42	0.990603	100	39.50013	51.20016	0	5.33164	20.06195	0.706666			
9	800	45	49.90418	4.790452	41	11.3	1	0	0	1.090942	100	45.00371	45	1	3.79208	12.20018	0.6235516			
10	800	65	48.25568	6.283071	41	10	1	6	2	1.654519	100	65.00113	65	1	5.41523	10.49204	0.578133			
11	850	15	53.03532	2.647666	41	14.55	1	0	0	0.5900184	100	15.00794	15	0	1.250649	20.05487	0.191236			
12	850	20	50.51652	2.982377	41	19.45	1	0	0	0.665596	100	19.50001	20	1	2.665598	13.78077	0.424246			
13	850	35	51.842312	3.644589	41	13.8	1	0	0	0.701649	100	13.80001	35	1	2.850213	13.78077	0.424255			
14	850	45	58.42198	7.259064	41	0	1	48	32	69.85454	100	60.0294	59.95578	0	5.047529	20.99704	0.973099			
15	900	20	72.70905	3.664539	41	50	1	25	23	0.825493	100	20.03939	20	1	1.670543	40.49988	0.612126			
16	900	50	50.13562	5.701361	41	12.4	1	0	0	1.3223963	100	49.98401	50	1	4.166411	10.97351	0.652149			
17	950	40	49.90424	5.090178	41	14.75	1	0	0	1.140858	100	40.02629	40	1	3.35203	12.3595	0.50113			
18	950	90	47.73387	9.460513	41	0	1	18	8	1.545474	100	80.57912	80.65272	0	6.34999	9.21698	0.544607			
19	1000	10	50.13562	5.701361	41	17.6	1	0	0	0.840442	100	50.13562	10	1	4.166411	10.97351	0.652149			
20	1000	70	56.53945	8.234204	41	11.2	1	28	26	0.0574745	100	69.99997	70	0	5.83316	20.05488	0.56194			
21	1050	20	52.30279	3.629747	41	22.4	1	0	0	1.607122	100	20.00536	20	1	1.667129	17.21989	0.251292			
22	1050	30	50.93374	4.598652	41	18.4	1	0	0	1.031417	100	29.98478	30	1	2.948823	14.02113	0.357092			
23	1050	35	54.39817	5.072801	41	20.45	1	1	17	1.100085	100	35.01015	35	1	2.916622	18.38376	0.444375			
24	1050	95	45.60508	10.79042	41	0	1	22	33	73.5	61.21263	82.93339	83.13399	0	6.90804	10.91495	0.595224			
25	1100	25	53.03532	5.598642	41	56	1	35	35	1.607122	100	24.99647	25	0	2.95631	10.97351	0.661717			
26	1100	25	53.39864	6.288041	41	21.1	1	0	0	0.864033	100	49.98401	25	1	4.166411	10.97351	0.652149			
27	1100	45	48.84553	6.11219	41	16.5	1	0	0	1.422047	100	44.57535	45	1	3.452126	10.99736	0.539556			
28	1100	50	49.90424	5.090178	41	11.6	1	33	36	1.114517	100	69.95096	69	0	5.83316	17.63783	0.973099			

Design Experiment

Import Data

Fit Models

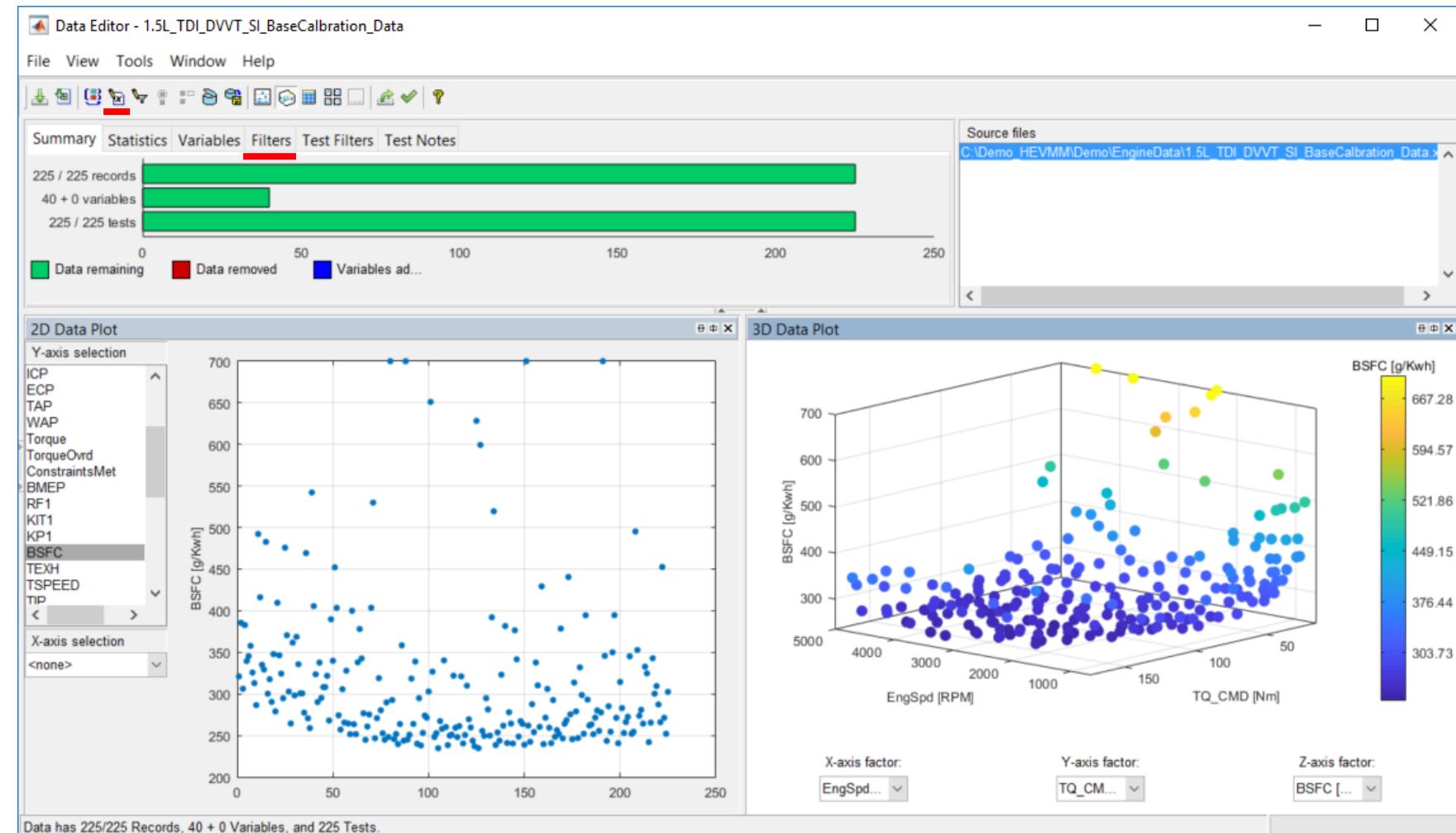
Generate Calibration



Import Data

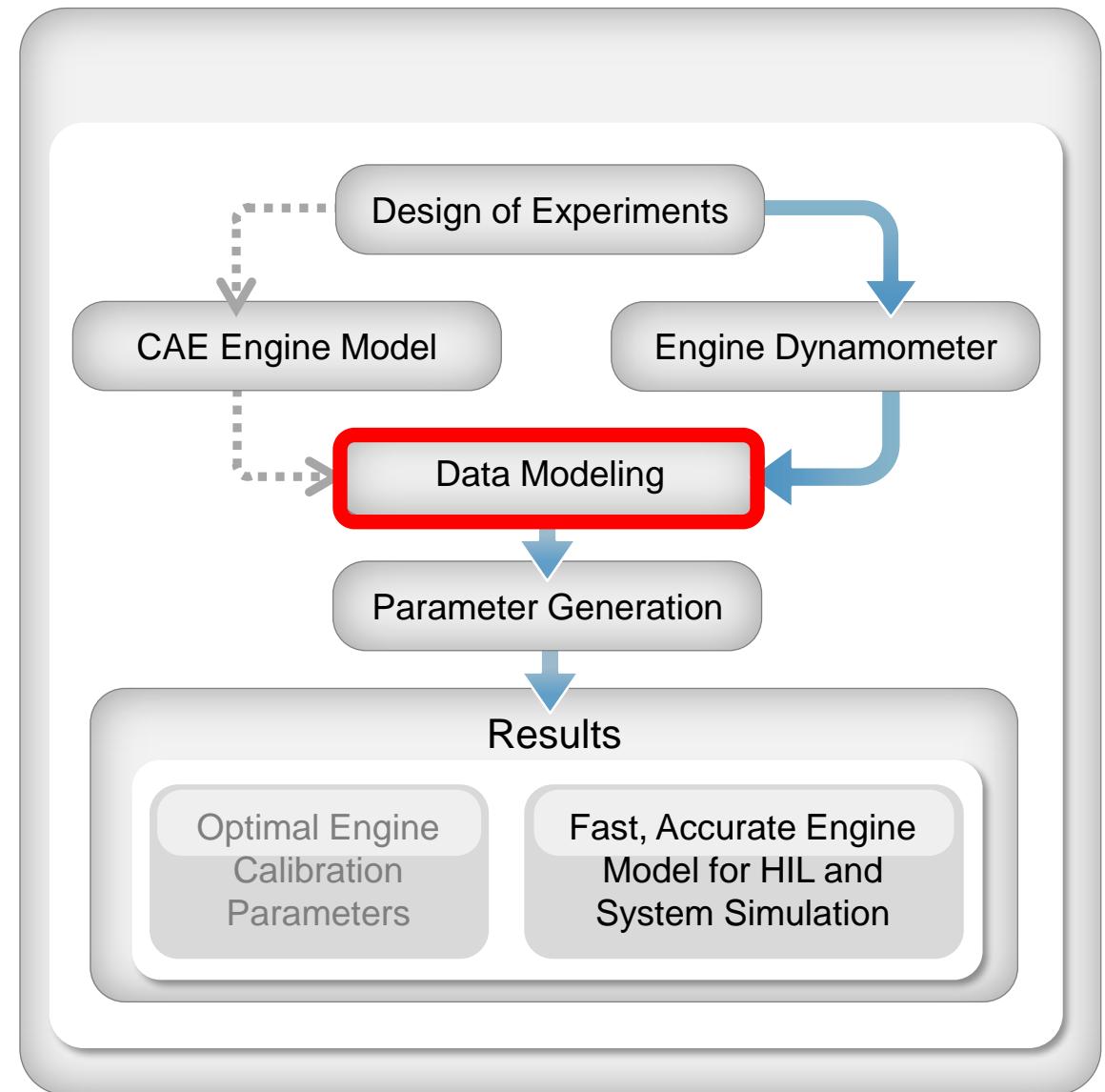
- Inspect the data

- Look for anomalies or gaps
- Filter data to remove anomalies
- Add derived quantities and unit conversions
- Graphical views speed inspection



Parameterizing a Mapped Engine Model

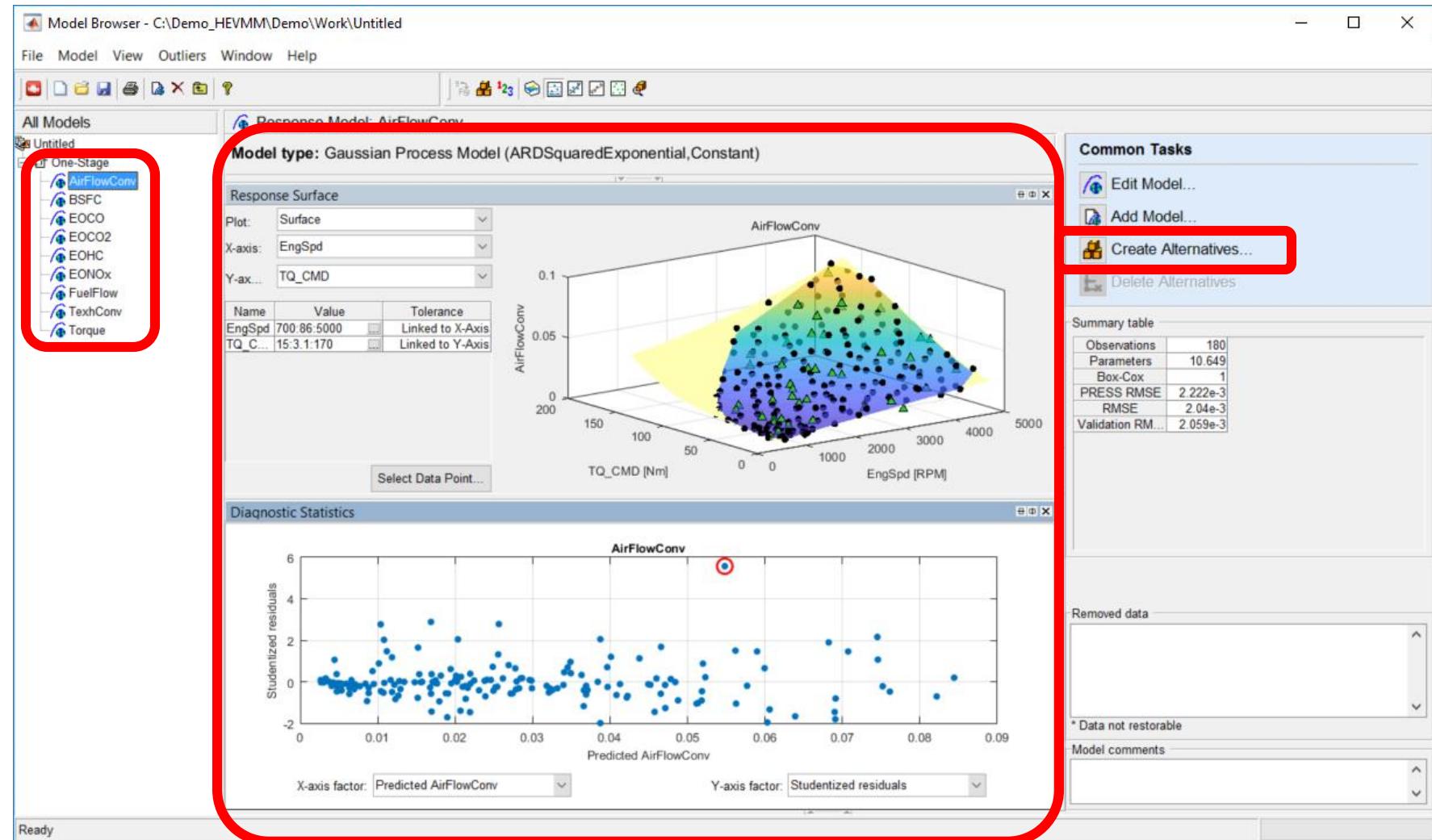
- Fitting response surface models
- Mapped engine model workflow:
 - Importing existing data
 - **Fitting response surface models (RSM, statistical) to the data**



Fitting Models to the Data

- Generate response surface models

- Default models automatically fitted to all responses
- Inspect quality of fit
- Try out alternatives

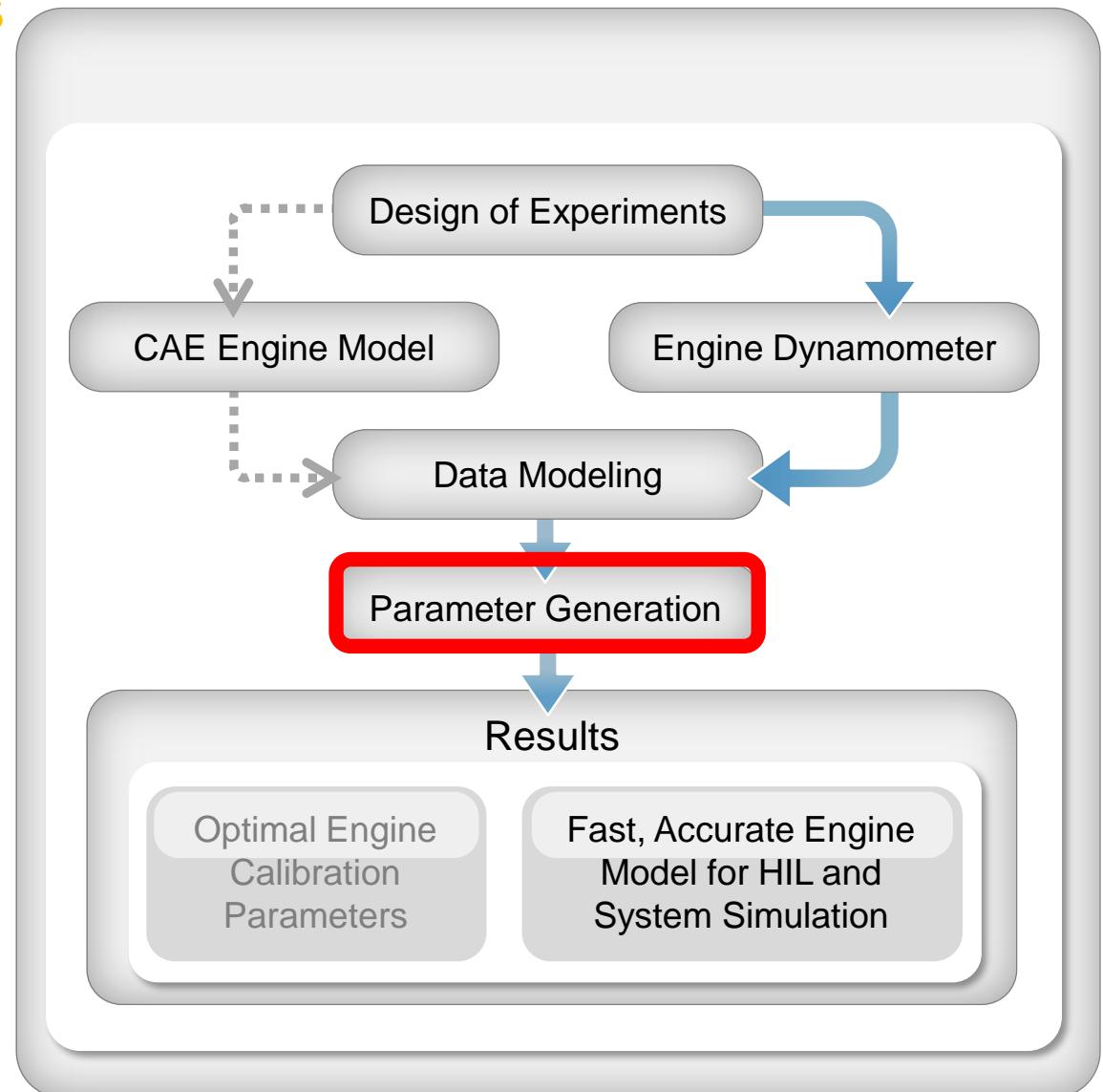
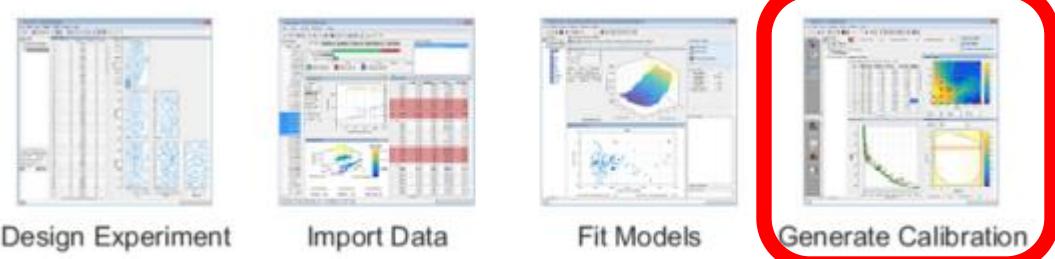


Parameterizing a Mapped Engine Model

- Developing engine performance maps

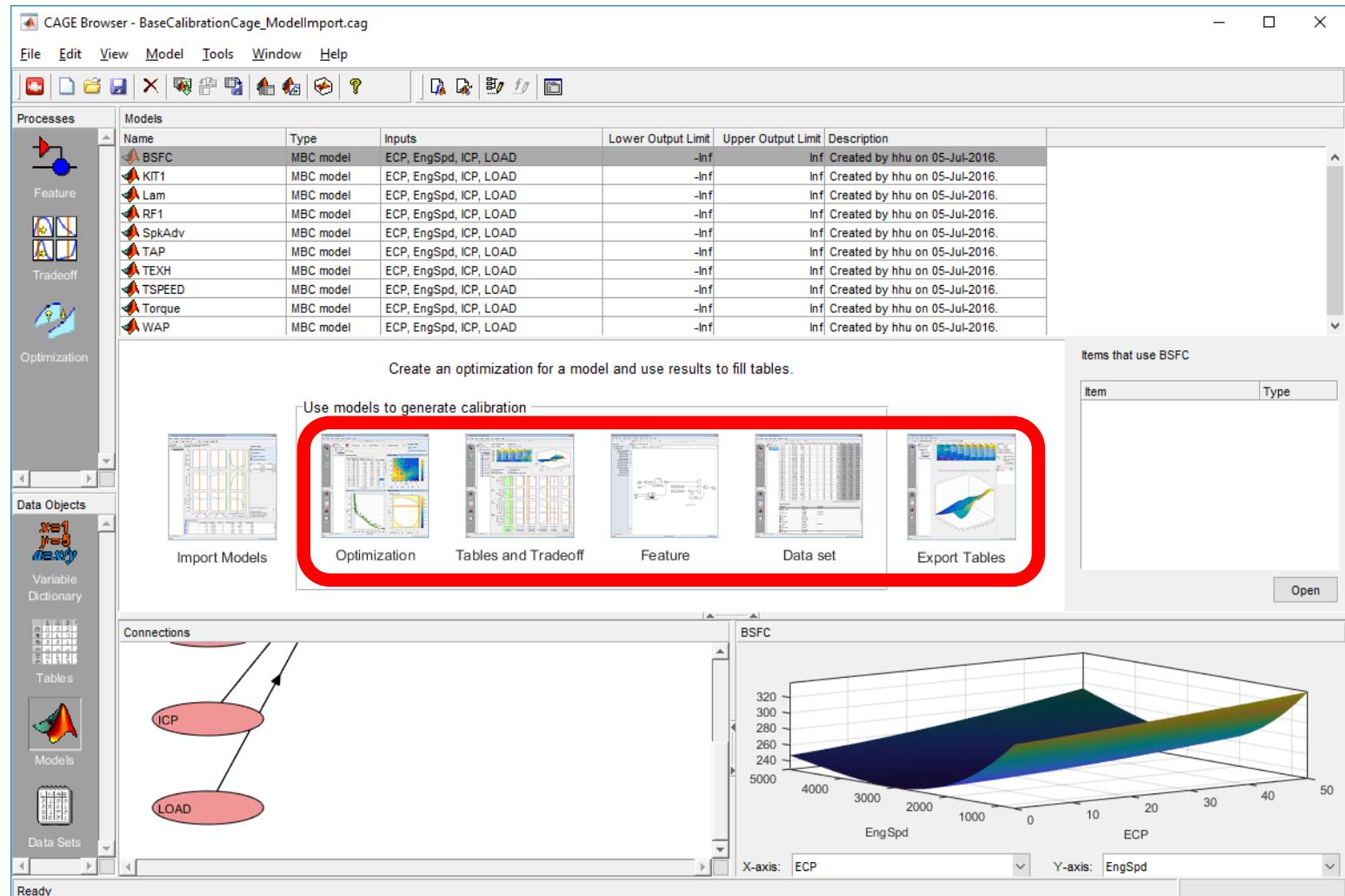
- Mapped engine model workflow:

- Importing existing data
- Fitting response surface models
- Developing engine performance maps from RSM's



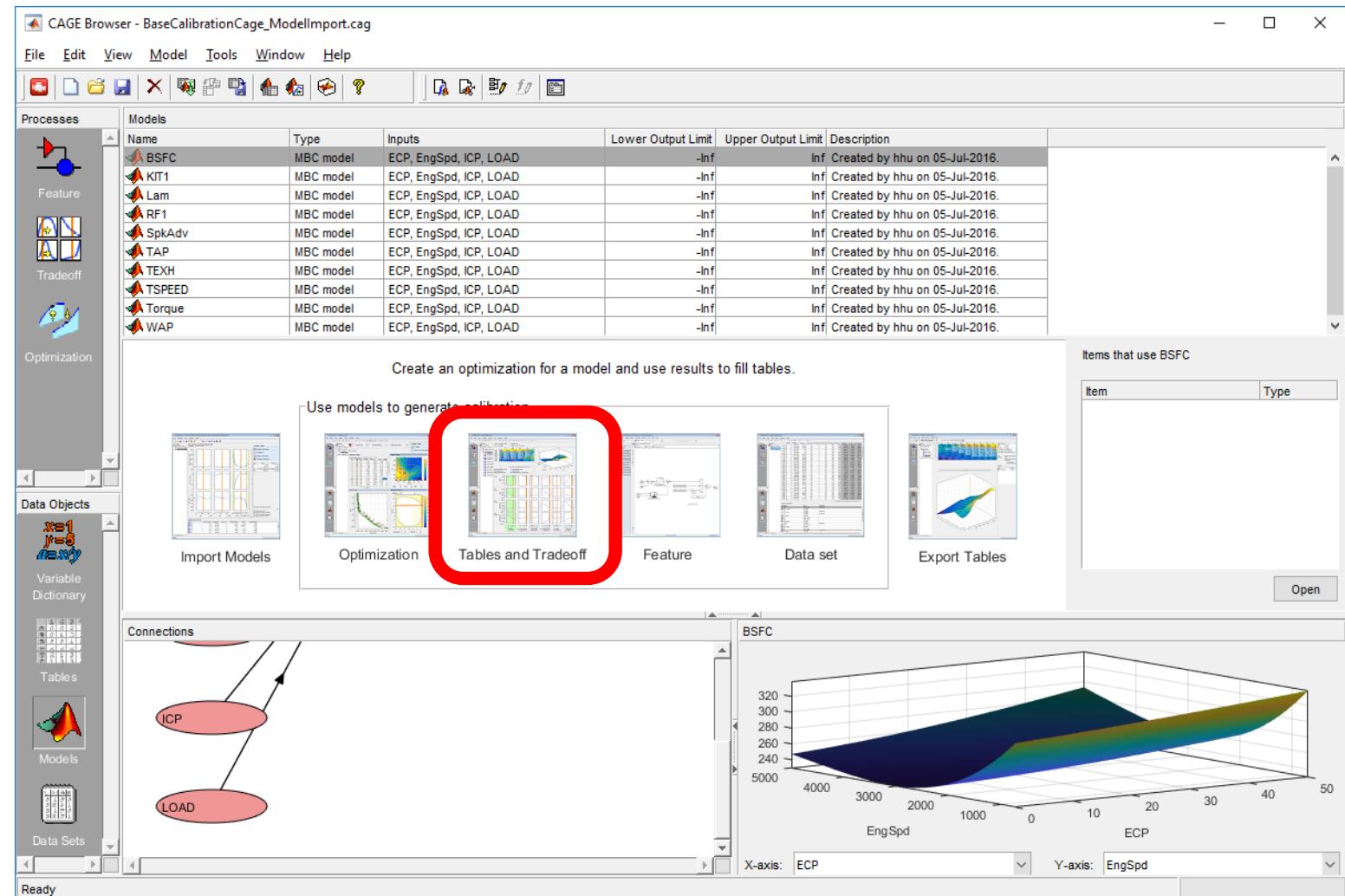
Calibration Generation Tool

- Fill tables
- Export cal tables



Calibration Generation Tool

- Generating look up tables



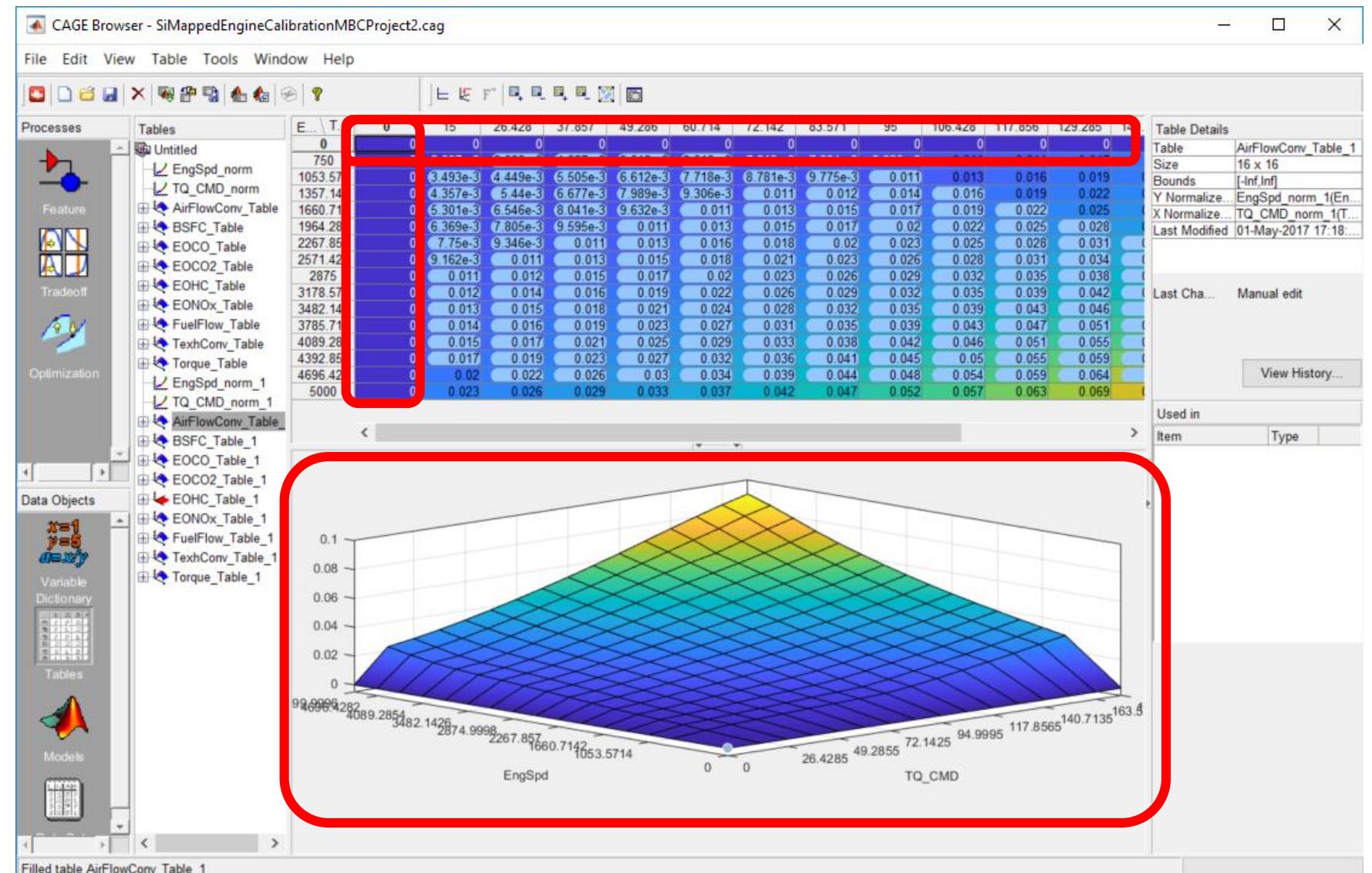
Calibration Generation Tool

- Fill tables

- Inspect surfaces

- Adjust table values in extrapolation areas

- Export to MATLAB, Excel or Cal tool

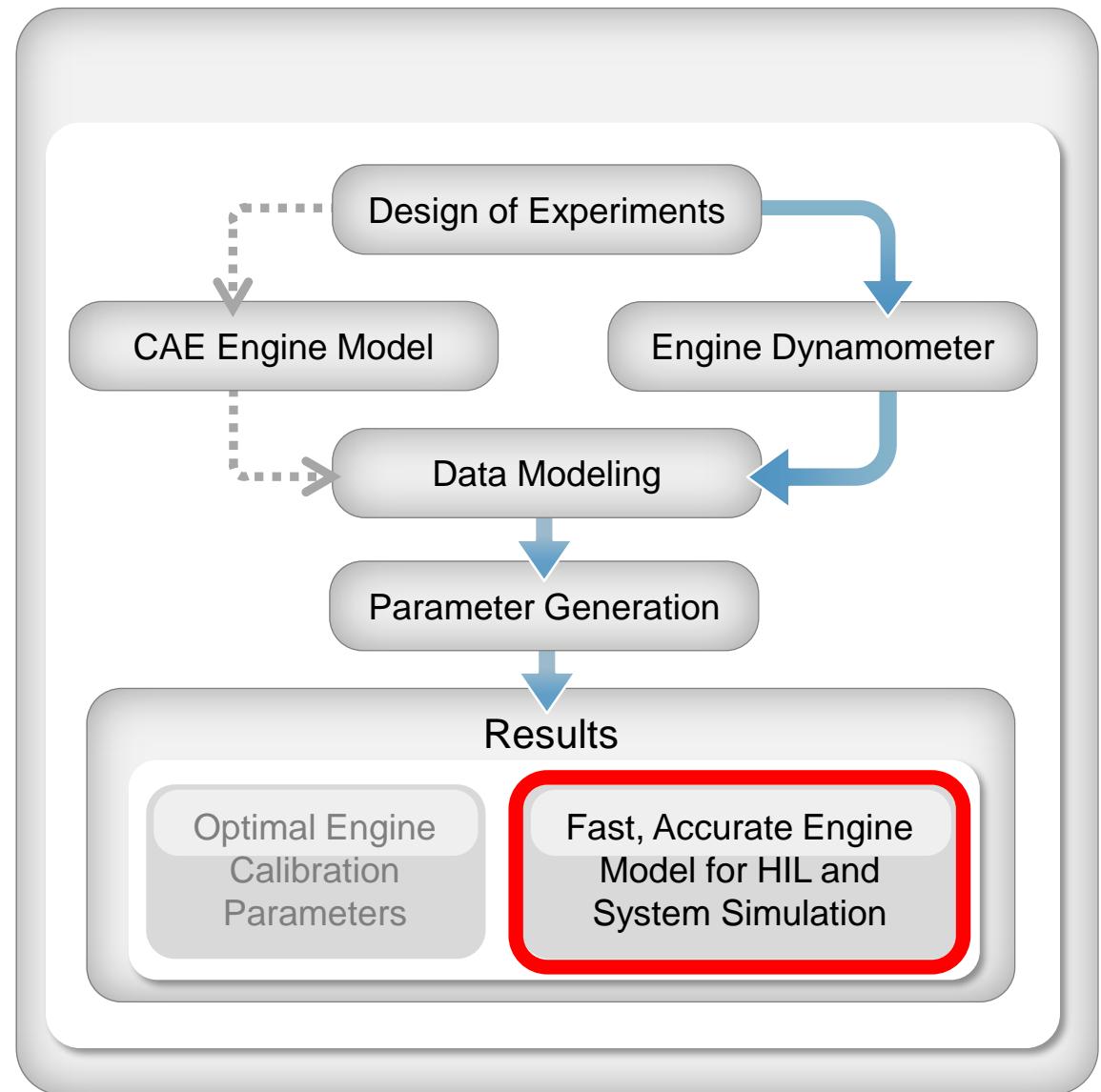
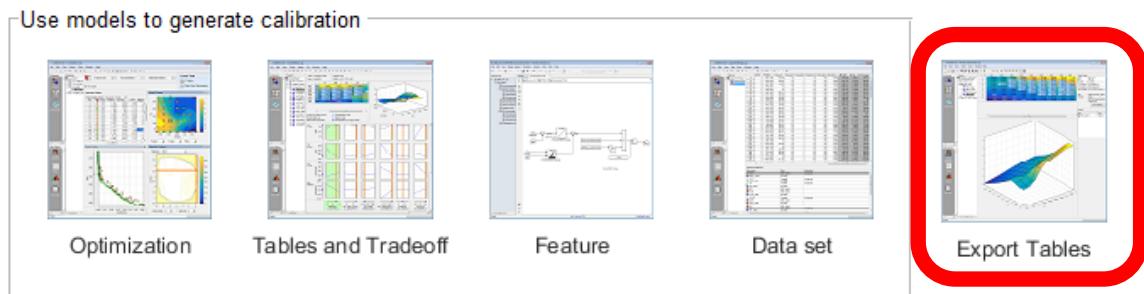


Parameterizing a Mapped Engine Model

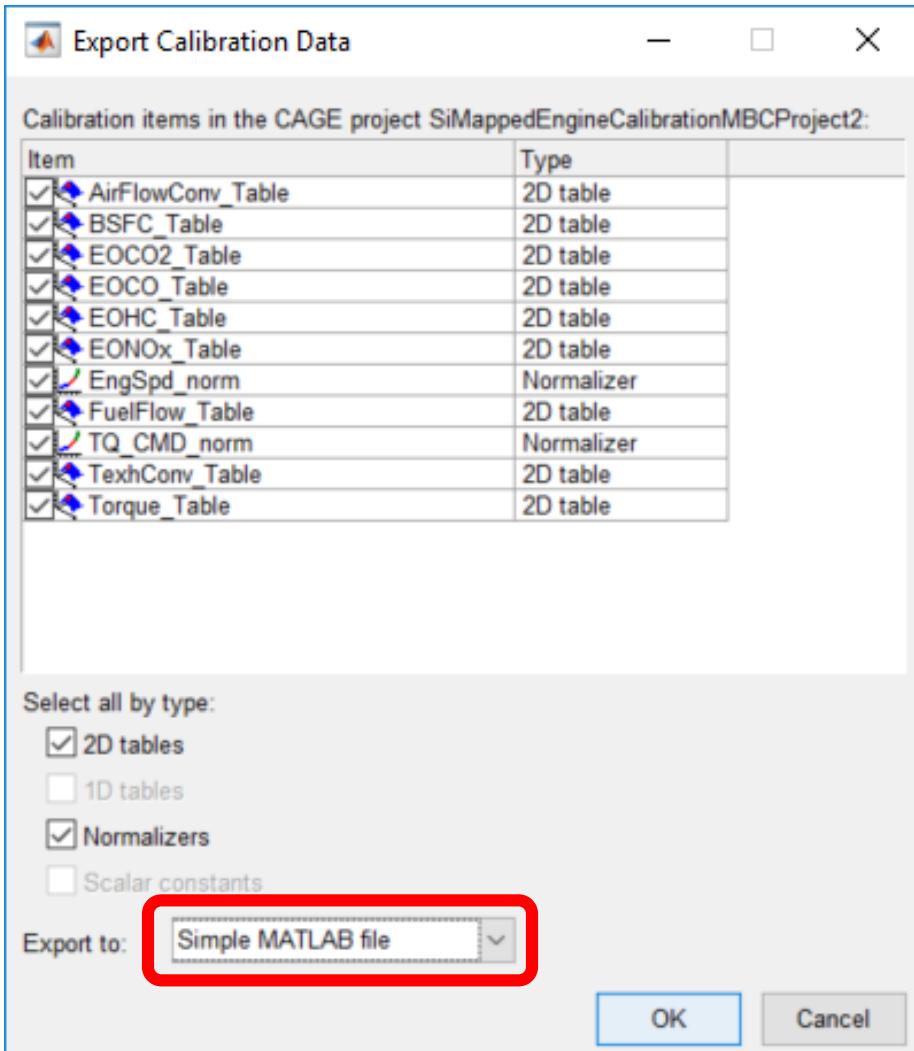
- Export and validate result

- Mapped engine model workflow:

- Importing existing data
- Fitting response surface models
- Developing engine performance maps
- Export and validate the result**

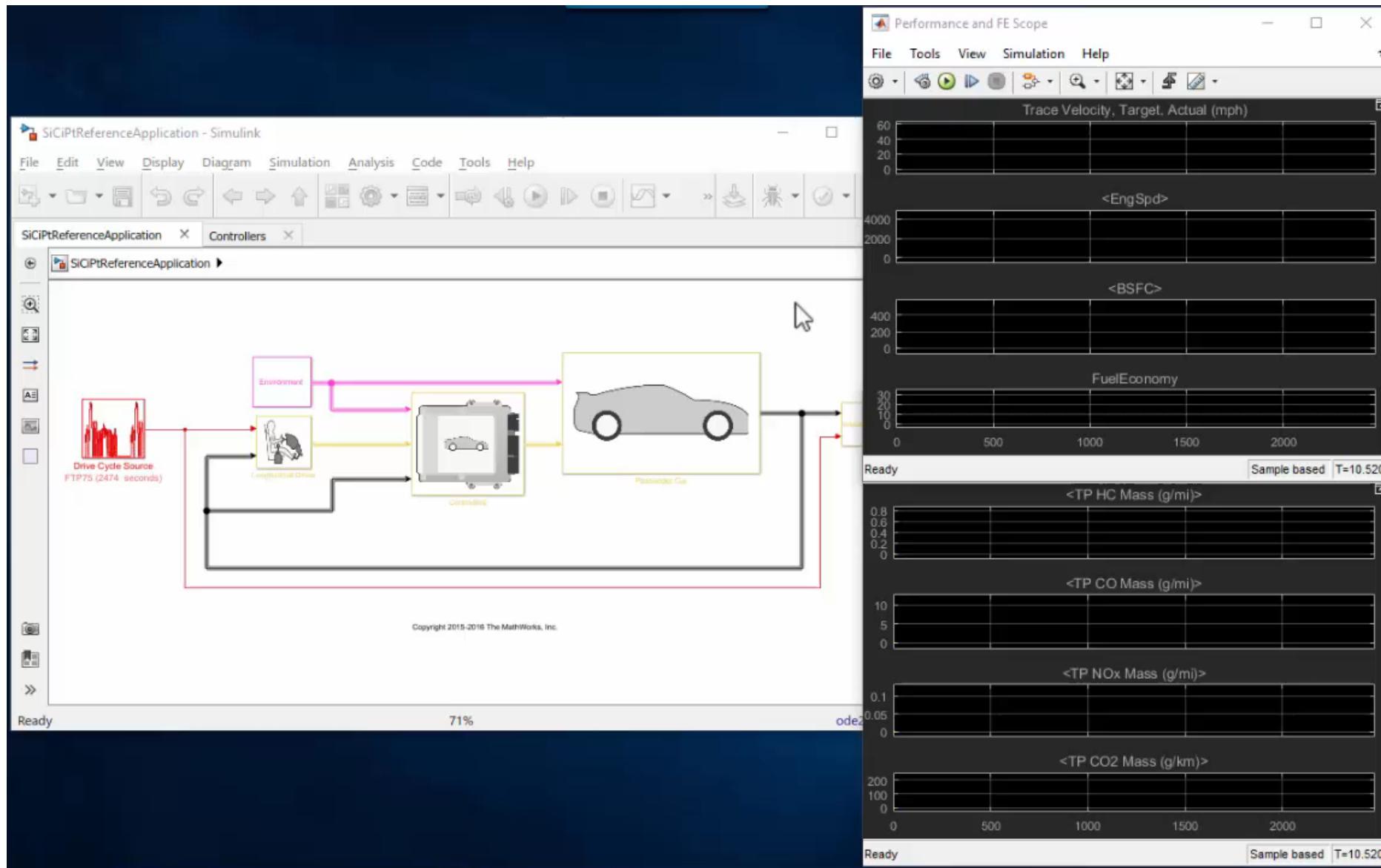


Export Tables to MATLAB



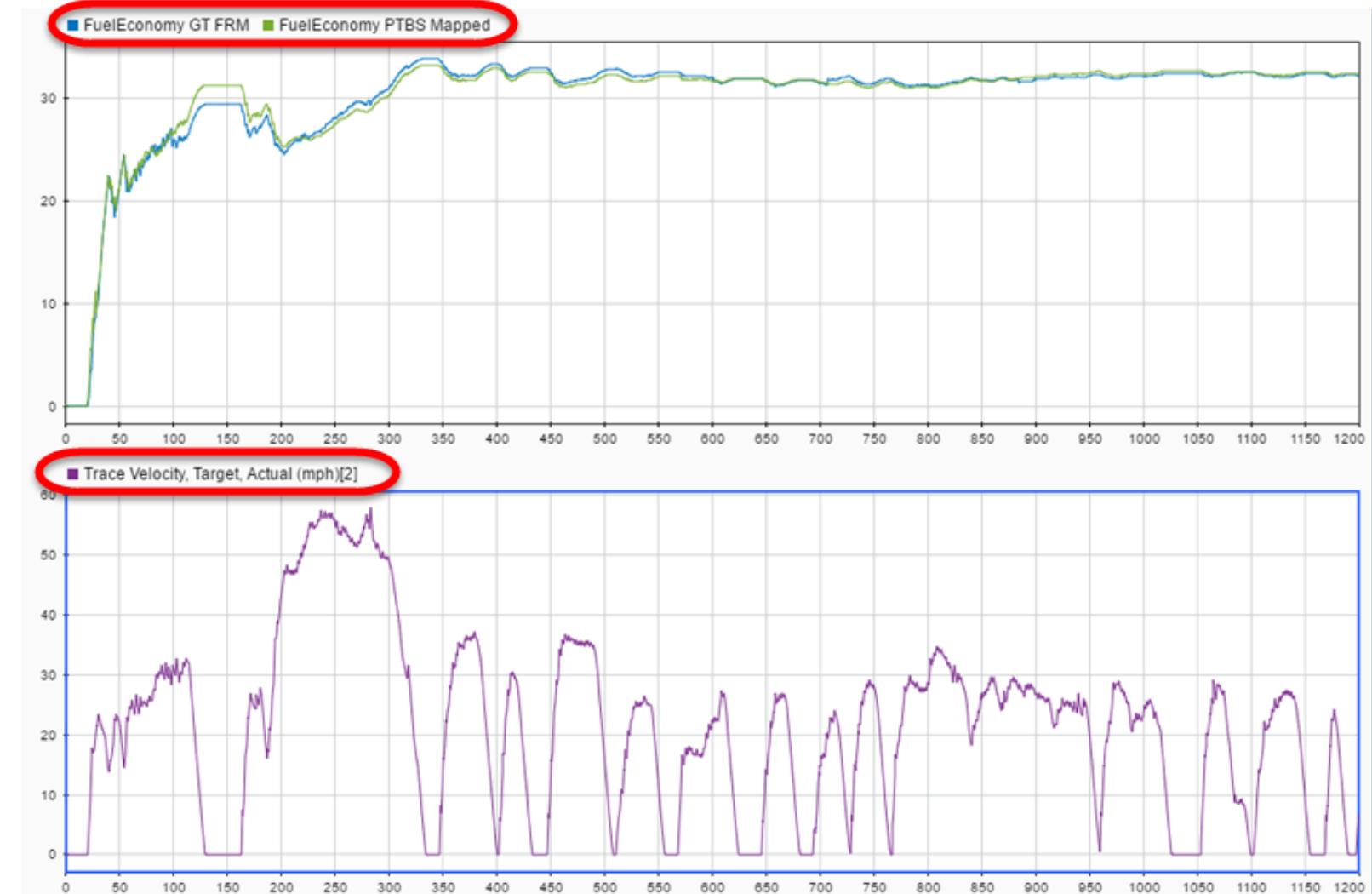
```
%SIMAPPEDENGINECALIBRATIONS2 Calibration MATLAB file.
%
% Generated by MATLAB 9.2.0.538062 (R2017a) on 01-May-2017 19:19:54
%
EngSpd_norm_1.X = [ 0, 750, 1053.5714, 1357.1428, 1660.7142, 1964.285
EngSpd_norm_1.Y = [ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14
%
TQ_CMD_norm_1.X = [ 0, 15, 26.4285, 37.857, 49.2855, 60.714, 72.1425,
TQ_CMD_norm_1.Y = [ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14
%
AirFlowConv_Table_1.X = [ 0, 15, 26.4285, 37.857, 49.2855, 60.714, 72.1425,
AirFlowConv_Table_1.Y = [ 0, 750, 1053.5714, 1357.1428, 1660.7142, 1964.285
AirFlowConv_Table_1.Z(1,:) = [ 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0
AirFlowConv_Table_1.Z(2,:) = [ 0, 0.0022967, 0.0035882, 0.0045269, 0.005505, 0.0066774, 0.0078051, 0.0080411, 0.0095947, 0.011301, 0.013036, 0.014712, 0.016394, 0.0180918, 0.0197497, 0.021301, 0.0227497, 0.0241619, 0.025518, 0.0268419, 0.0281471, 0.029418, 0.0306518, 0.0318419, 0.033018, 0.0341619, 0.0353018, 0.036418, 0.037518, 0.0386018, 0.0396718, 0.040718, 0.0417618, 0.0428018, 0.0438318, 0.0448518, 0.0458618, 0.0468618, 0.0478518, 0.0488318, 0.0498018, 0.0507518, 0.0516818, 0.0526018, 0.0535018, 0.0544818, 0.0554518, 0.0564118, 0.0573518, 0.0582718, 0.0591818, 0.0600718, 0.0609418, 0.0618018, 0.0626418, 0.0634618, 0.0642618, 0.0650418, 0.0658018, 0.0665418, 0.0672618, 0.0679618, 0.0686418, 0.0693018, 0.0699418, 0.0705618, 0.0711618, 0.0717418, 0.0723018, 0.0728418, 0.0733518, 0.0738418, 0.0743118, 0.0747618, 0.0752018, 0.0756218, 0.0760218, 0.0764018, 0.0767618, 0.0770918, 0.0774018, 0.0776918, 0.0779618, 0.0782118, 0.0784418, 0.0786518, 0.0788418, 0.0790118, 0.0791618, 0.0792918, 0.0794118, 0.0795118, 0.0795918, 0.0796518, 0.0797018, 0.0797318, 0.0797418, 0.0797318, 0.0797018, 0.0796518, 0.0795918, 0.0795118, 0.0794118, 0.0793118, 0.0791618, 0.0789918, 0.0787918, 0.0785718, 0.0783318, 0.0780718, 0.0777818, 0.0774718, 0.0771418, 0.0767918, 0.0764218, 0.0760318, 0.0756218, 0.0751918, 0.0747418, 0.0742718, 0.0737718, 0.0732518, 0.0727118, 0.0721518, 0.0715618, 0.0709518, 0.0703218, 0.0696718, 0.0690018, 0.0683118, 0.0675918, 0.0668518, 0.0660818, 0.0652818, 0.0644518, 0.0635918, 0.0627118, 0.0618018, 0.0608718, 0.0599118, 0.0589318, 0.0579218, 0.0568818, 0.0558118, 0.0547118, 0.0535818, 0.0524218, 0.0512318, 0.0500118, 0.0487618, 0.0474718, 0.0461418, 0.0447718, 0.0433618, 0.0419118, 0.0404218, 0.0388918, 0.0373218, 0.0357118, 0.0340618, 0.0323718, 0.0306418, 0.0288718, 0.0270618, 0.0252118, 0.0233118, 0.0213718, 0.0193918, 0.0173718, 0.0153118, 0.0132118, 0.0110718, 0.0088918, 0.0066718, 0.0043918, 0.0020618, 0.0006818, -0.0011118]
```

Validate the Result



Validate the Result

- Accuracy for 1200 sec of FTP75 sim:
 - % diff in FE was 0.31%
- Run time for 1200 sec of FTP75 sim:
 - PTBS Mapped engine model 28.4 sec
 - GT Power FRM engine model 1449 sec
 - Mapped engine model sim ~51x faster

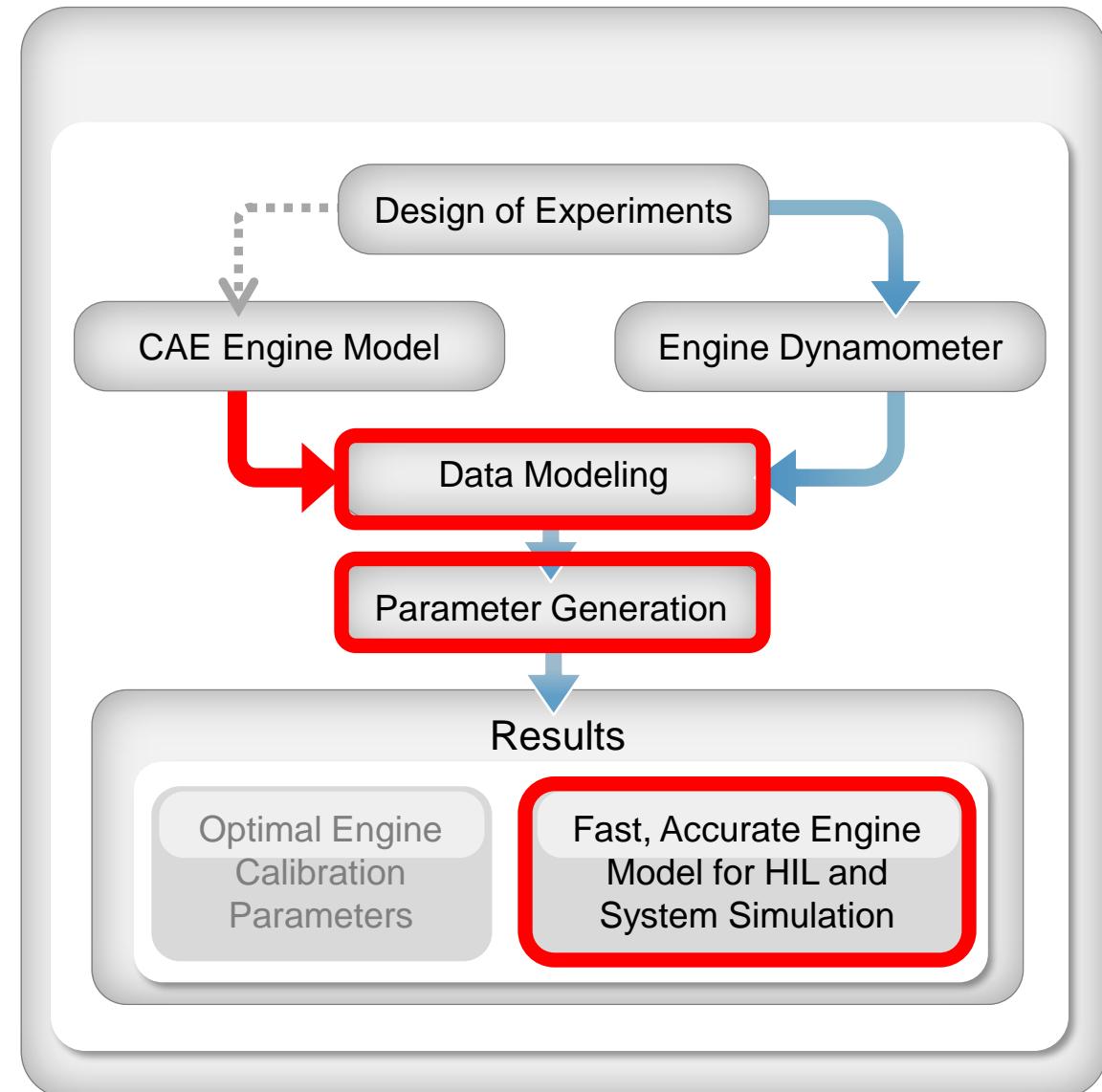


Parameterizing a Mapped Engine Model

- Summary

- Mapped engine model workflow:

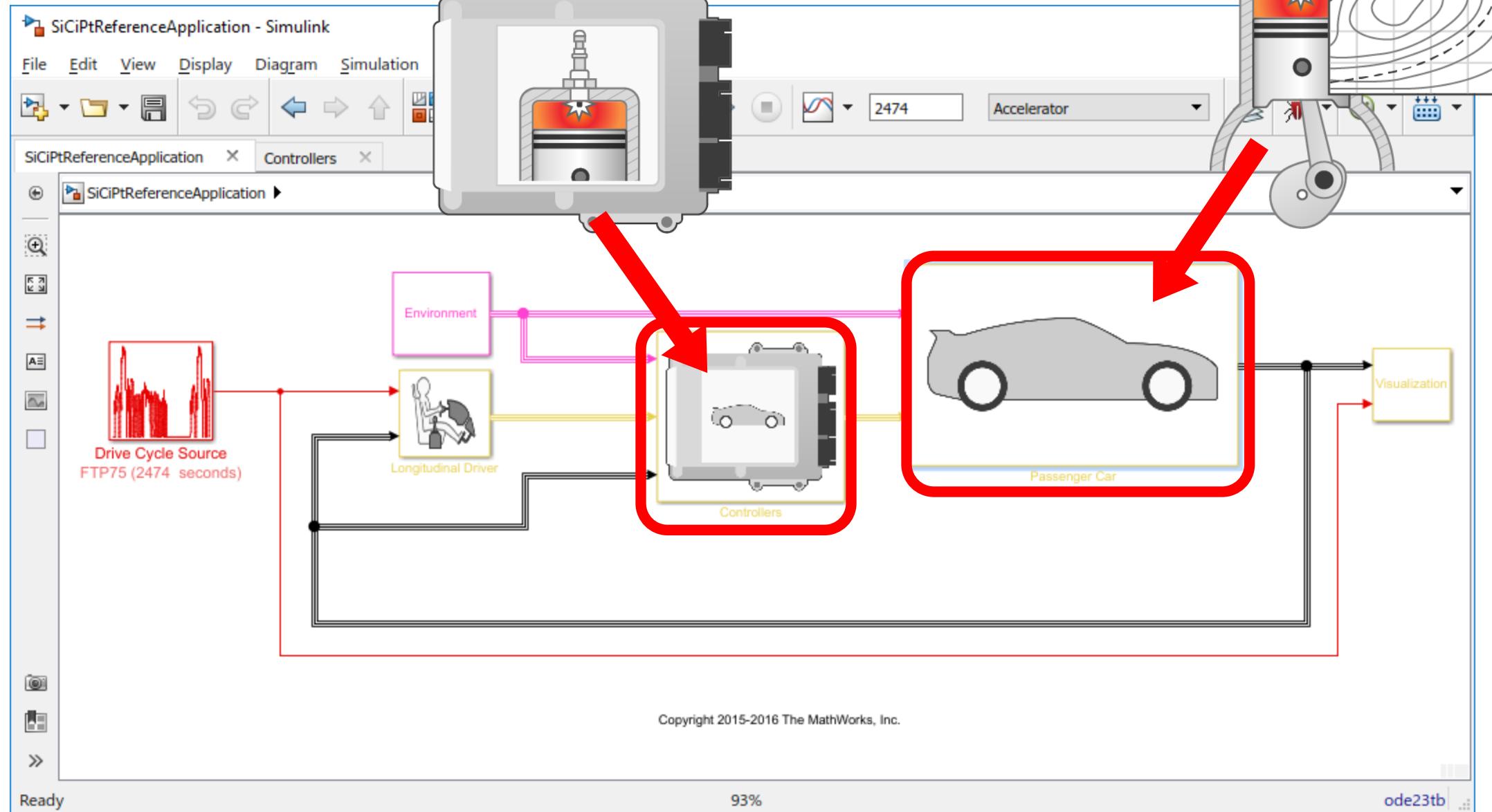
- Importing existing data
- Fitting response surface models (RSM, statistical) to the data
- Developing engine performance maps from RSM's
- Validate the result



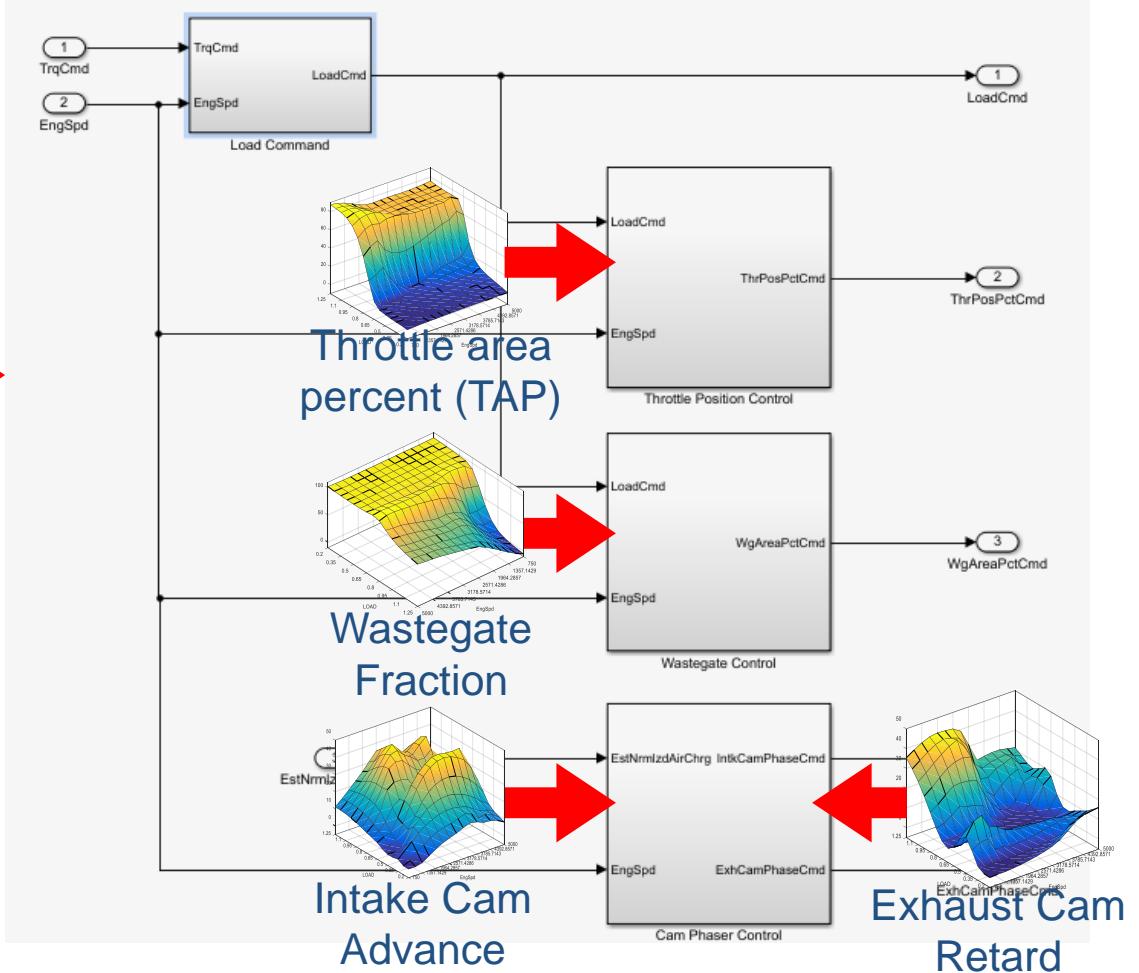
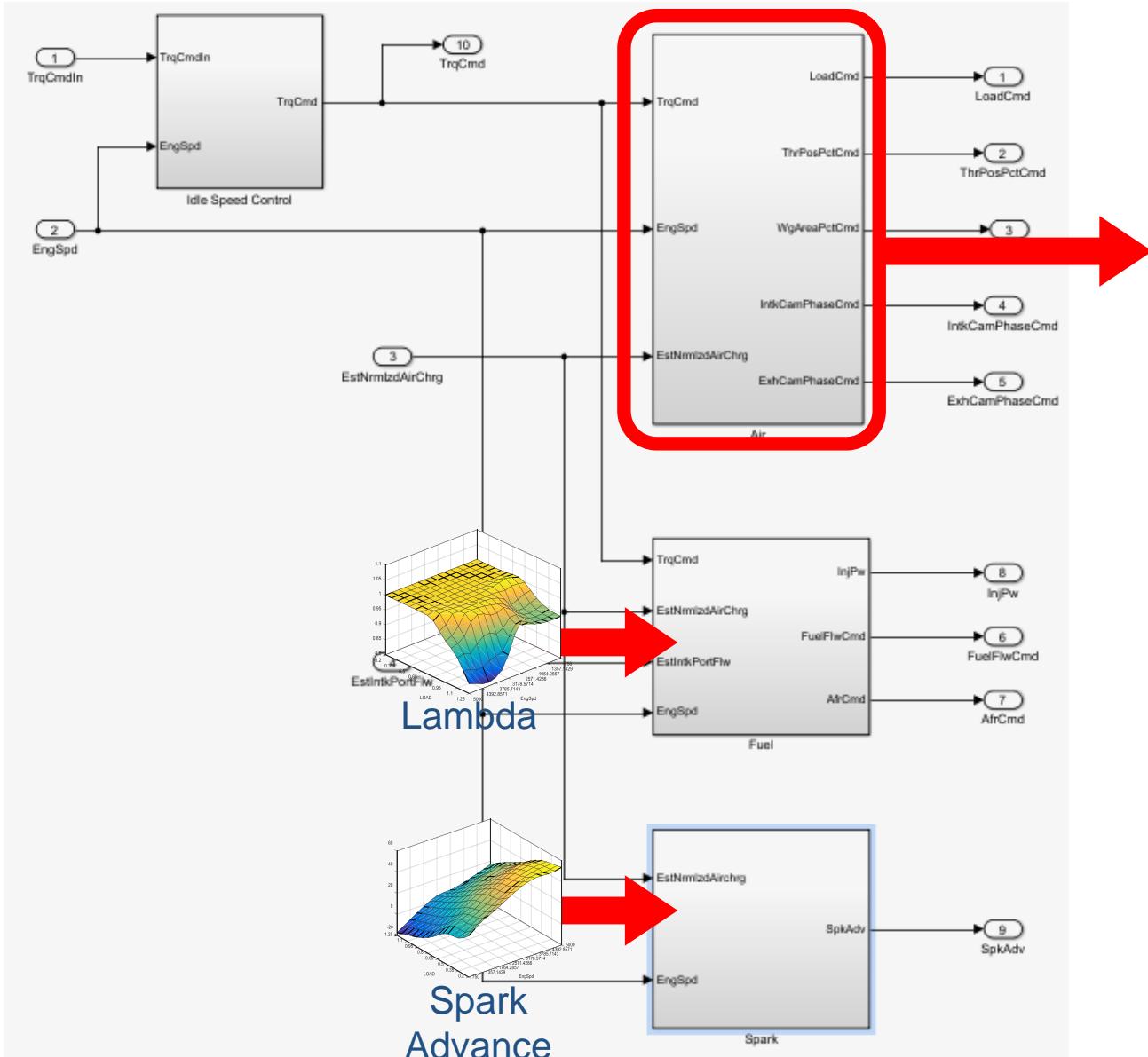
What we'll Cover Today

- Parameterizing a Powertrain Blockset engine model
 - Workflow
 - Example: parameterizing a mapped engine model
- **Calibrating a Powertrain Blockset engine controller**
 - Workflow
 - Example: calibrating an engine controller

What are we Parameterizing and Calibrating?



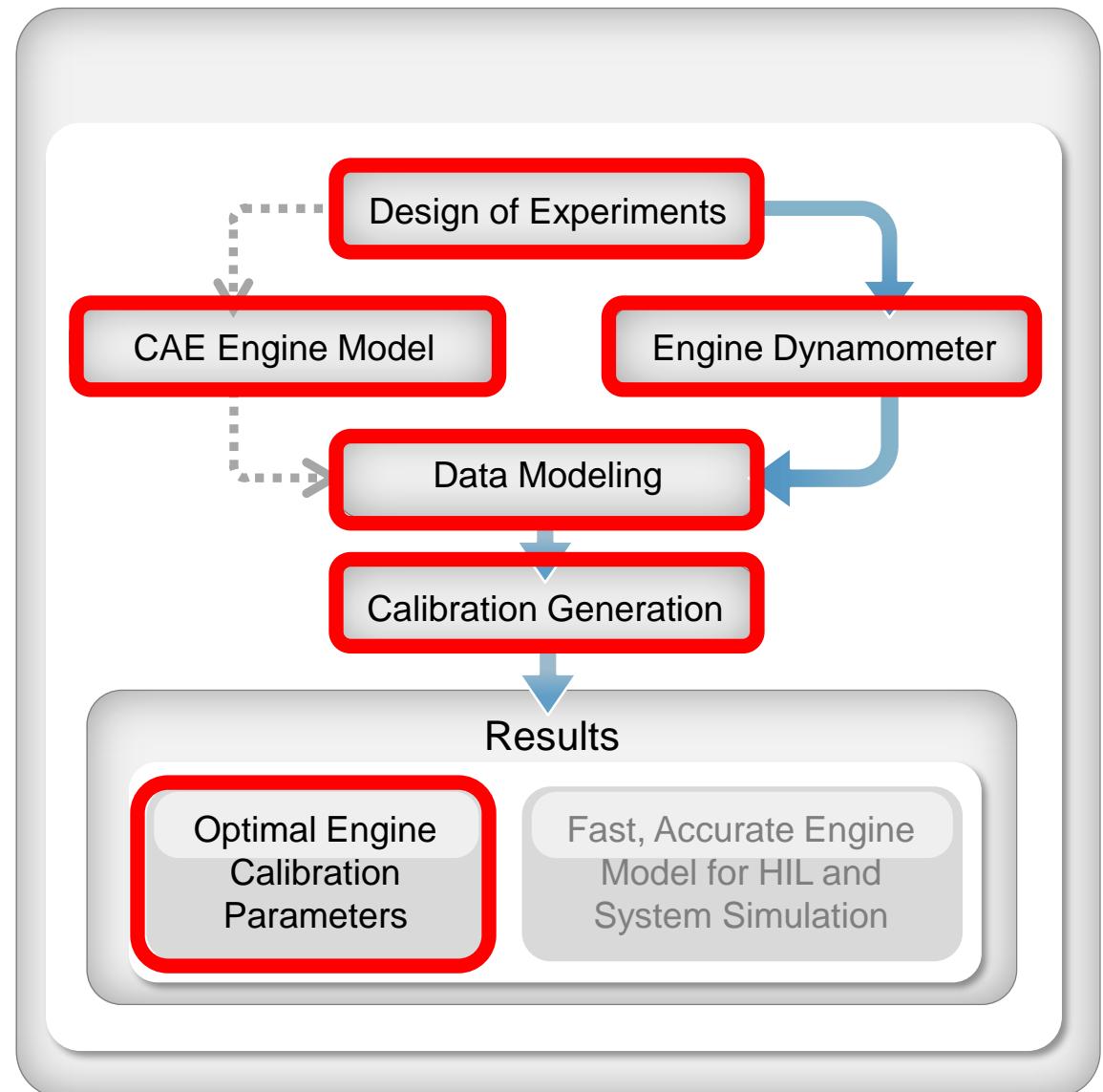
What are we Calibrating?



Calibrating Optimal Base Engine Control Tables

- Workflow

- Model-Based Calibration Toolbox provides tools for the process:
 - Creating the Design of Experiments
 - Gather the data
 - Fitting response surface models (RSM, statistical) to the data
 - Developing optimal base calibration tables
 - Export calibration to controller

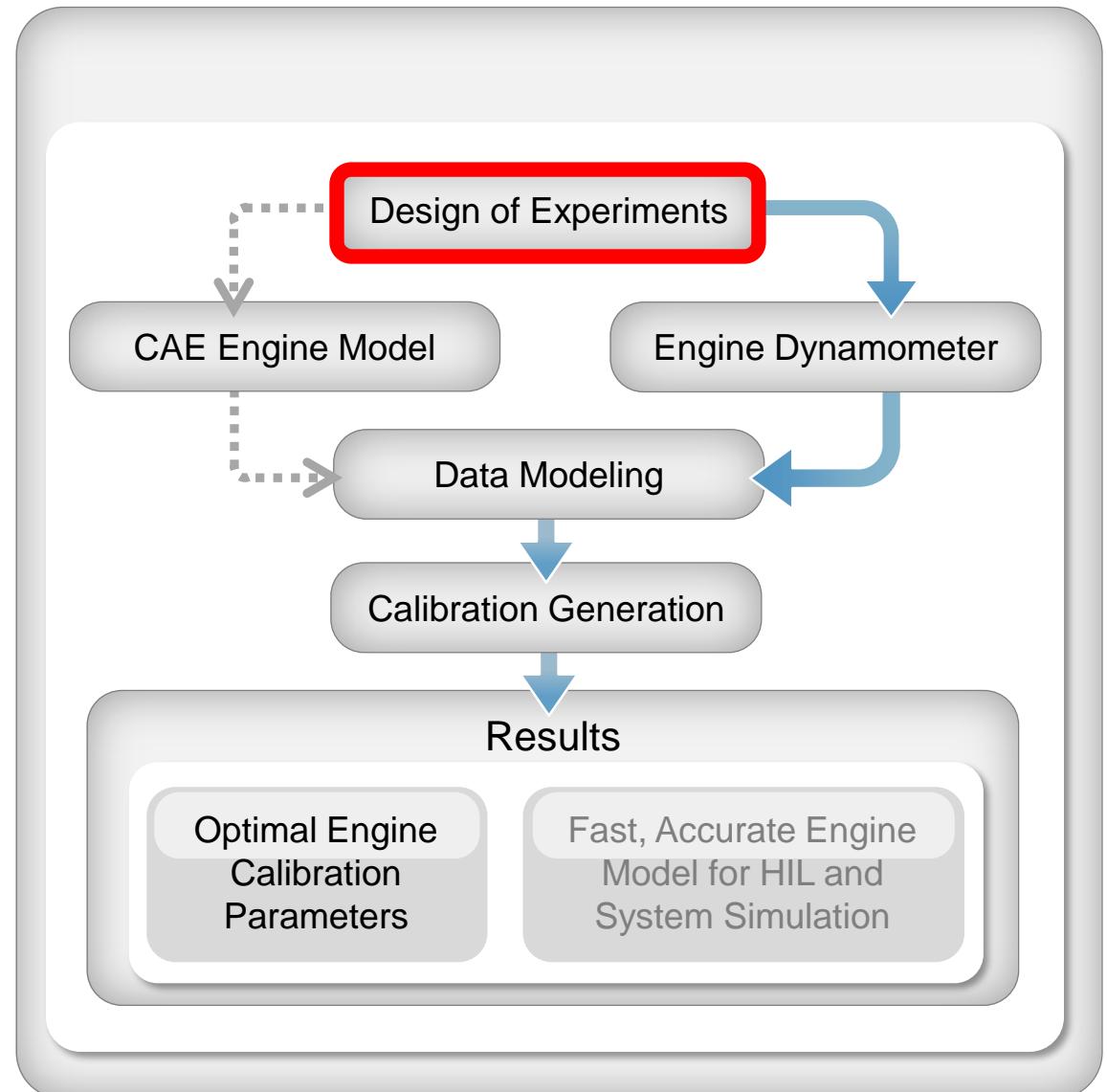


Calibrating Optimal Base Engine Control Tables

- Creating the DoE

- Optimal base engine control calibration workflow:

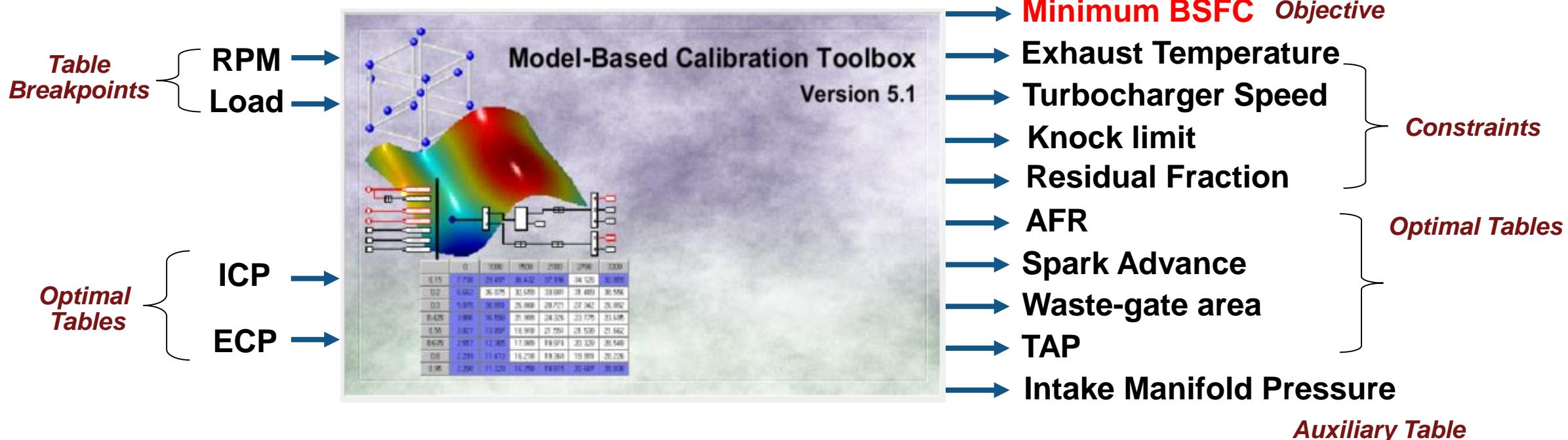
- Creating the Design of Experiments**



Calibrating Optimal Base Engine Control Tables

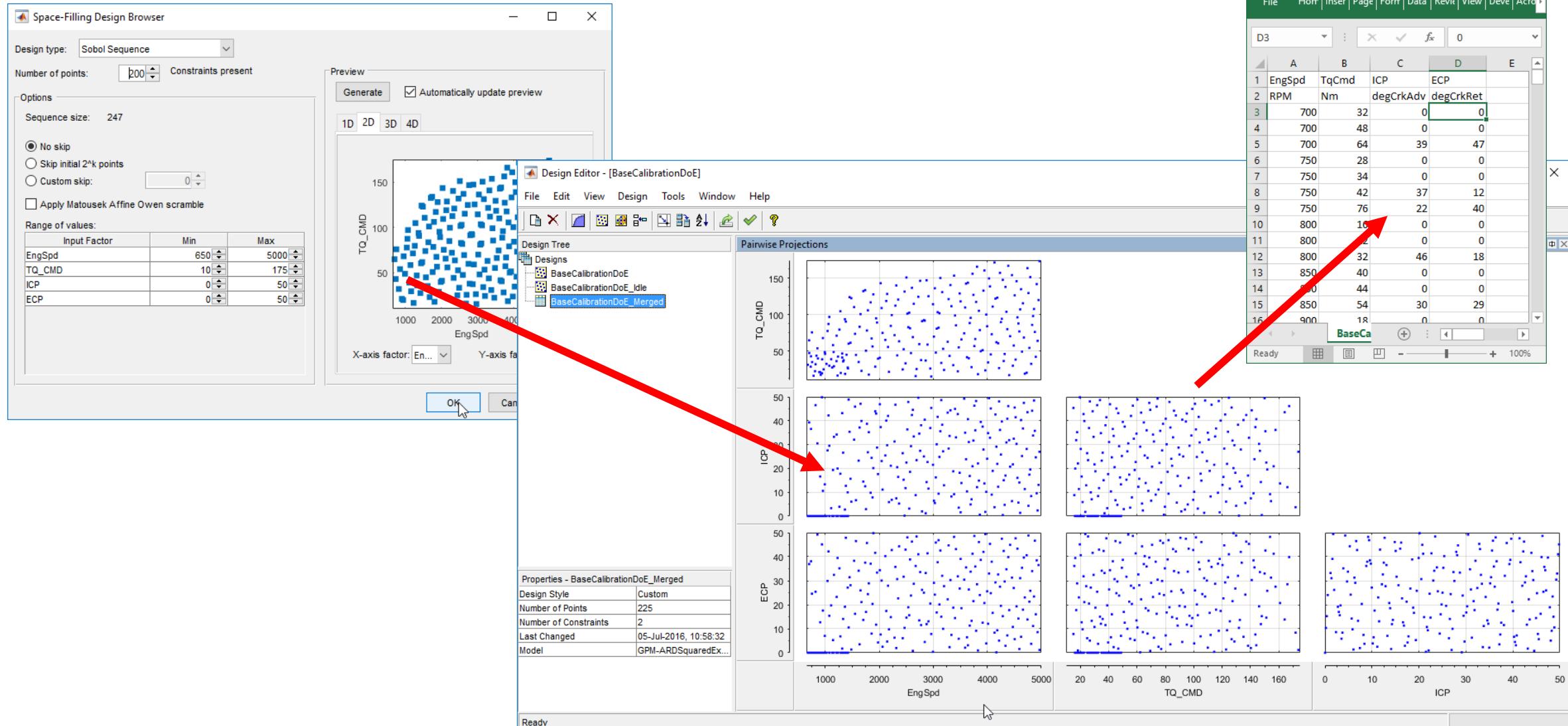
- Creating the DoE

I/O of Turbocharged Direct-Injection 1.5L DOHC Engine Model with Dual-Independent Continuously Variable Cam Phasing



Calibrating Optimal Base Engine Control Tables

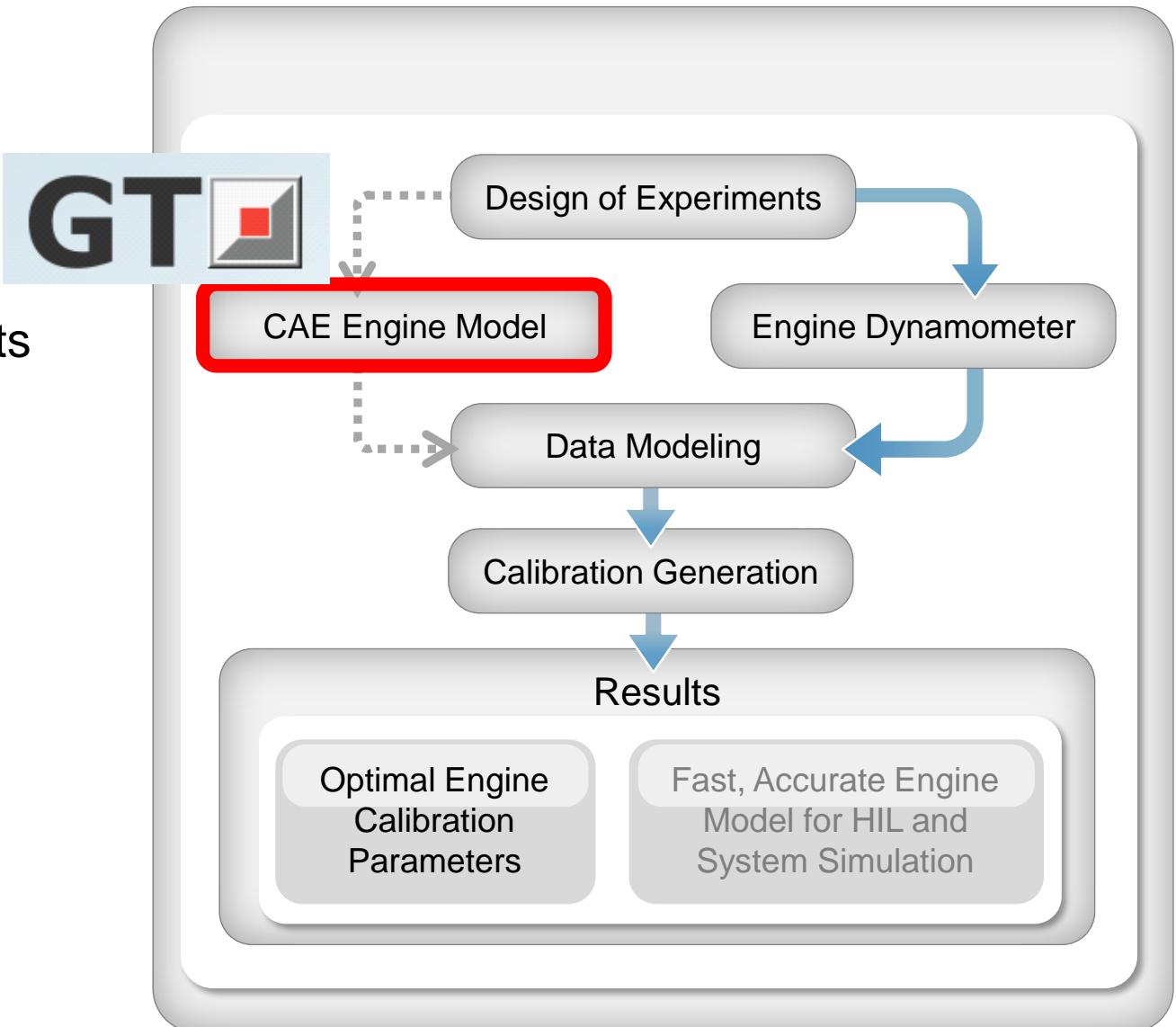
- Creating the DoE



Calibrating Optimal Base Engine Control Tables

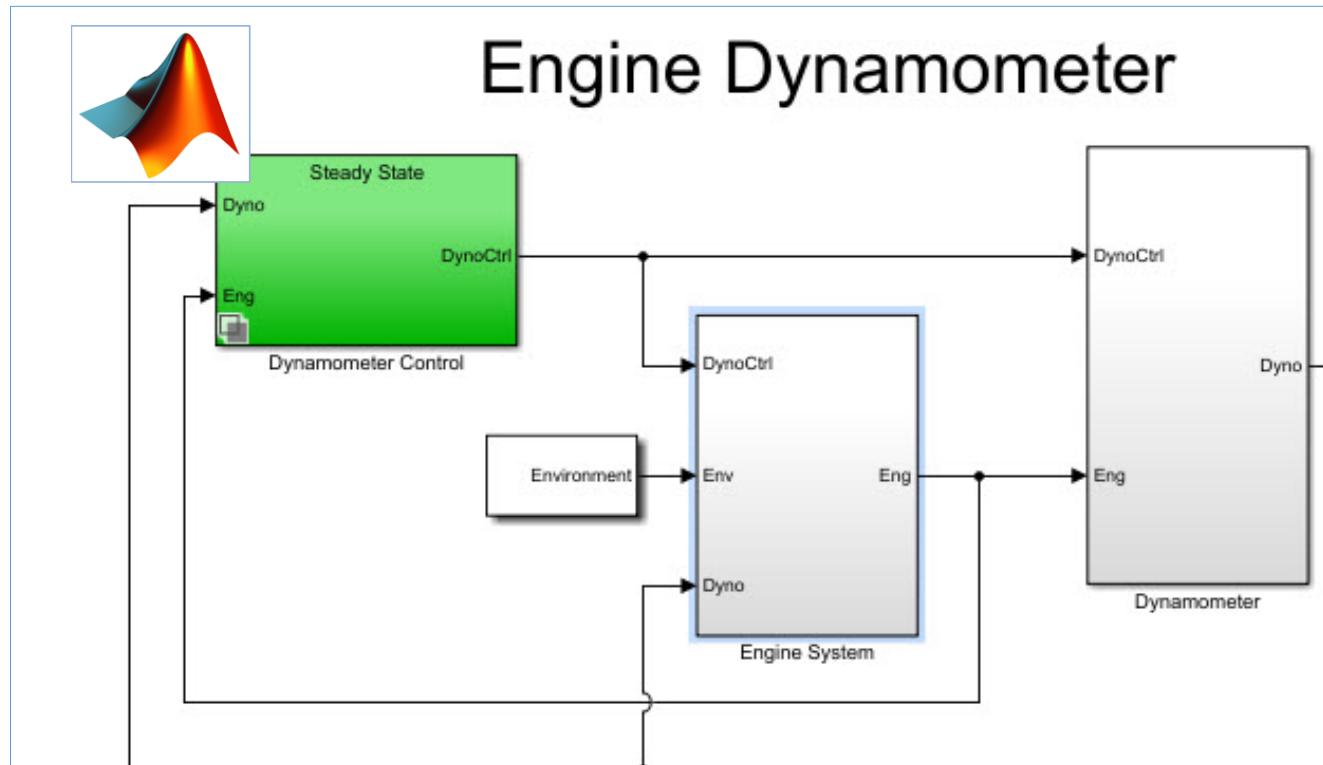
- Gather the data

- Optimal base engine control calibration workflow:
 - Creating the Design of Experiments
 - **Gather the data**



Calibrating an Optimal Base Cal Table

- Get the data “from CAE engine models”

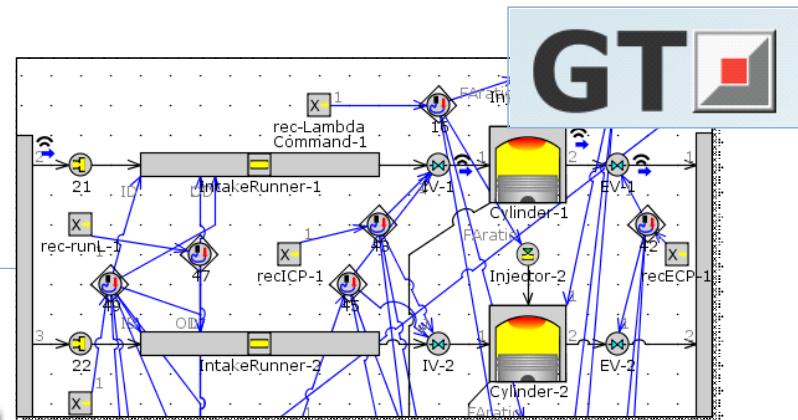


Execute Engine Mapping Experiment

Execute Model Predictive Control Plant Model Experiment

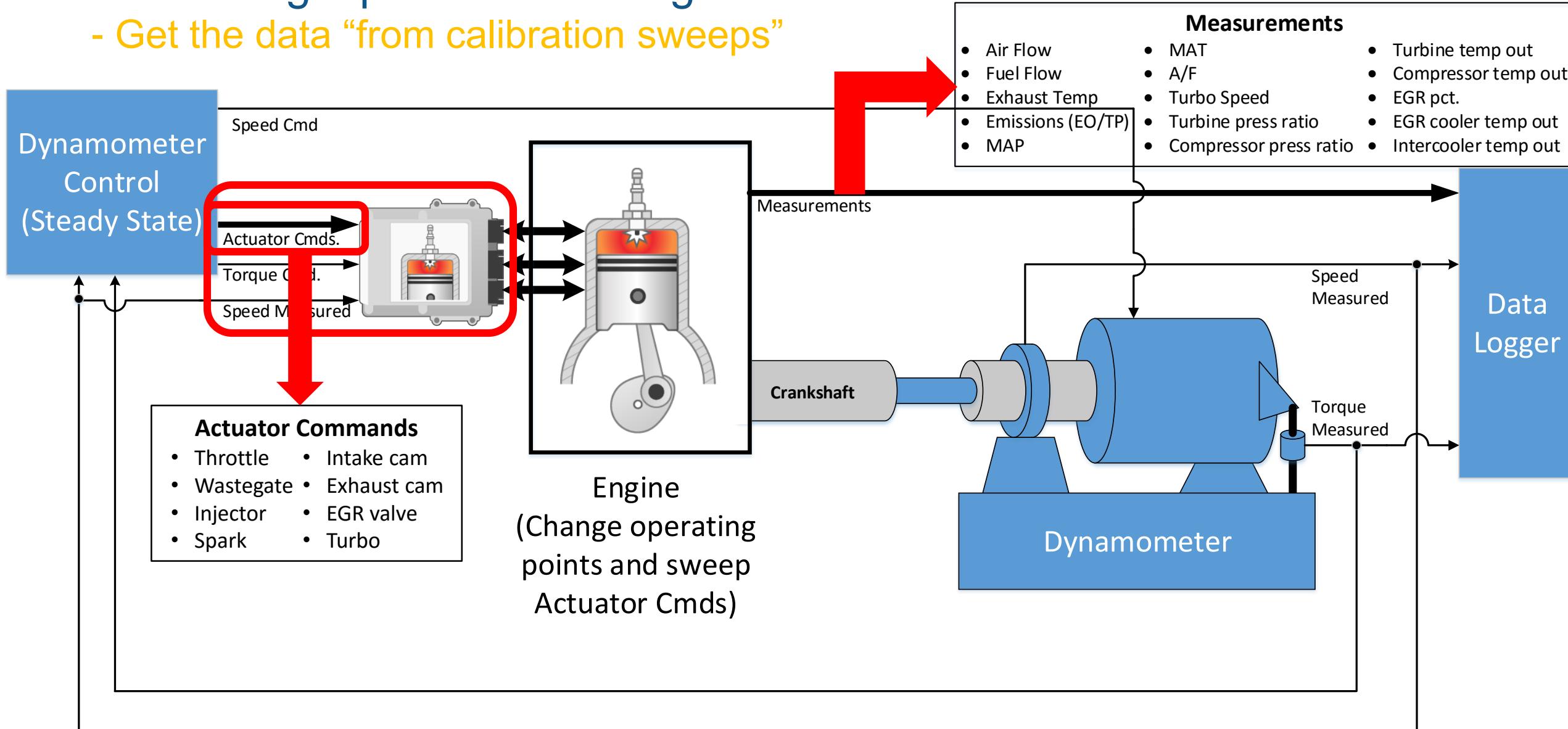
Calibrate Throttle and Wastegate Feedforward Maps

Help



Calibrating Optimal Base Engine Control Tables

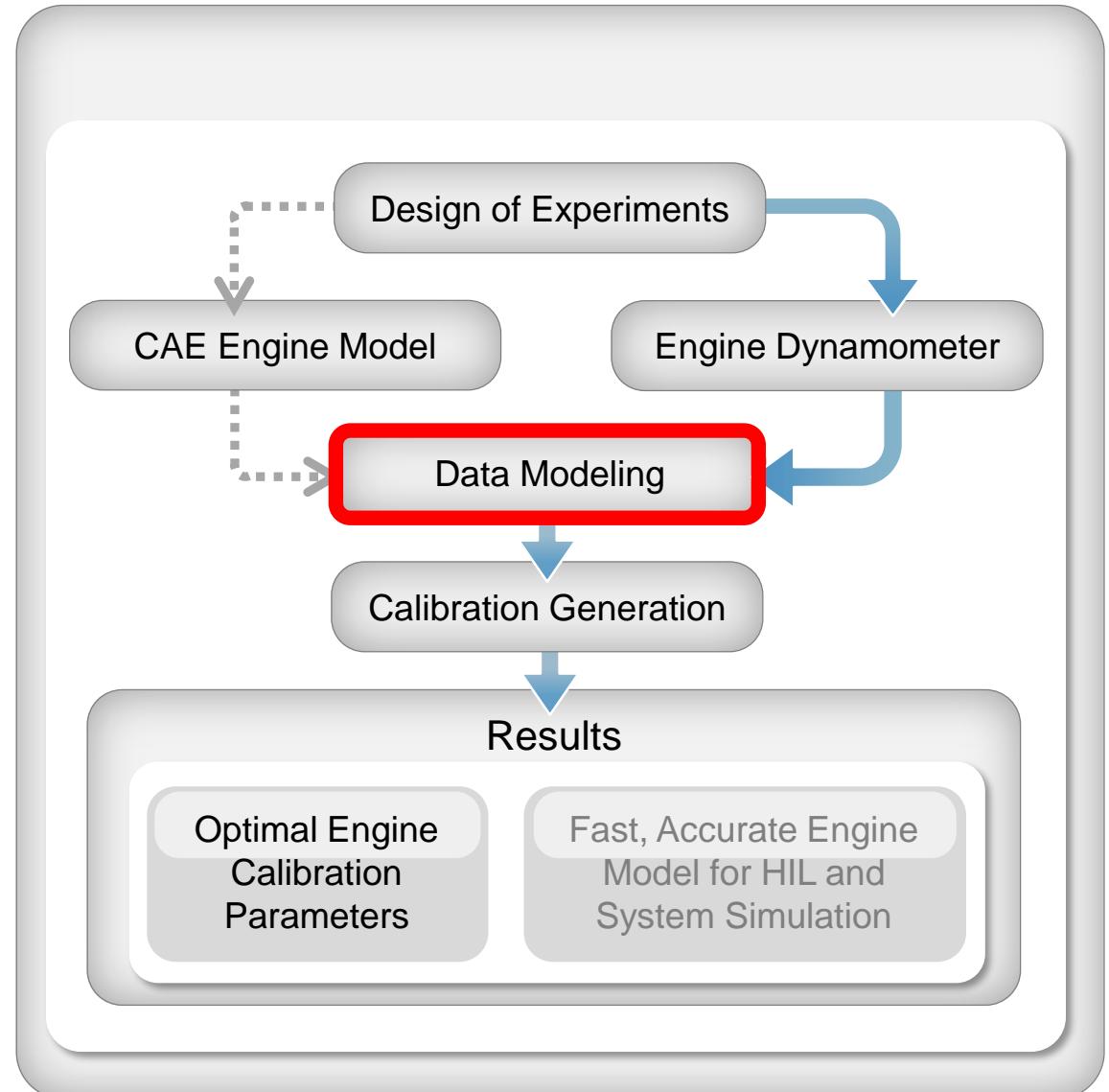
- Get the data “from calibration sweeps”



Calibrating Optimal Base Engine Control Tables

- Fitting response surface models

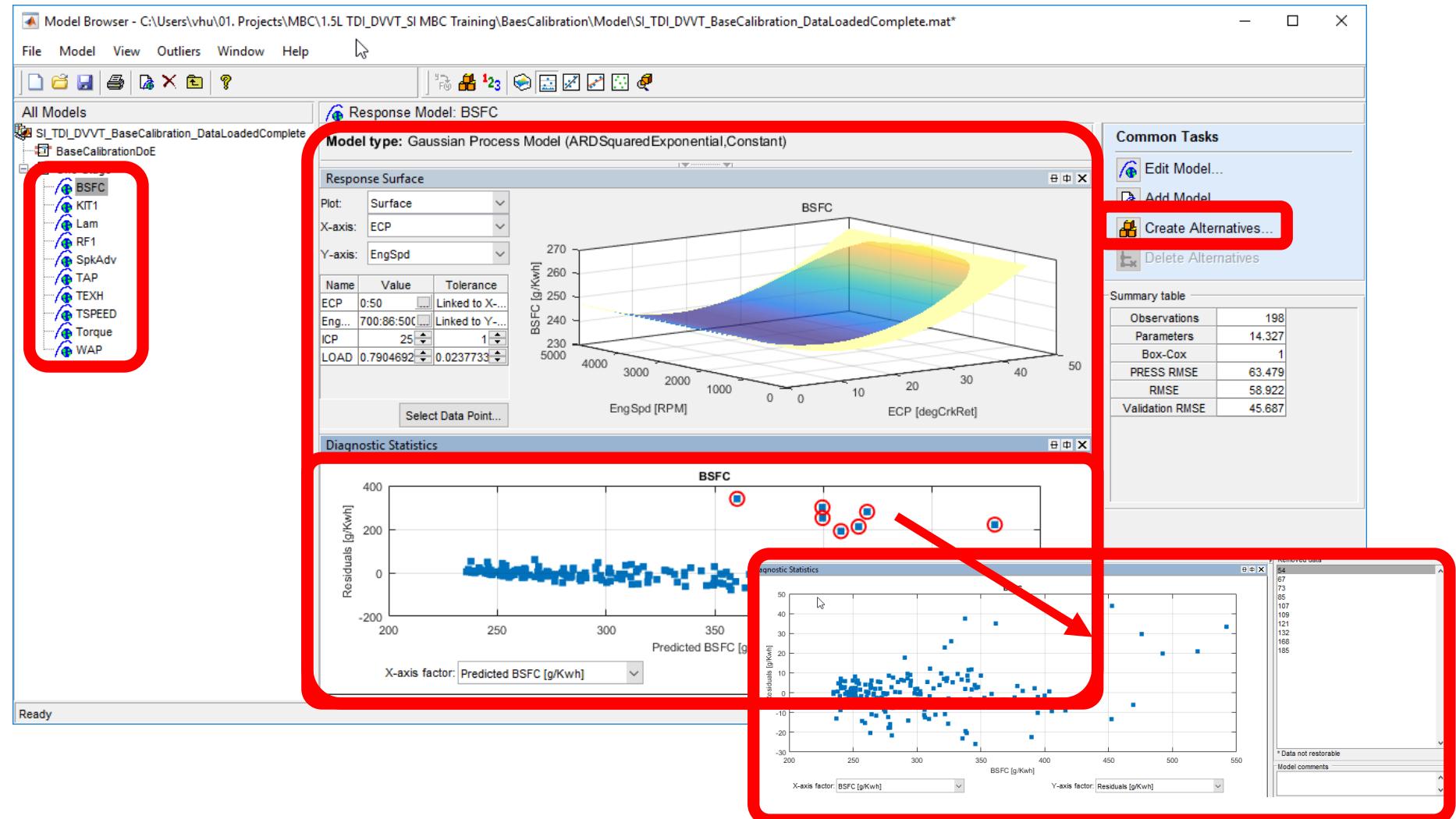
- Optimal base engine control calibration workflow:
 - Creating the Design of Experiments
 - Gather the data
 - **Fitting response surface models (RSM, statistical) to the data**



Calibrating Optimal Base Engine Control Tables

- Generate response surface models from data

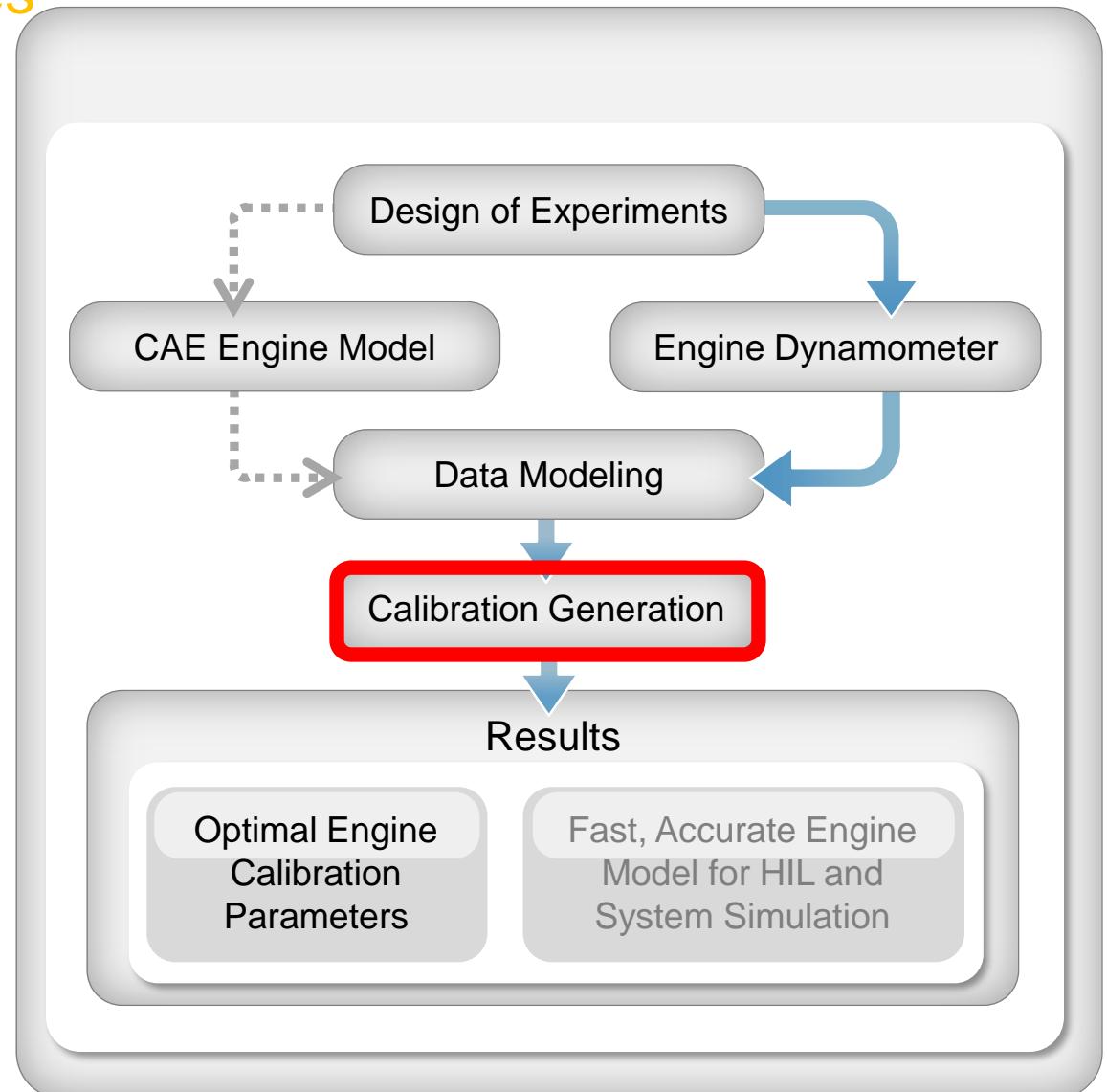
- Default models automatically fitted to all responses
- Inspect quality of fit
- Try out alternatives



Calibrating Optimal Base Engine Control Tables

- Develop optimal base calibration tables

- Optimal base engine control calibration workflow:
 - Creating the Design of Experiments
 - Gather the data
 - Fitting response surface models
 - **Developing optimal base calibration tables from RSMs**



Calibrating Optimal Base Engine Control Tables

- Developing calibration tables

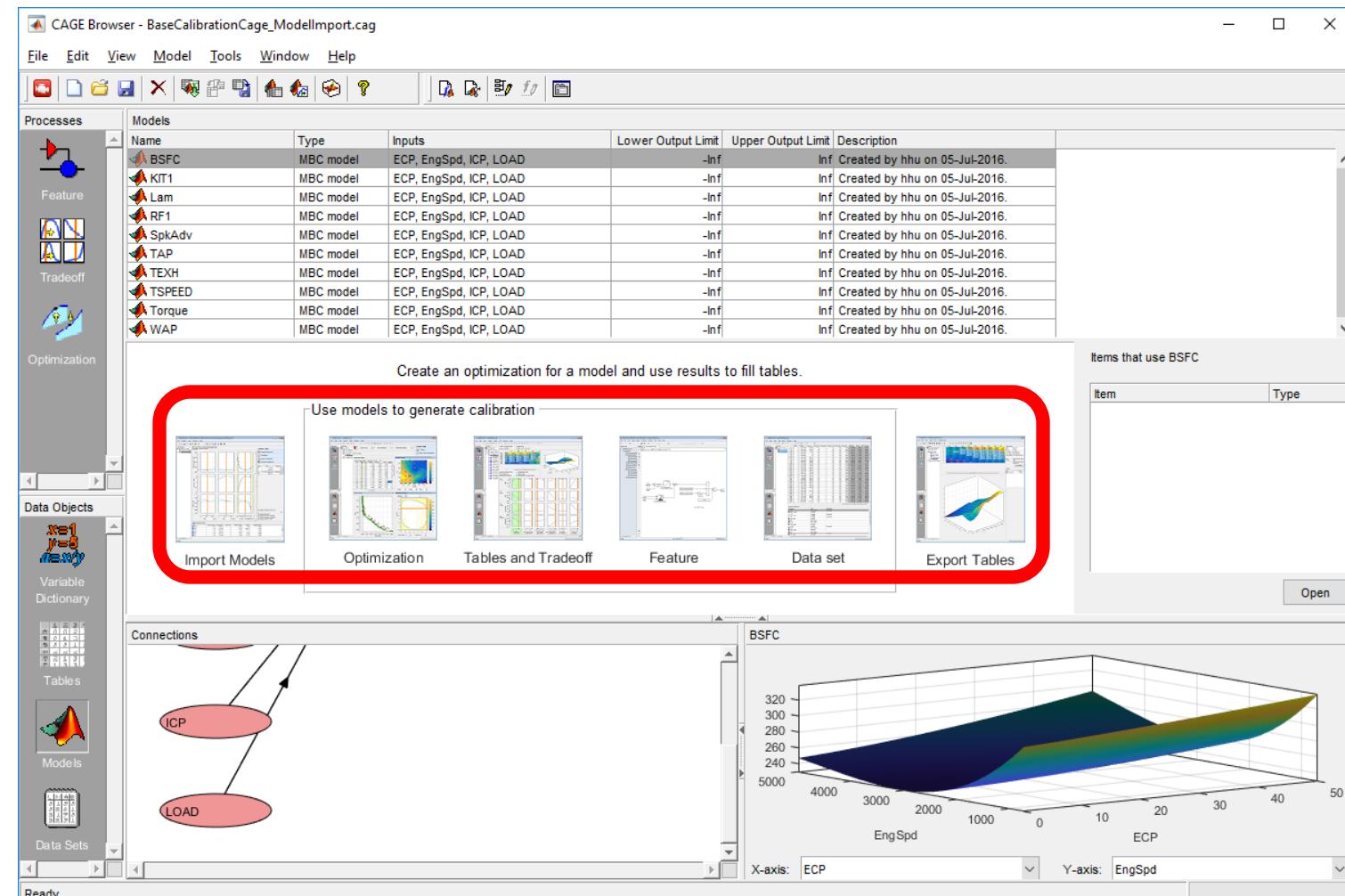
- Import response surface models

- Run optimizations

- Analyze tradeoffs and sensitivity

- Fill tables

- Export cal tables



Calibrating Optimal Base Engine Control Tables

- Developing calibrations from response surface models

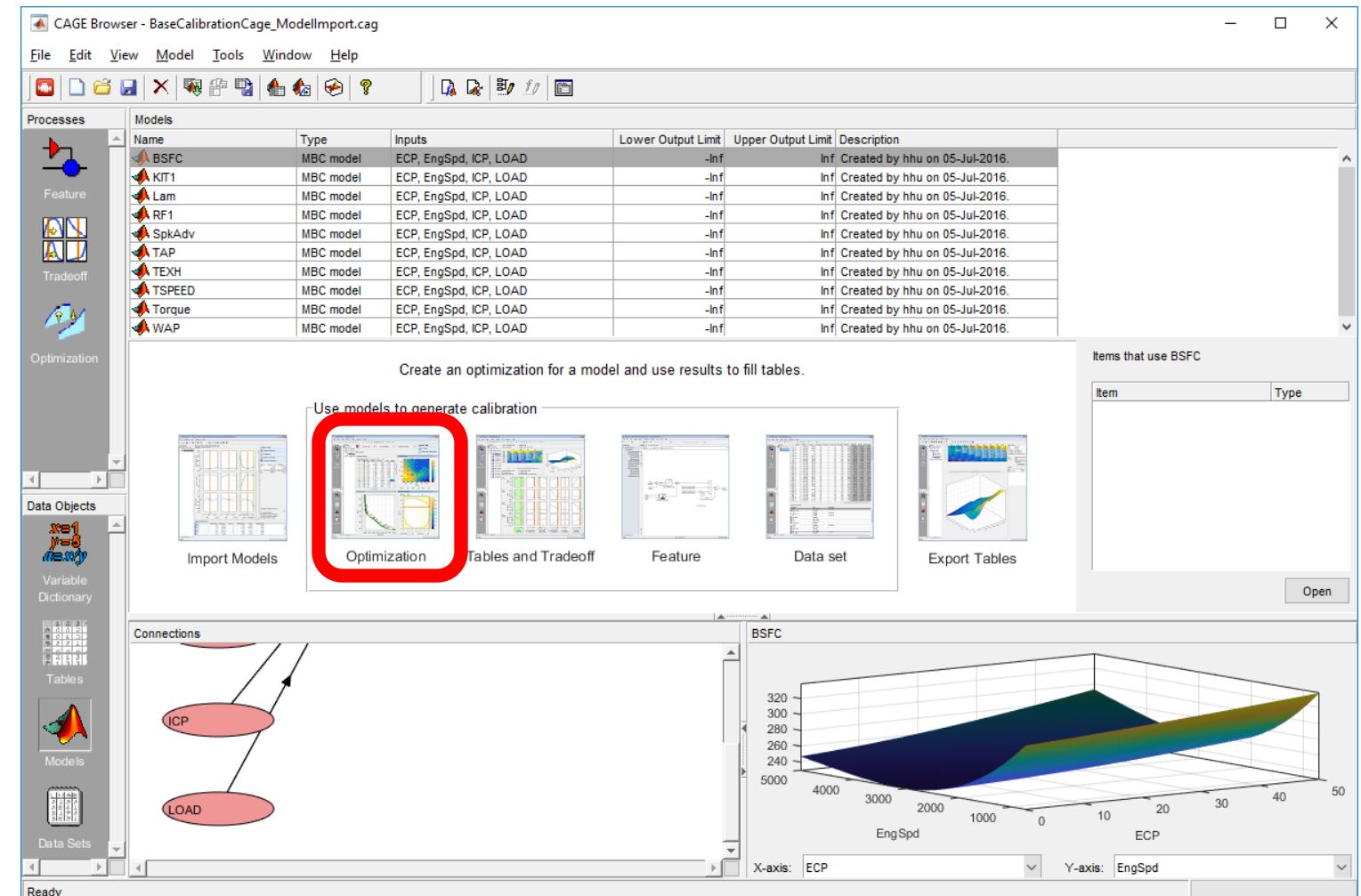
- Import response surface models

Run optimizations

- Analyze tradeoffs and sensitivity

- Fill tables

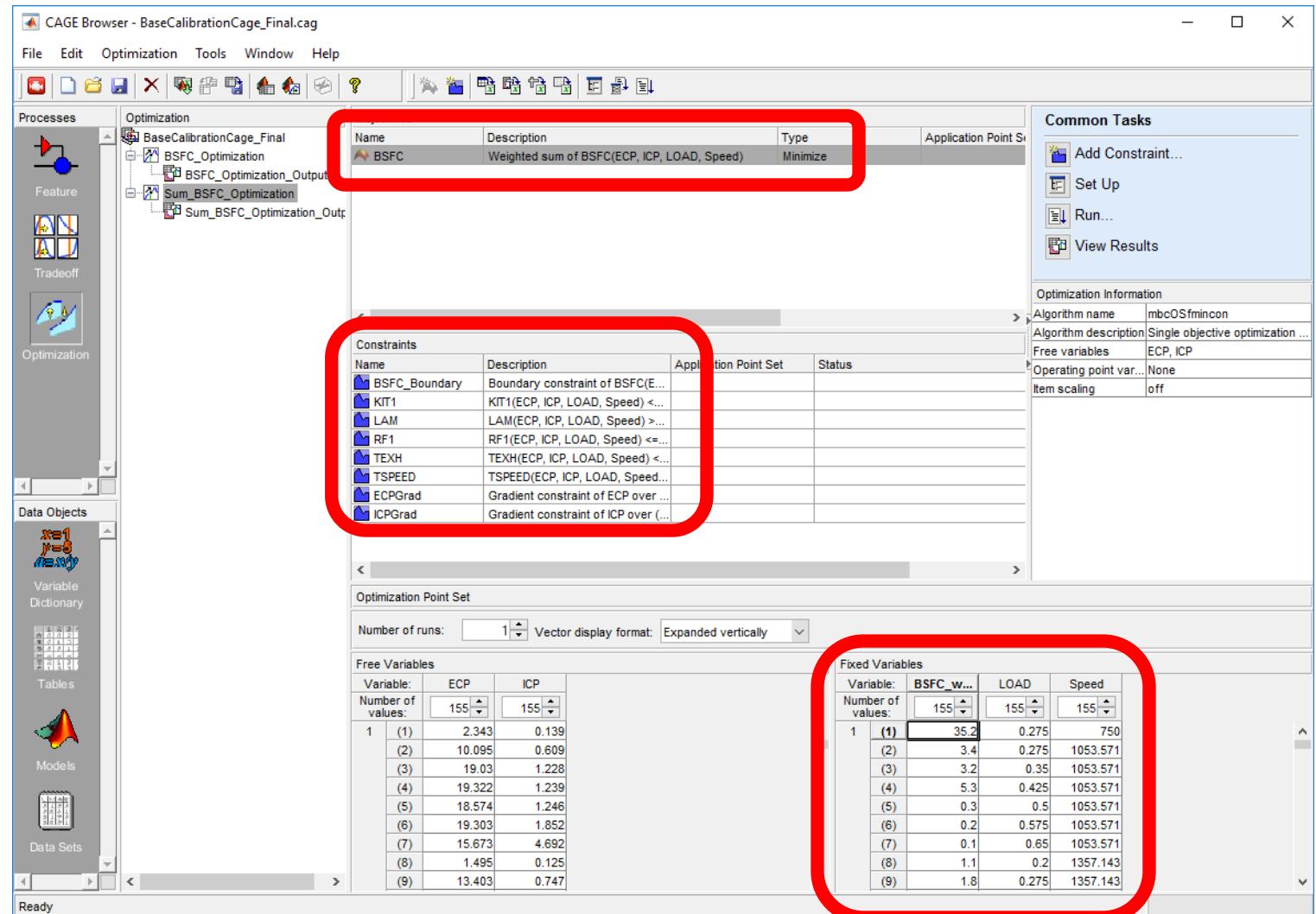
- Export cal tables



Calibrating Optimal Base Engine Control Tables

- Run optimizations

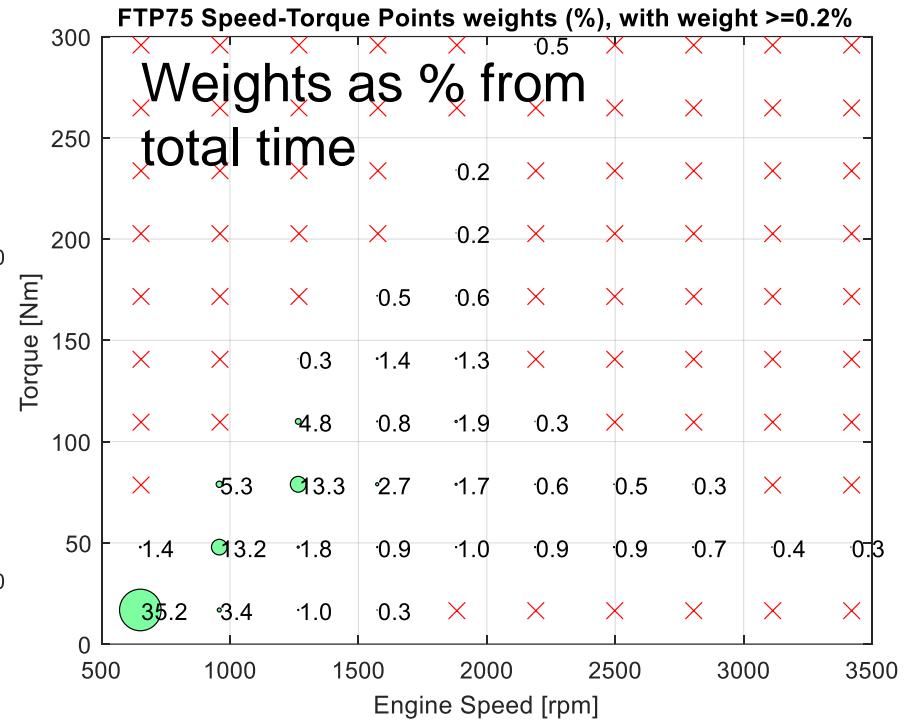
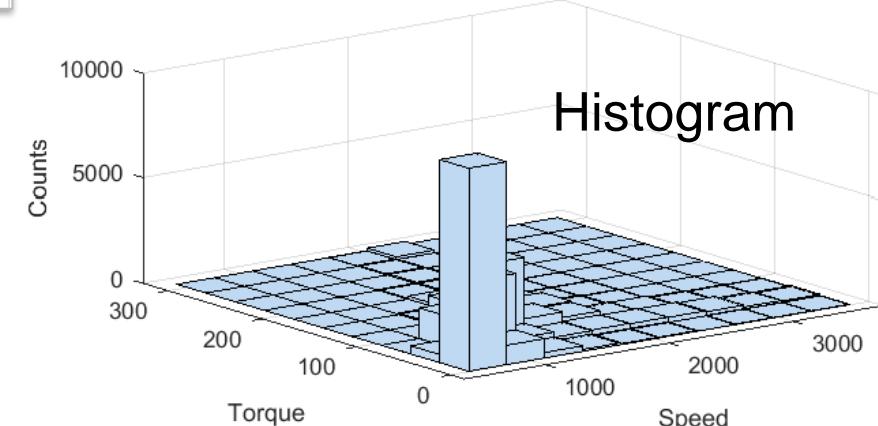
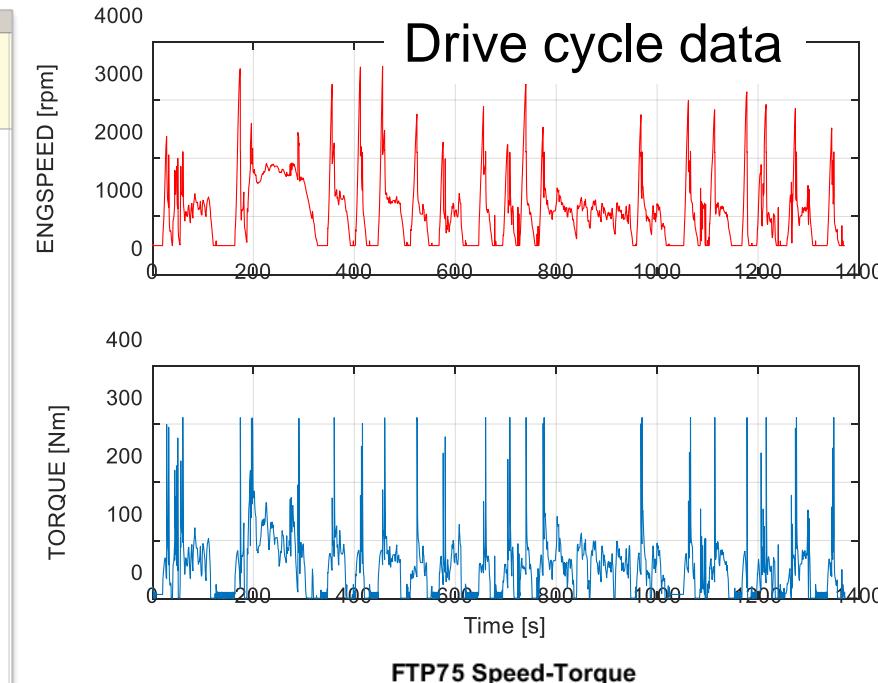
- Define objective
- Define constraints
- Determine operating point weights



How to calculate the weights for a sum optimization

Use MATLAB to calculate weights for a drive cycle

```
AnalyzeDriveCycle.m x + |  
1 %% 総合モード解析の例  
2 % MathWorks Japan, Florin Nae, 20160626  
3  
4 %% DriveCycleの生データを読み込（乗用車のFTP75の例）  
5  
6 [num,txt,raw] = xlsread('DriveCycleData.xlsx');  
7  
8 time = num(:,1);  
9 ENGSPEED = num(:,2);  
10 TORQUE = num(:,3);  
11  
12 %% データの可視化  
13 figure  
14 subplot(2,1,1)  
15 plot(time,ENGSPEED,'-r'),grid on  
16 ylabel('ENGSPEED [rpm]')  
17 subplot(2,1,2)  
18 plot(time,TORQUE),grid on  
19 ylabel('TORQUE [Nm]')  
20 xlabel('Time [s]')
```

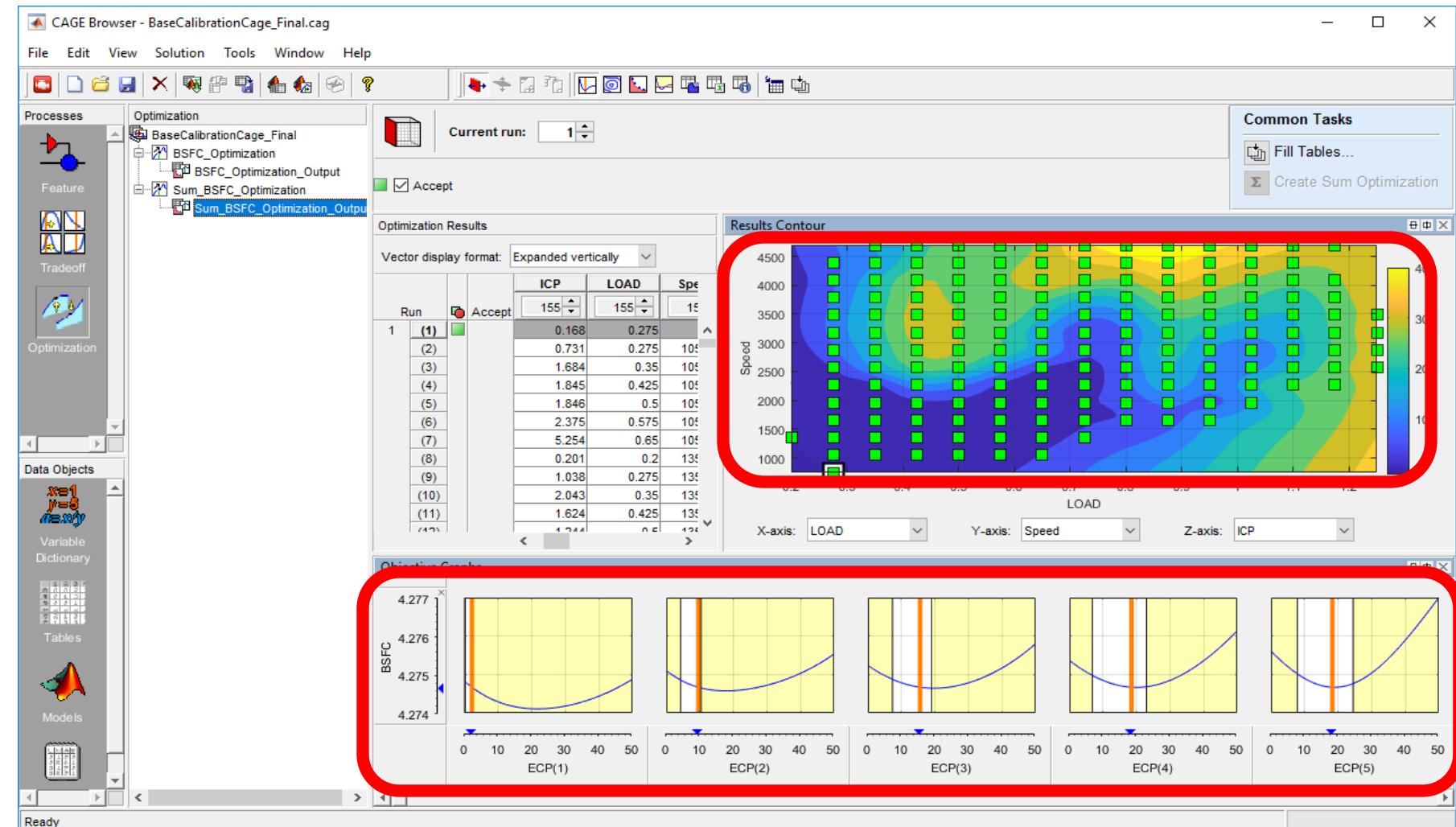



MATLAB program reads measurements from Excel measurement file and calculate weights automatically

Calibrating Optimal Base Engine Control Tables

- Run optimizations

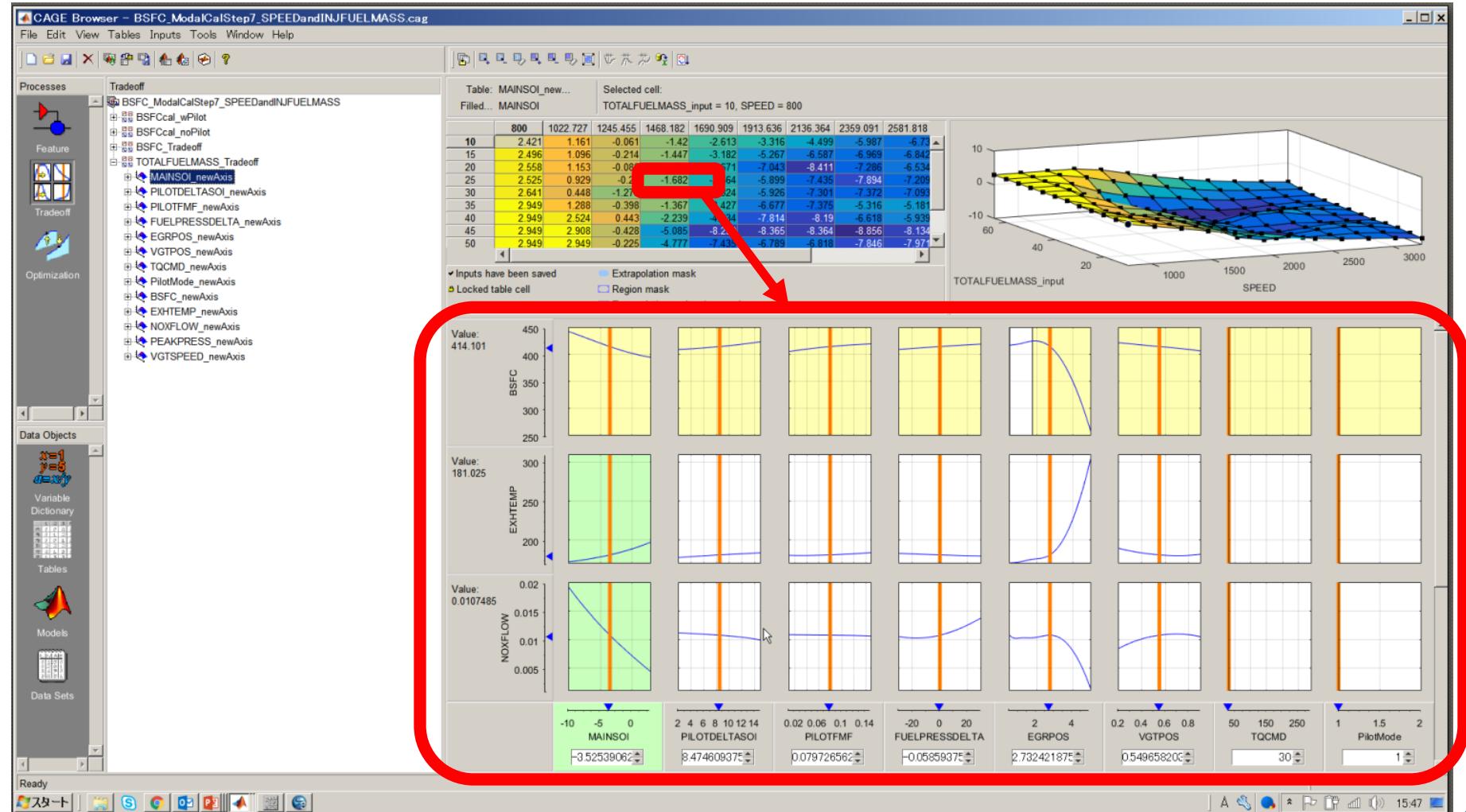
- Evaluate optimization results
- Diagnose optimization convergence issues



Calibrating Optimal Base Engine Control Tables

- Analyze tradeoffs and sensitivity

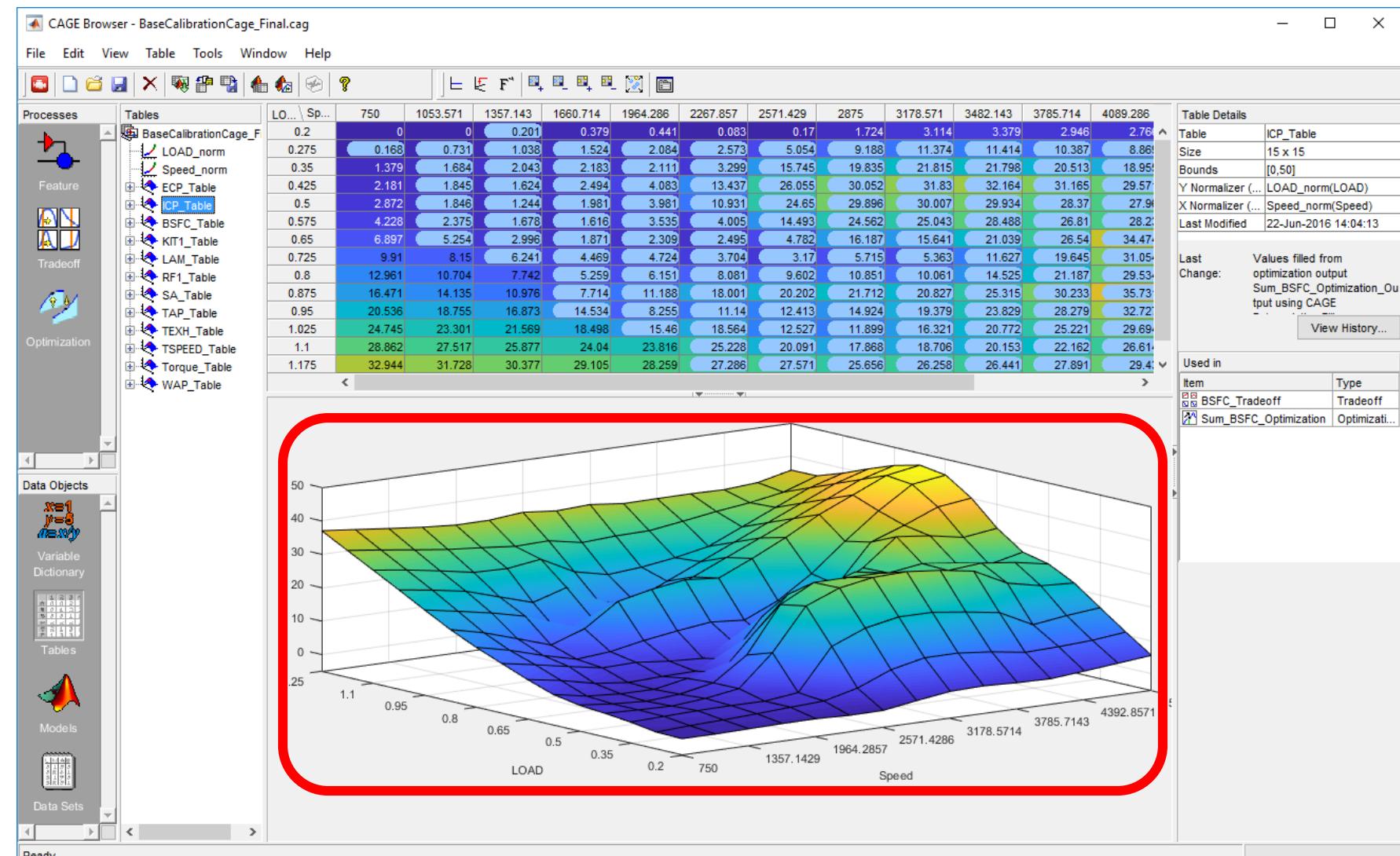
- Evaluate local sensitivity
- Determine if tradeoffs are needed



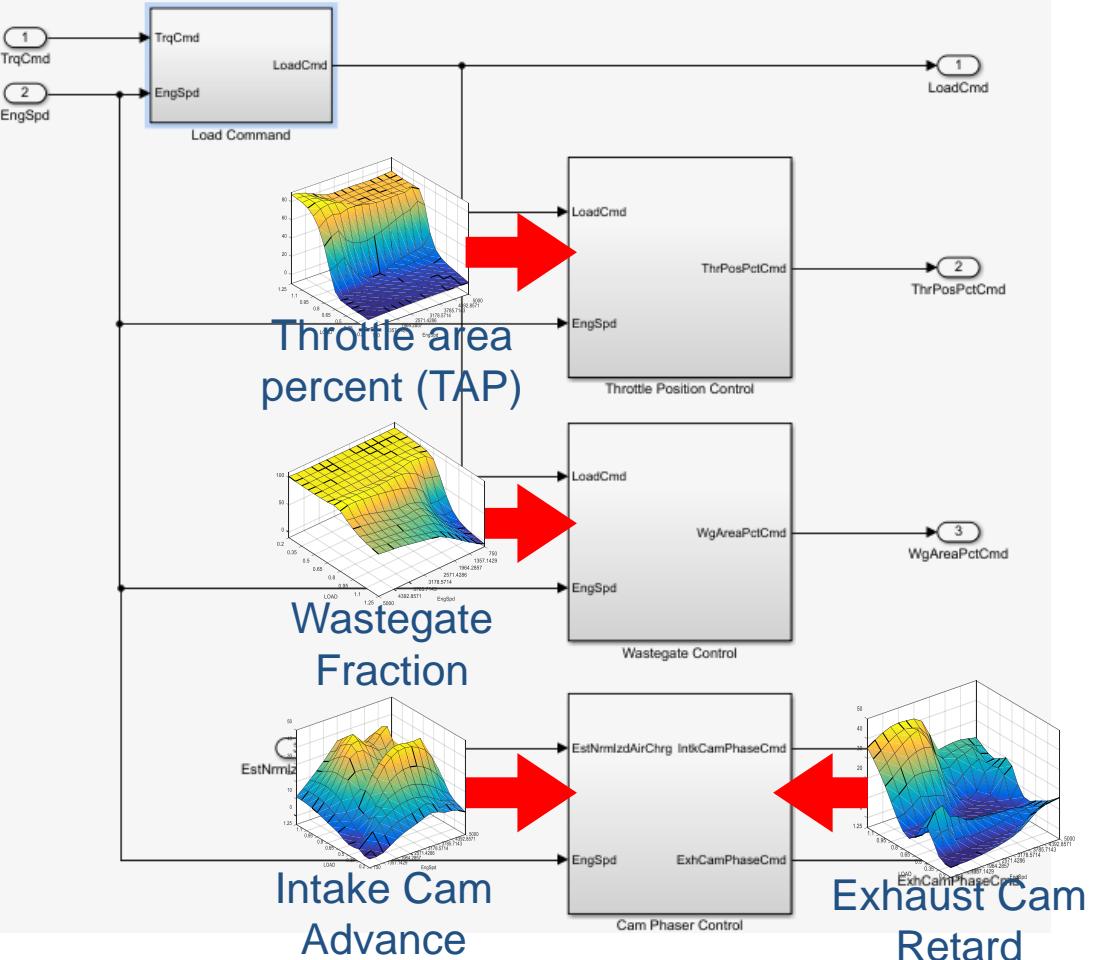
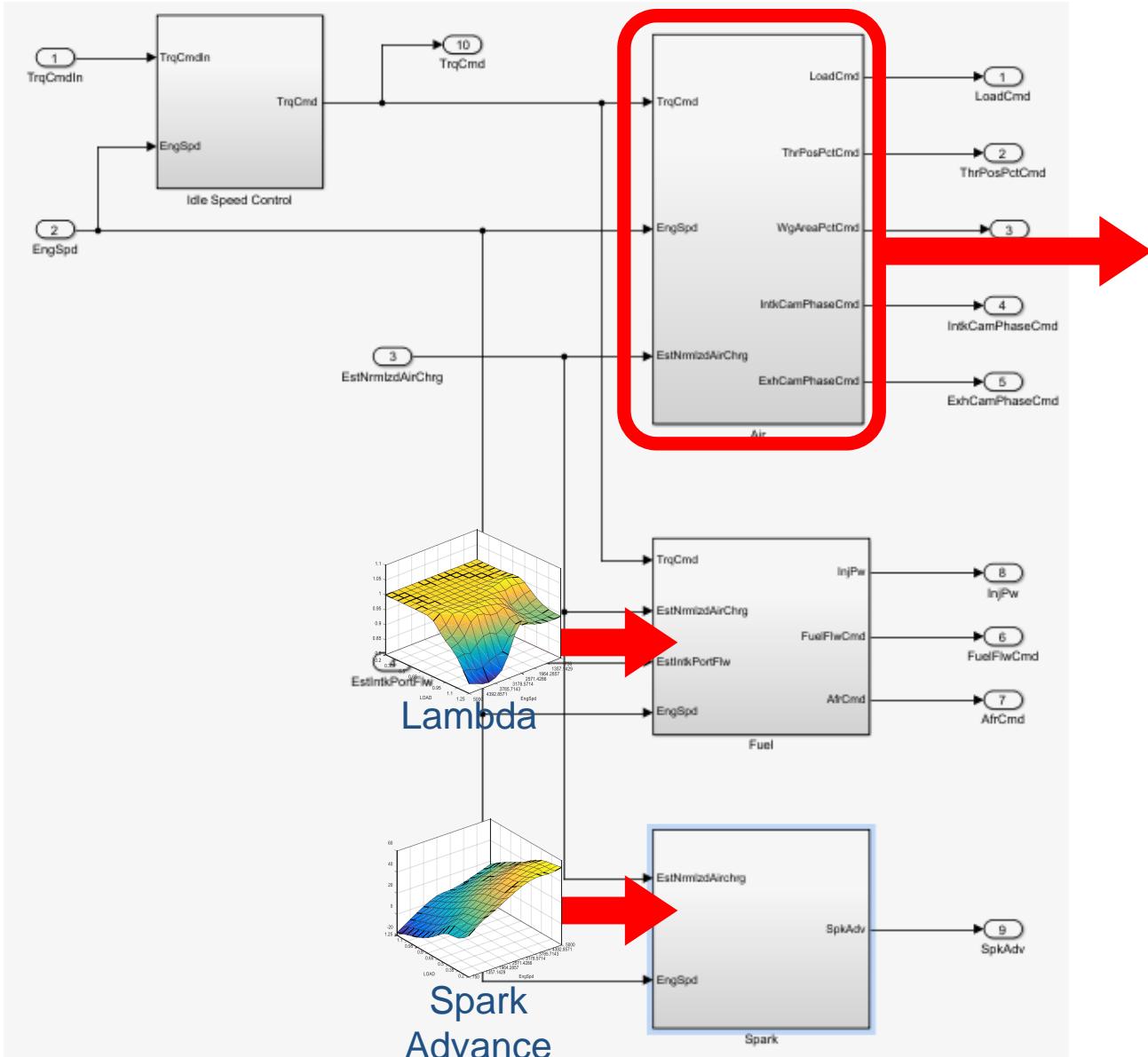
Calibration Generation Tool

- Fill tables

- Inspect surfaces
- Export to MATLAB, Excel or Cal tool

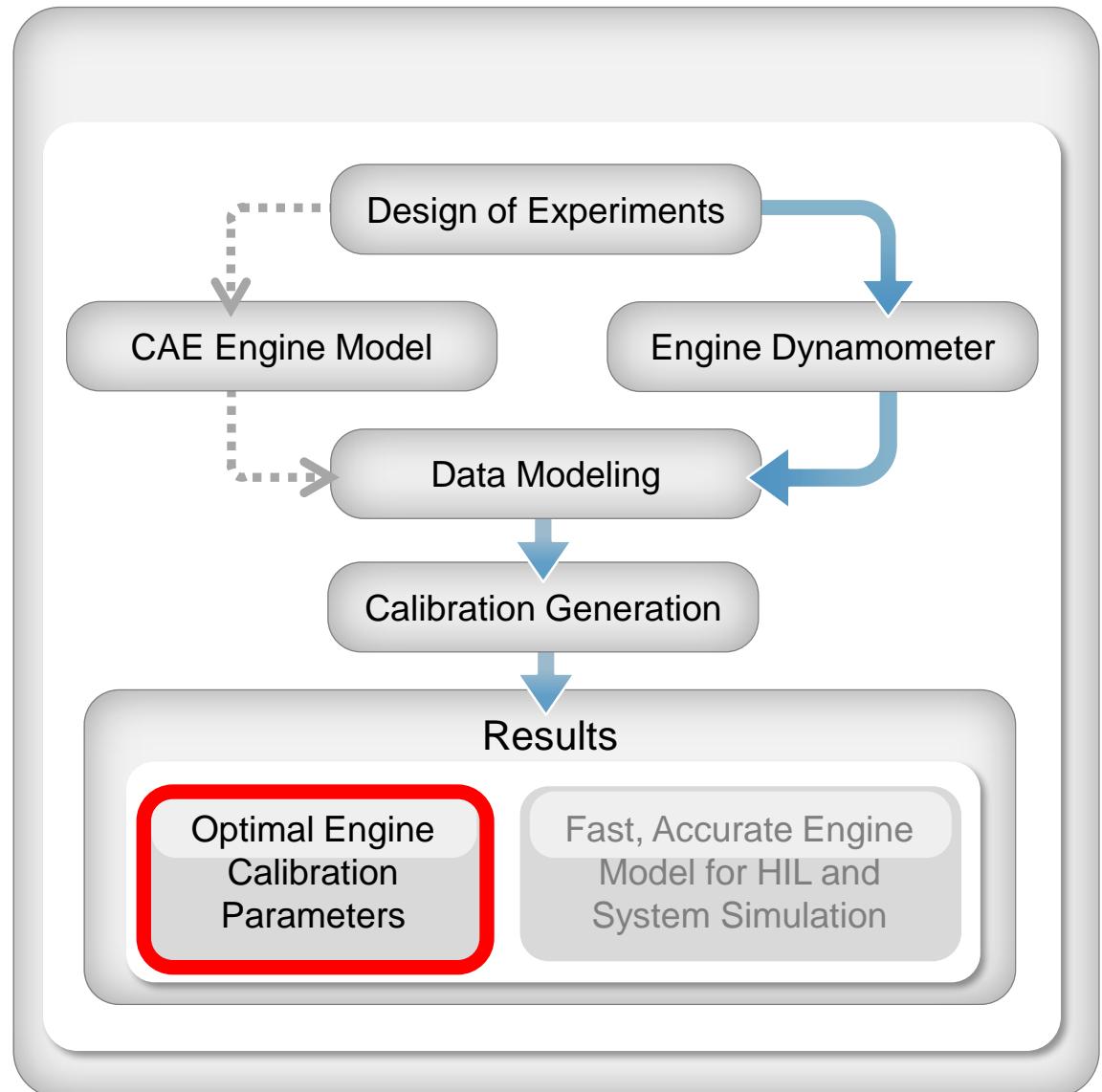
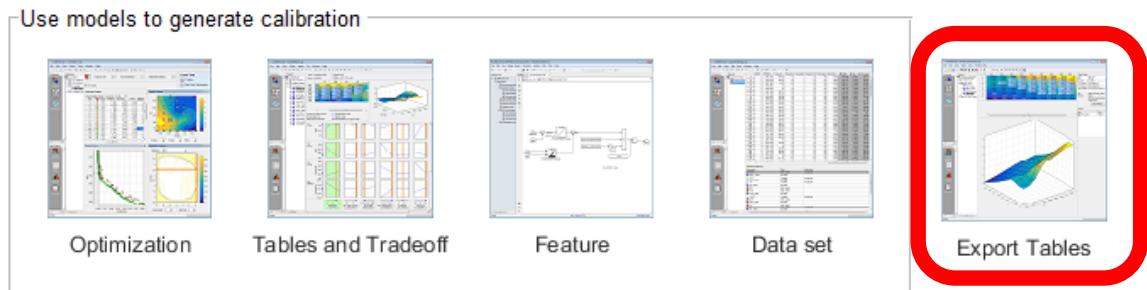


Optimal Base Calibrations Completed

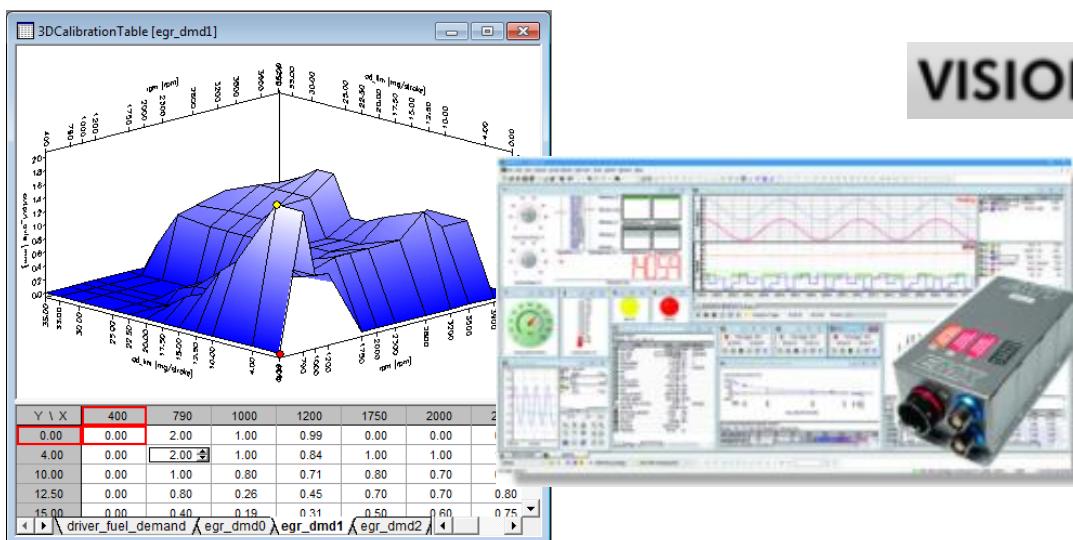
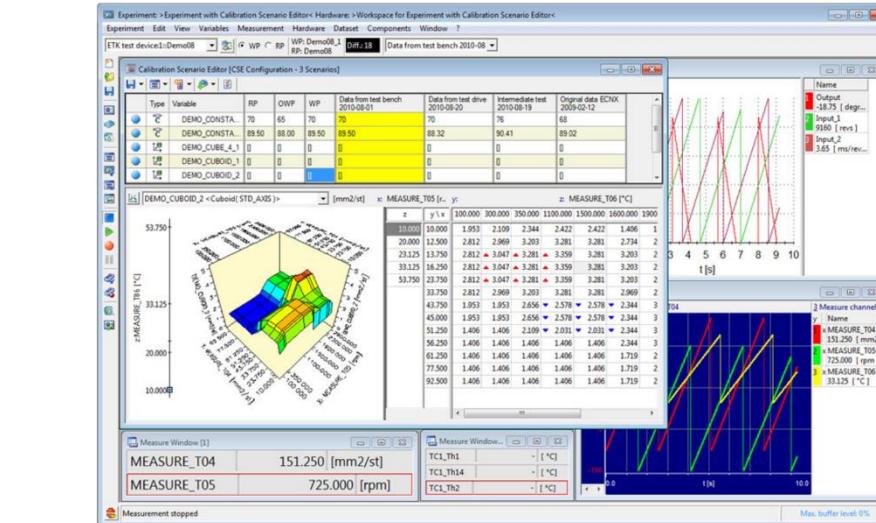
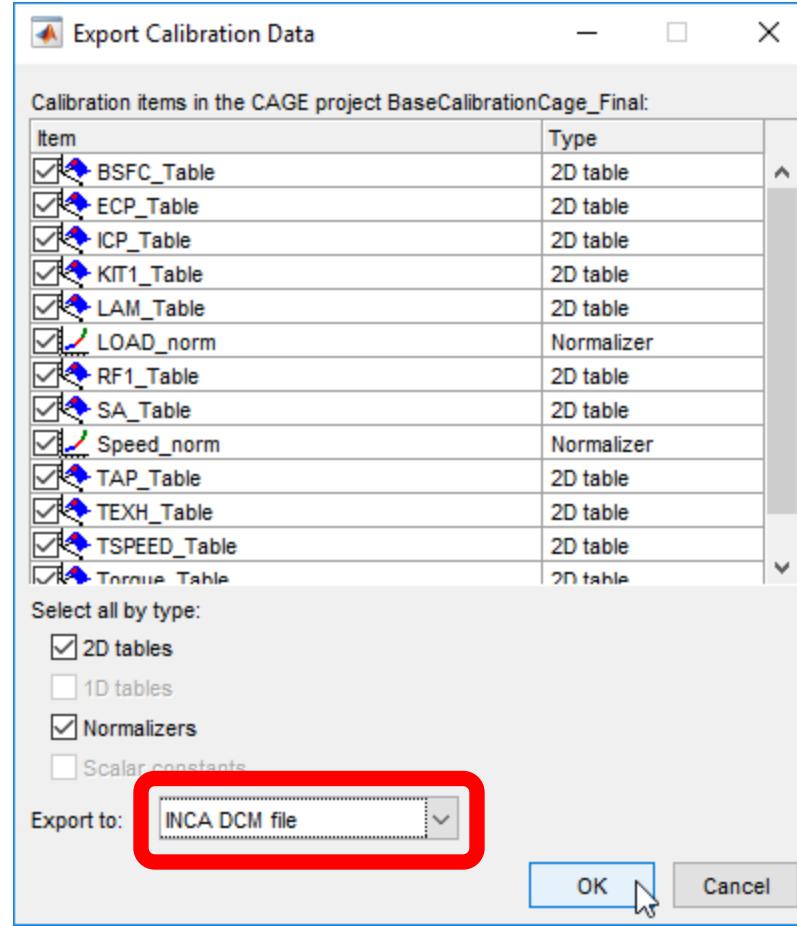


Calibrating Optimal Base Engine Control Tables

- Export and validate the result
- Optimal base engine control calibration workflow:
 - Creating the Design of Experiments
 - Gather the data
 - Fitting response surface models
 - Developing optimal base calibrations
 - **Export calibration to controller**



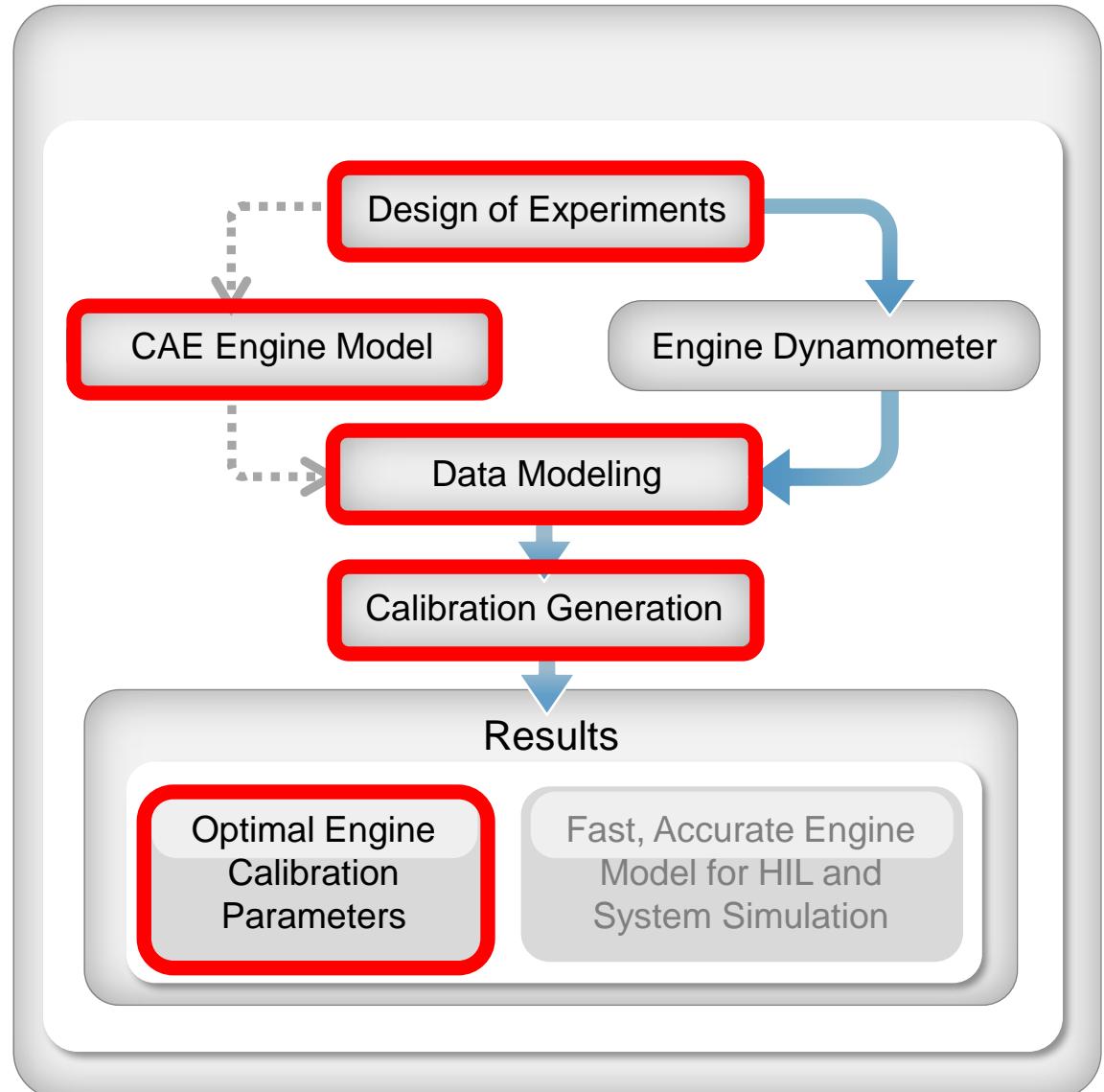
Export Tables to Calibration Tool



Calibrating Optimal Base Engine Control Tables

- Summary

- Optimal base engine control calibration workflow:
 - Creating the Design of Experiments
 - Gather the data
 - Fitting response surface models
 - Developing optimal base calibrations
 - Export calibration to controller



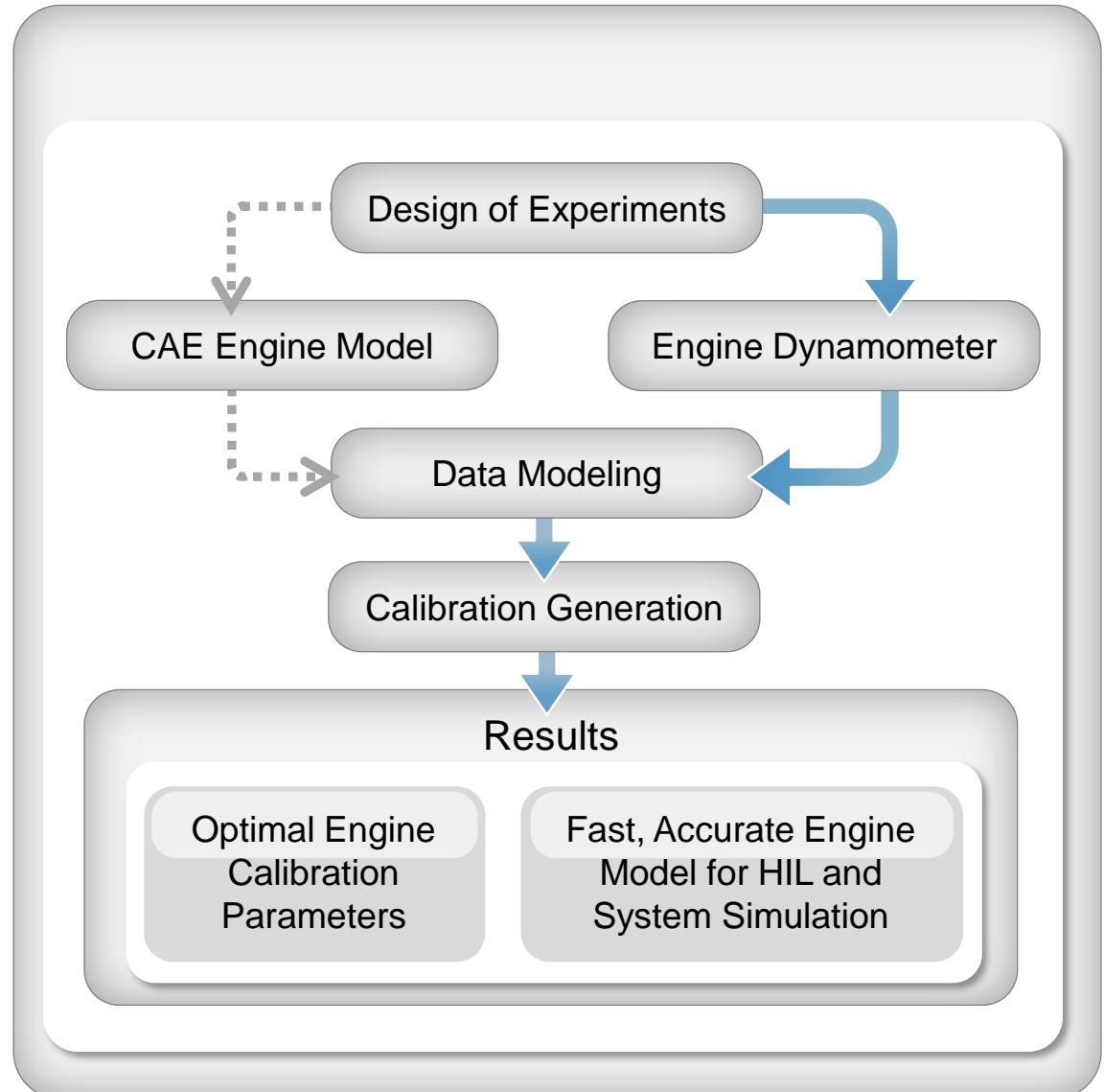
Key Take-Away's

- Engine model parameterization is a very non-trivial task
- Engine controller calibration is a very non-trivial task
- **MathWorks has tools to help make these two tasks more manageable**



Contact us to Learn More

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(brad.hieb@mathworks.com)



Q & A

