

# MATLAB EXPO

효율적인 모델 기반 설계를 위한 최적화 코드 생성  
김학범, MathWorks Korea



# Code Generation Utilized in Various Applications and Industries



The new XC 90 is build on **SPA platform** utilizing Model-Based Design and **AUTOSAR** in Volvo



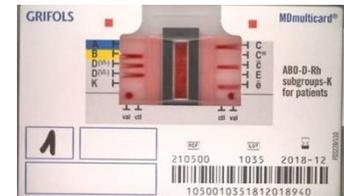
Alenia Aermacchi develops autopilot software for **DO-178B level A** certification



ITK engineering develops **IEC 62304** compliant controller for dental drill motor with MBD

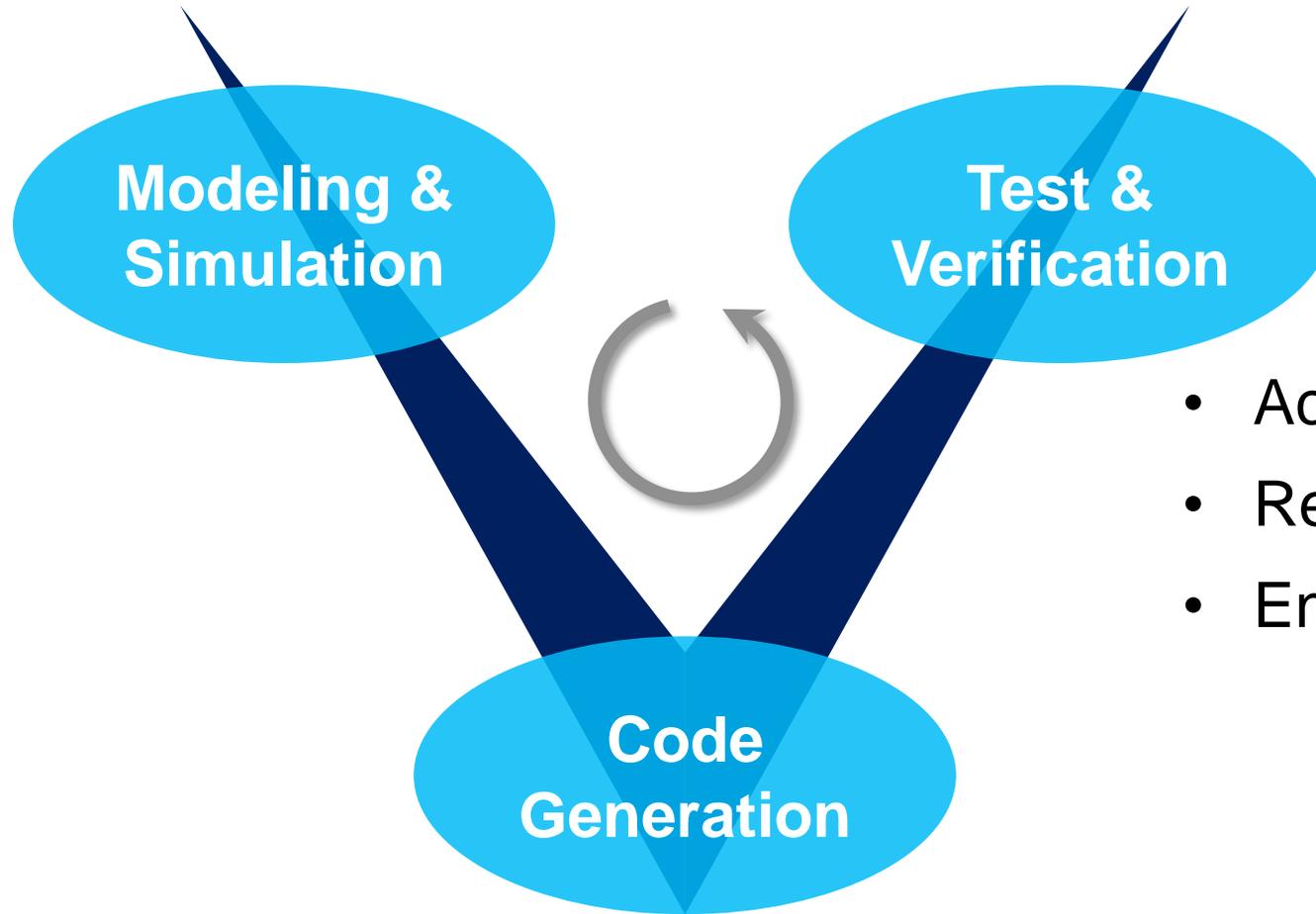


Stem accelerates development of **power electronics control** system with MBD



IDNEO develops embedded **computer vision and machine learning** algorithms for interpreting blood type results

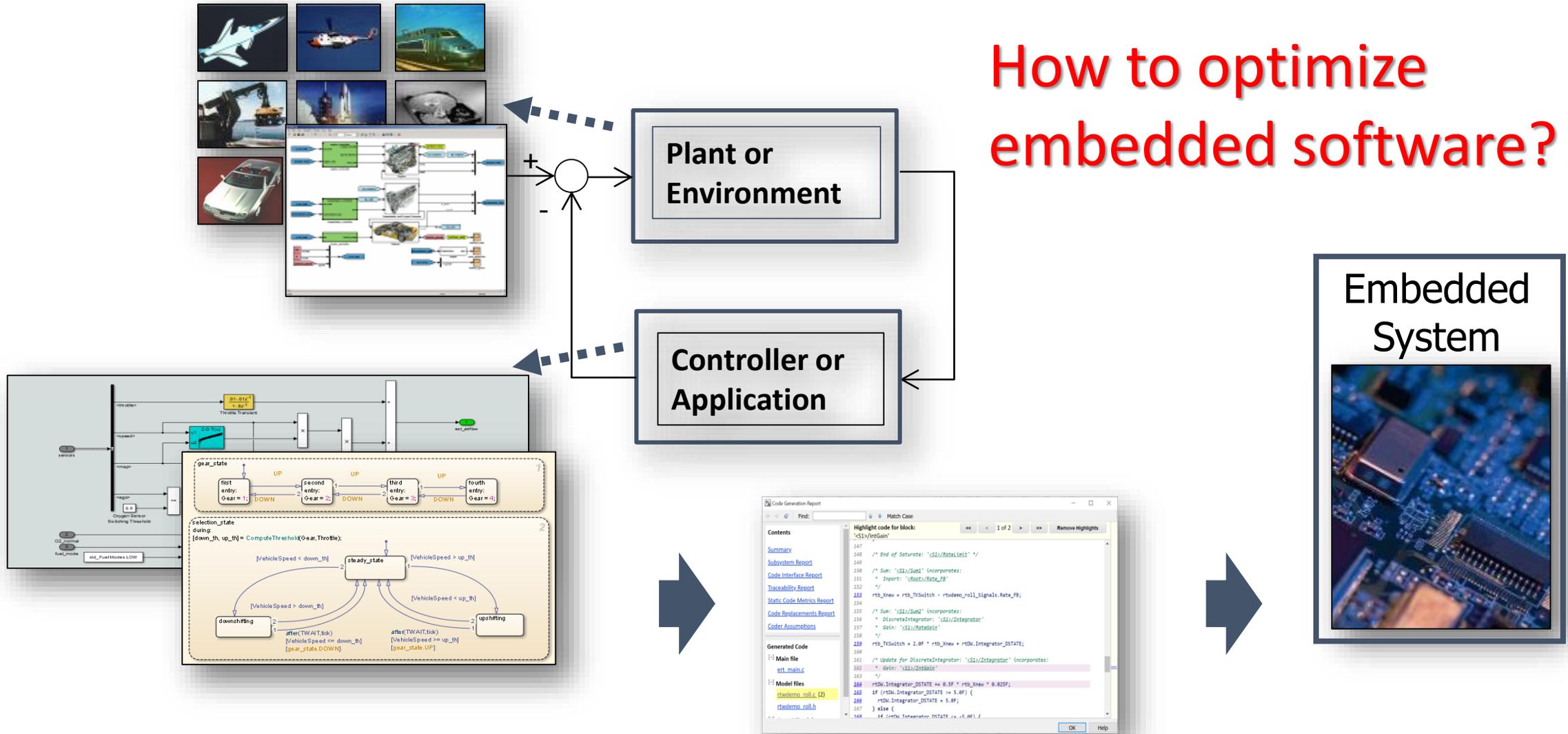
# Code Generation Connects Model-Based Design Workflows



- Accelerate development process
- Reduce translation error
- Enable rapid iterative workflows

# Design an Embedded Controller

How to optimize embedded software?



# Approach to Code Efficiency with Model-Based Design

## Model Analysis

- Model level & Algorithm level analysis
- Application-aware optimizations (modeling pattern)

## Code Generation

- Implementation level analysis
- Target-aware optimizations (resources)



# Static Code Metrics Report

**1. File Information [hide]**

[ - ] Summary (excludes ert\_main.c)

Number of .c files : 2  
Number of .h files : 4  
Lines of code : 213  
Lines : 558

[ - ] File details

File Name	Lines of Code	Lines	Generated On
rtwtypes.h	81	152	06/04/2020 9:44 AM
CodeMetrics.h	58	135	06/04/2020 3:22 PM
CodeMetrics.c	54	153	06/04/2020 3:22 PM
CodeMetrics_data.c	10	57	06/04/2020 3:22 PM
CodeMetrics_types.h	6	35	06/04/2020 3:22 PM
CodeMetrics_private.h	4	26	06/04/2020 3:22 PM

**2. Global Variables [hide]**

Global variables defined in the generated code.

Global Variable	Size (bytes)	Reads / Writes	Reads / Writes in a Function
[+] CodeMetrics_P	20	6	6
[+] CodeMetrics_B	16	21	20
[+] CodeMetrics_U	8	15	14
[+] CodeMetrics_M_	4	0*	0*
[+] CodeMetrics_Y	4	3	2
<b>Total</b>	<b>52</b>	<b>45</b>	

\* The global variable is not directly used in any function.

**3. Function Information [hide]**

View function metrics in a call tree format or table format. Accumulated stack numbers include the estimated stack size of the function plus the maximum of the accumulated stack size of the subroutines that the function calls.

View: Call Tree | Table

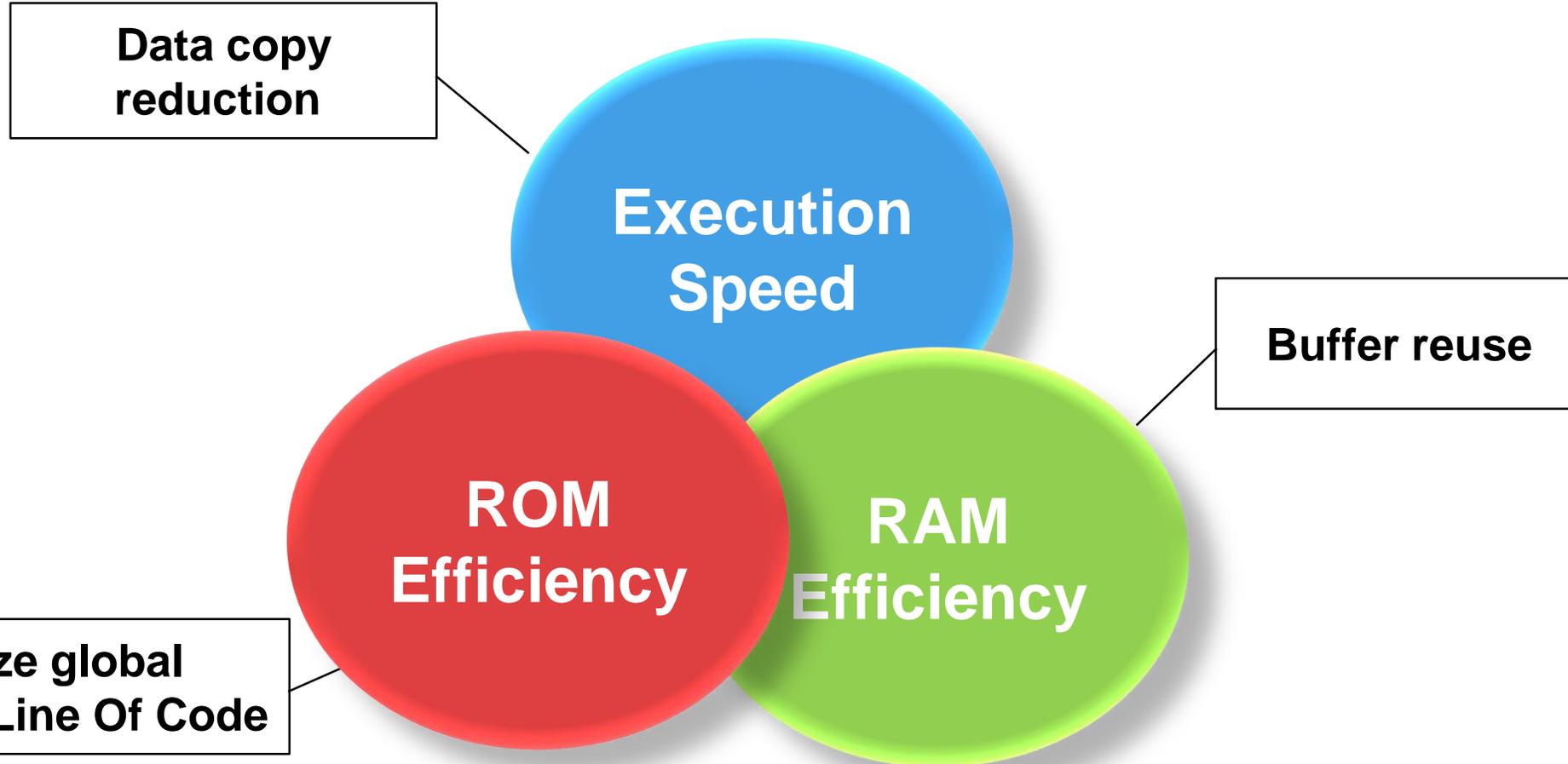
Function Name	Accumulated Stack Size (bytes)	Self Stack Size (bytes)	Lines of Code	Lines	Complexity
[+] CodeMetrics_initialize	0	0	5	17	1
CodeMetrics_step	0	0	33	89	6
CodeMetrics_terminate	0	0	0	4	1

Lines of code

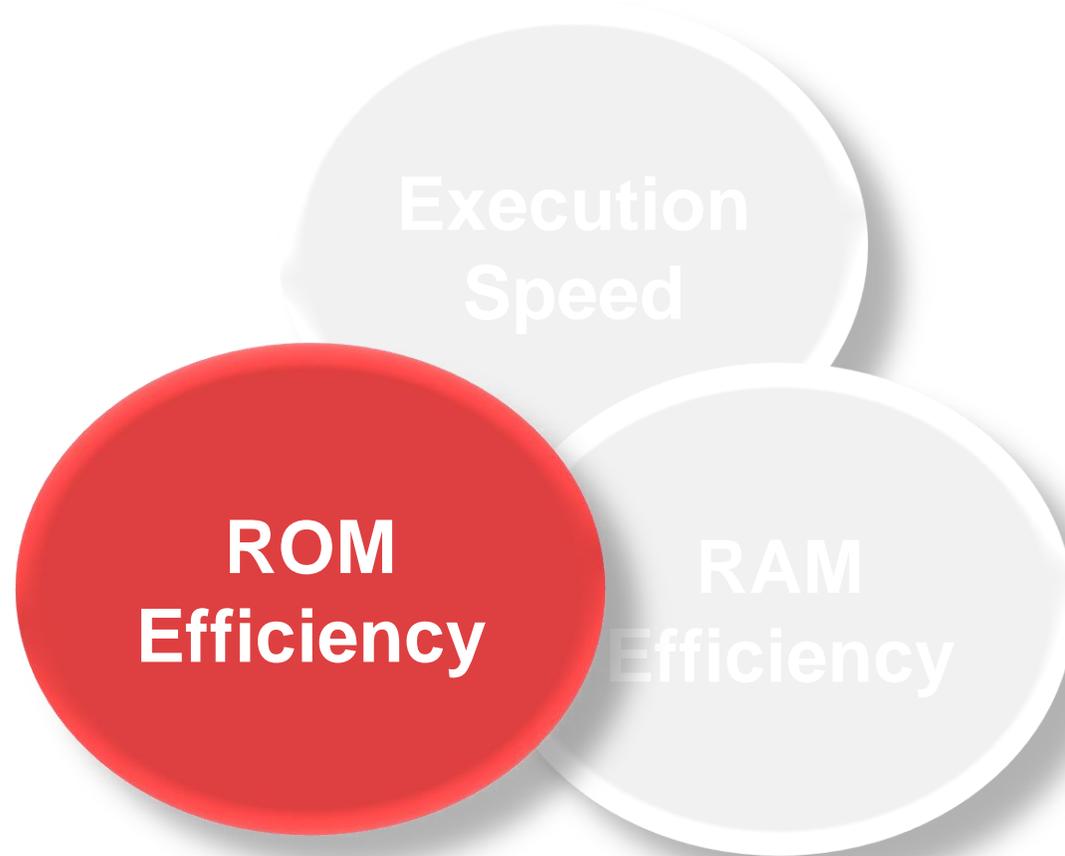
Usage of global variables

Estimated stack size /Cyclomatic complexity

# RAM, ROM and Execution Performance



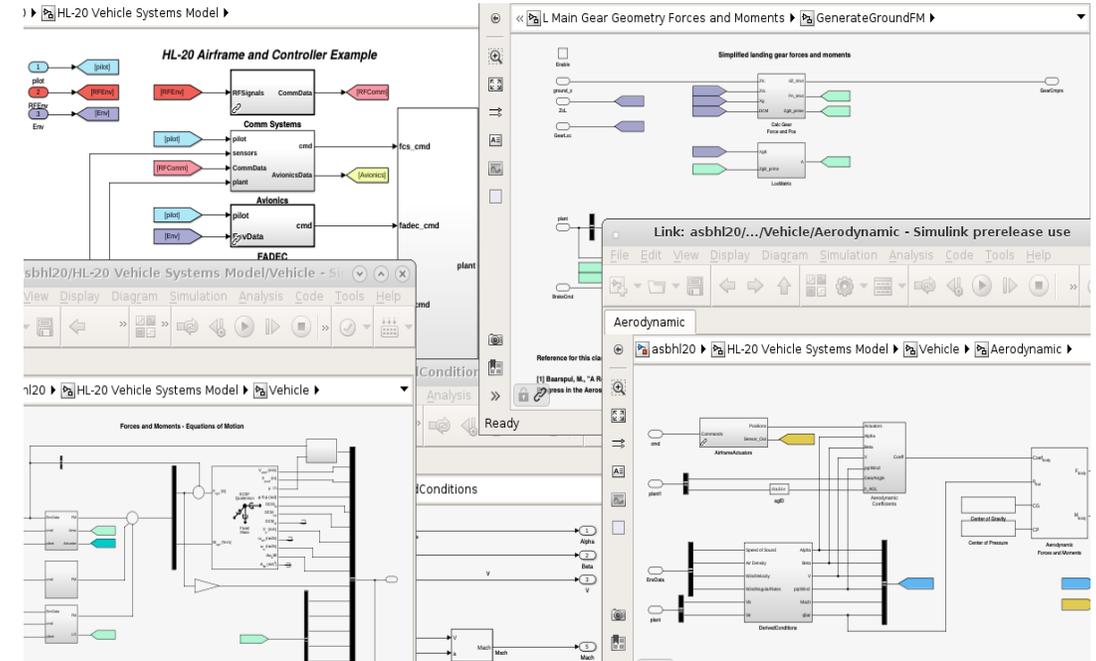
# RAM, ROM and Execution Performance



# Challenge: Maintaining Large and Complex Systems

ROM  
Efficiency

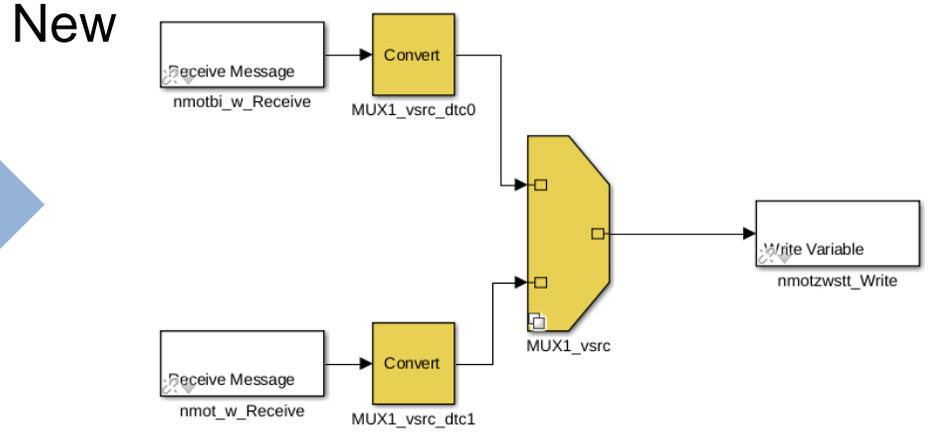
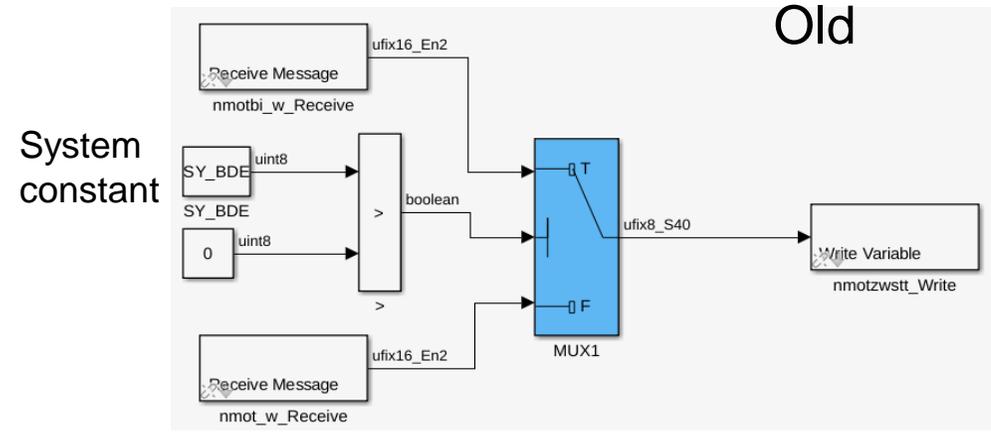
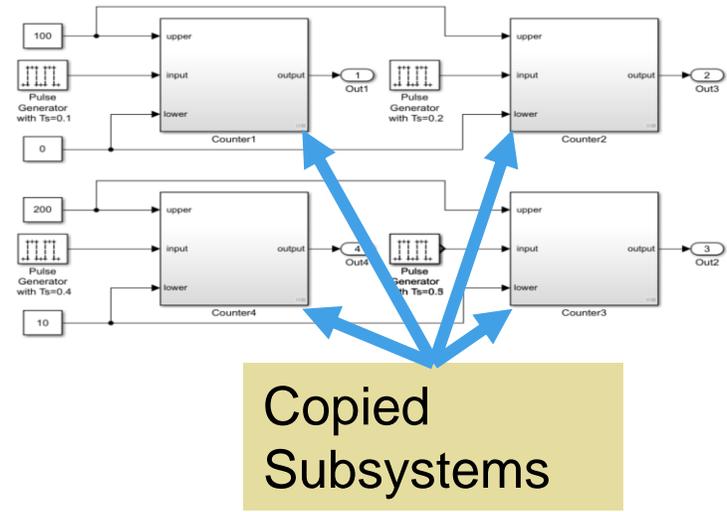
- Size and complexity of systems are increasing
  - “Typical ECU contains 2000 function components that are each developed by a different person” Automotive customer
- “Enforcement of low complexity” required for model standards
  - ISO 26262-6 “Product Development at the Software Level”, Table 1



# Challenge: Maintaining Large and Complex Systems



- Studies estimate 13-20% of code in large systems are cloned \*
- Old fashion modeling patterns appear:



\* Source: Roy and Cordy A Survey on Software Clone Detection Research, Sept 2007  
 Baker. On Finding Duplication and Near-Duplication in Large Software Systems. In Proceedings of the Second Working Conference on Reverse Engineering (WCRE'95), July 1995.

# Clone Detection & Refactoring

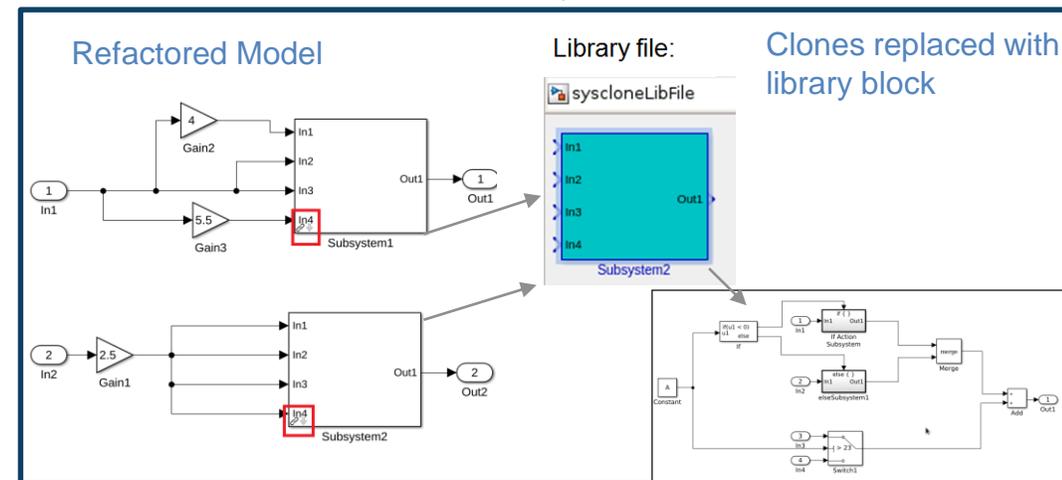
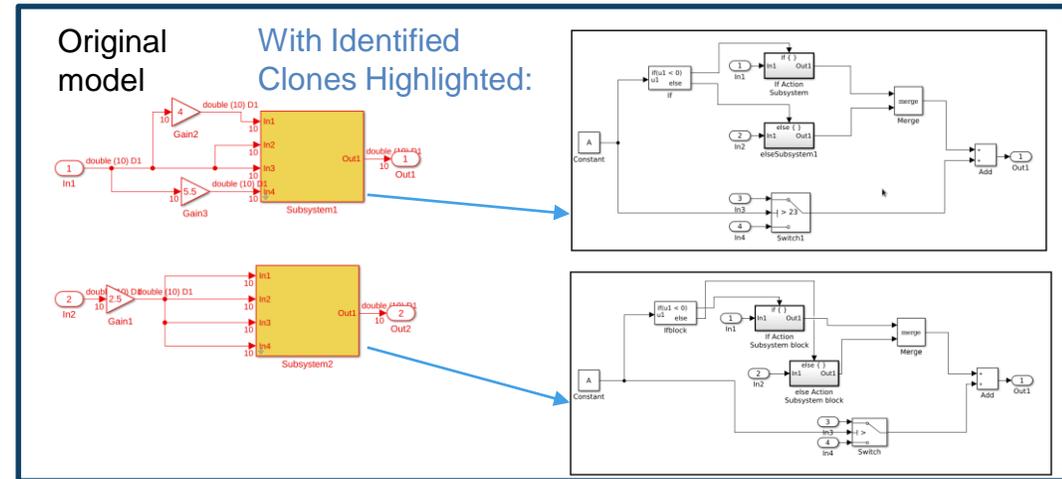
ROM Efficiency

## Clone Detection

- Find duplicate model content in your design
- Locate opportunities to optimize with a library

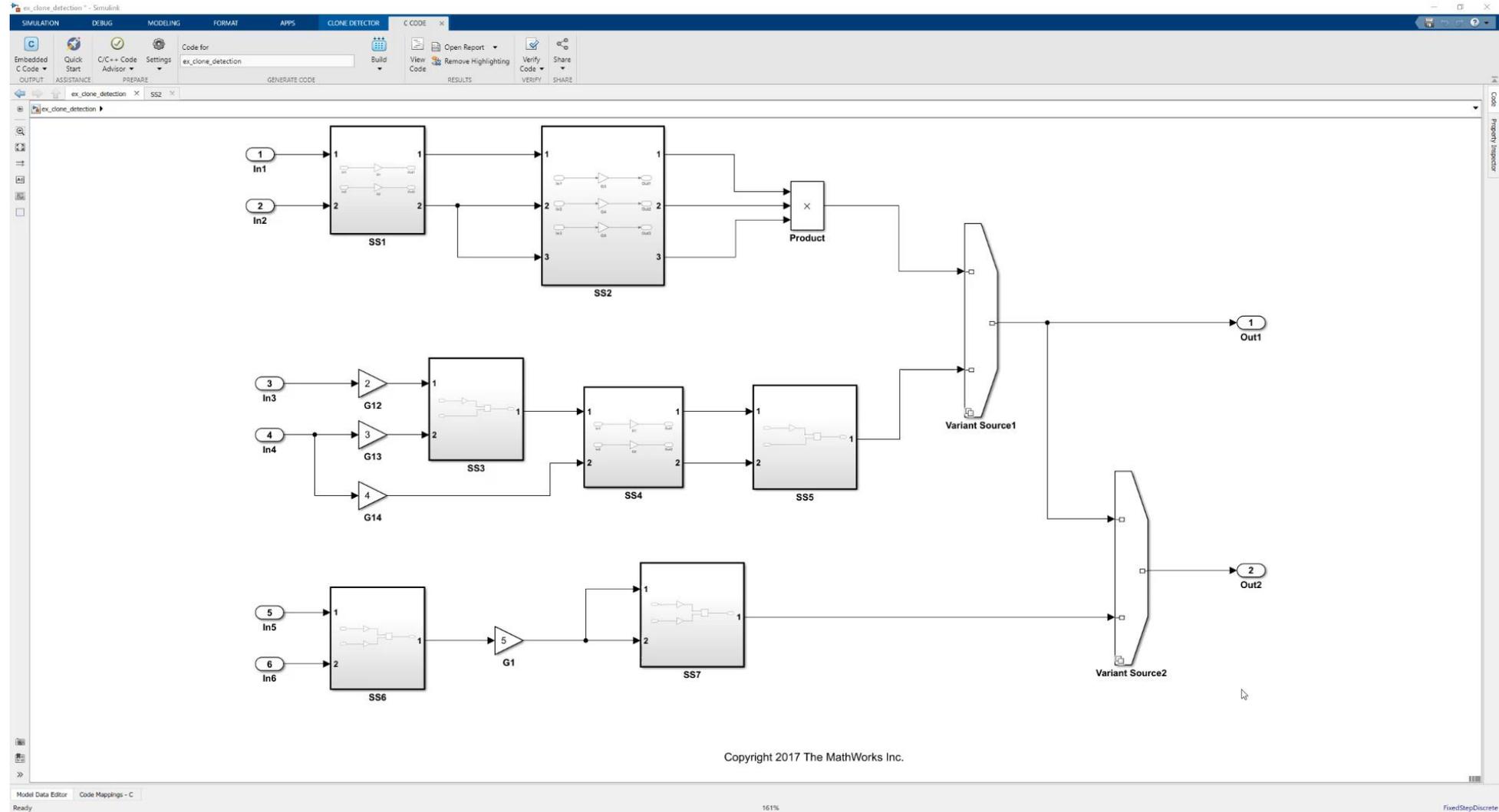
## Refactoring

- Replace exact clones with library blocks
- Improve reuse and maintainability



# DEMO: Detect Clone in Model

ROM Efficiency



# Review Generated Code

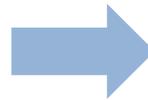
ROM Efficiency

```
25 /* Real-time model */
26 RT_MODEL_ex_clone_detection_T ex_clone_detection_M;
27 RT_MODEL_ex_clone_detection_T *const ex_clone_detection_M =
28     &ex_clone_detection_M;
29
30 /* Output and update for atomic system: '<Root>/SS3' */
31 real_T ex_clone_detection_SS3(real_T rtu_In1, real_T rtu_In2)
32 {
33     /* Sum: '<S1>/Add1' incorporates:
34      * Gain: '<S1>/G6'
35      */
36     return 9.0 * rtu_In1 + rtu_In2;
37 }
38
39 /* Output and update for atomic system: '<Root>/SS4' */
40 void ex_clone_detection_SS4(real_T rtu_In1, real_T rtu_In2, real_T *rty_Out1,
41     real_T *rty_Out2)
42 {
43     /* Gain: '<S2>/G7' */
44     *rty_Out1 = 5.0 * rtu_In1;
45
46     /* Gain: '<S2>/G8' */
47     *rty_Out2 = 5.0 * rtu_In2;
48 }
49
50 /* Output and update for atomic system: '<Root>/SS5' */
51 real_T ex_clone_detection_SS5(real_T rtu_In1, real_T rtu_In2)
52 {
53     /* Sum: '<S3>/Add' incorporates:
54      * Gain: '<S3>/G9'
55      */
56     return 9.0 * rtu_In1 + rtu_In2;
57 }
```

SS3

SS5

Refactoring



ROM Efficiency

```
25 /* Real-time model */
26 RT_MODEL_ex_clone_detection_T ex_clone_detection_M;
27 RT_MODEL_ex_clone_detection_T *const ex_clone_detection_M =
28     &ex_clone_detection_M;
29
30 /*
31  * Output and update for atomic system:
32  * '<Root>/SS3'
33  * '<Root>/SS5'
34  */
35 real_T ex_clone_detection_SS3(real_T rtu_In1, real_T rtu_In2, real_T
36     rtp_Gain_snapshot_2020_06_17_12)
37 {
38     /* Sum: '<S1>/Add1' incorporates:
39      * Gain: '<S1>/G6'
40      */
41     return rtp_Gain_snapshot_2020_06_17_12 * rtu_In1 + rtu_In2;
42 }
43
44 /* Output and update for atomic system: '<Root>/SS4' */
45 void ex_clone_detection_SS1(real_T rtu_In1, real_T rtu_In2, real_T *rty_Out1,
46     real_T *rty_Out2)
47 {
48     /* Gain: '<S2>/G1' */
49     *rty_Out1 = 5.0 * rtu_In1;
50
51     /* Gain: '<S2>/G2' */
52     *rty_Out2 = 5.0 * rtu_In2;
53 }
54
55 /* Model step function */
56 void ex_clone_detection_step(void)
57 {
58     real_T rtb_G2;
59     real_T rtb_G1;
60
61     /* Outputs for Atomic SubSystem: '<Root>/SS3' */
```

SS3,5

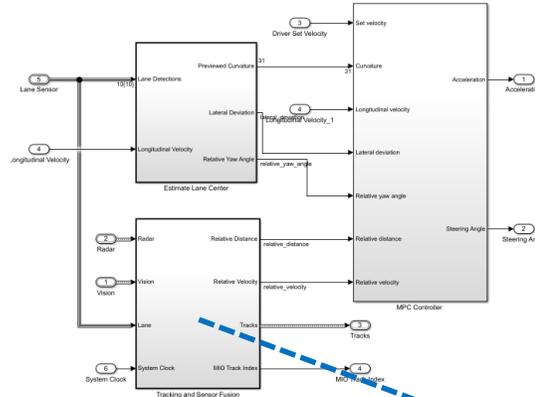
Before

After

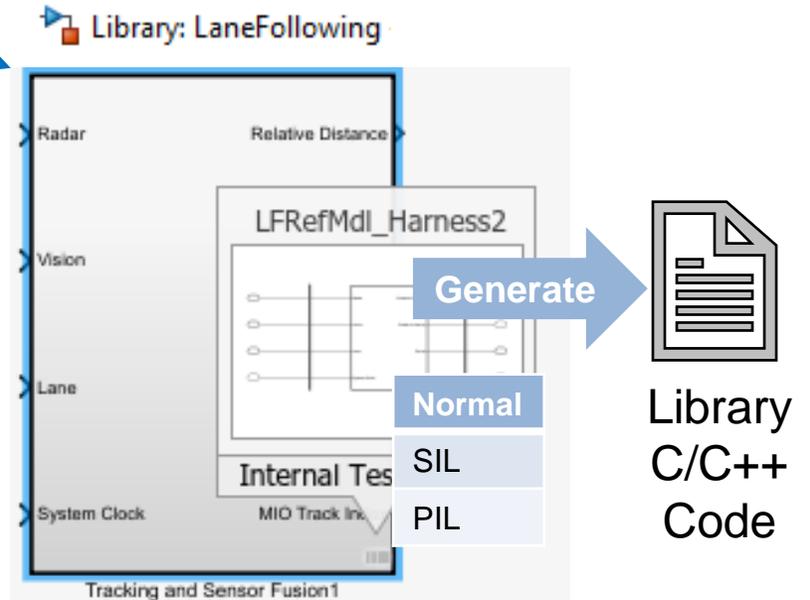
# Library-Based Subsystem Code Generation



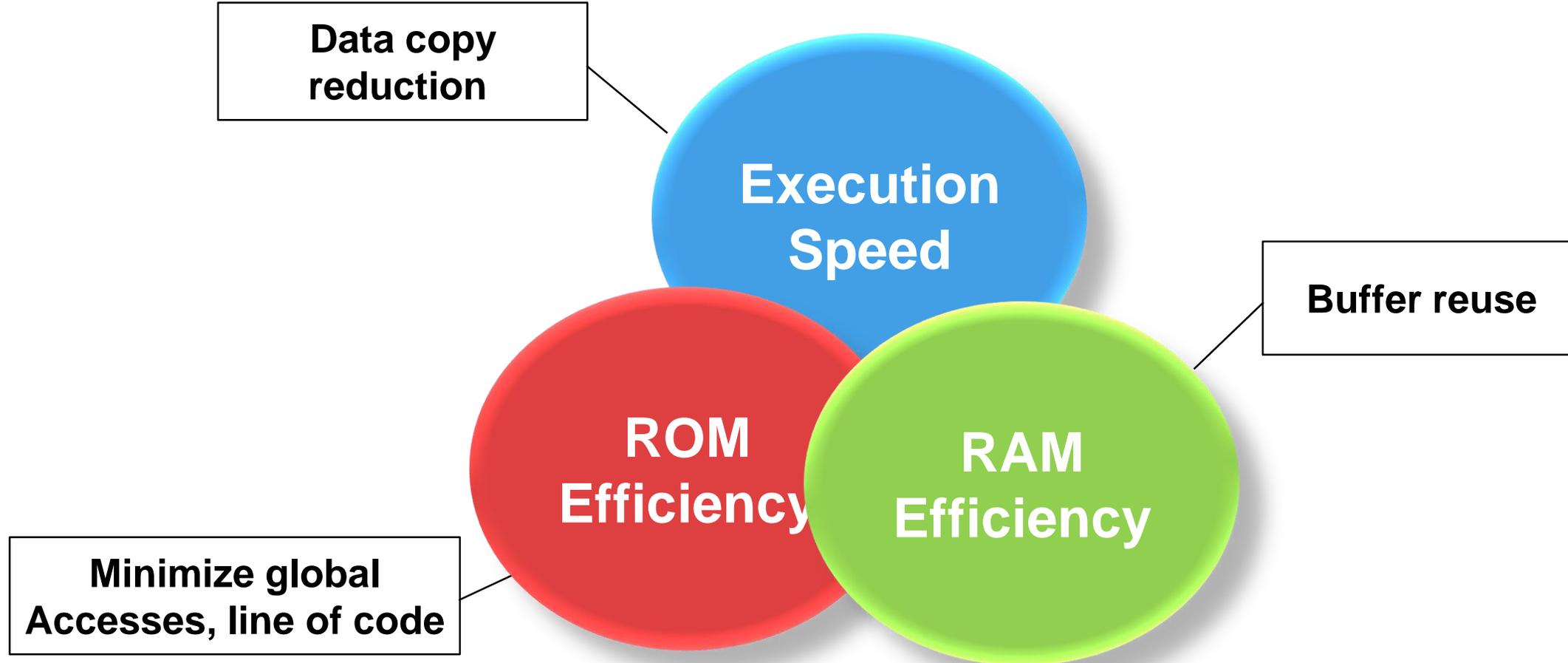
- System complexity → Unit testing
  - Models ✓
  - Subsystems ?



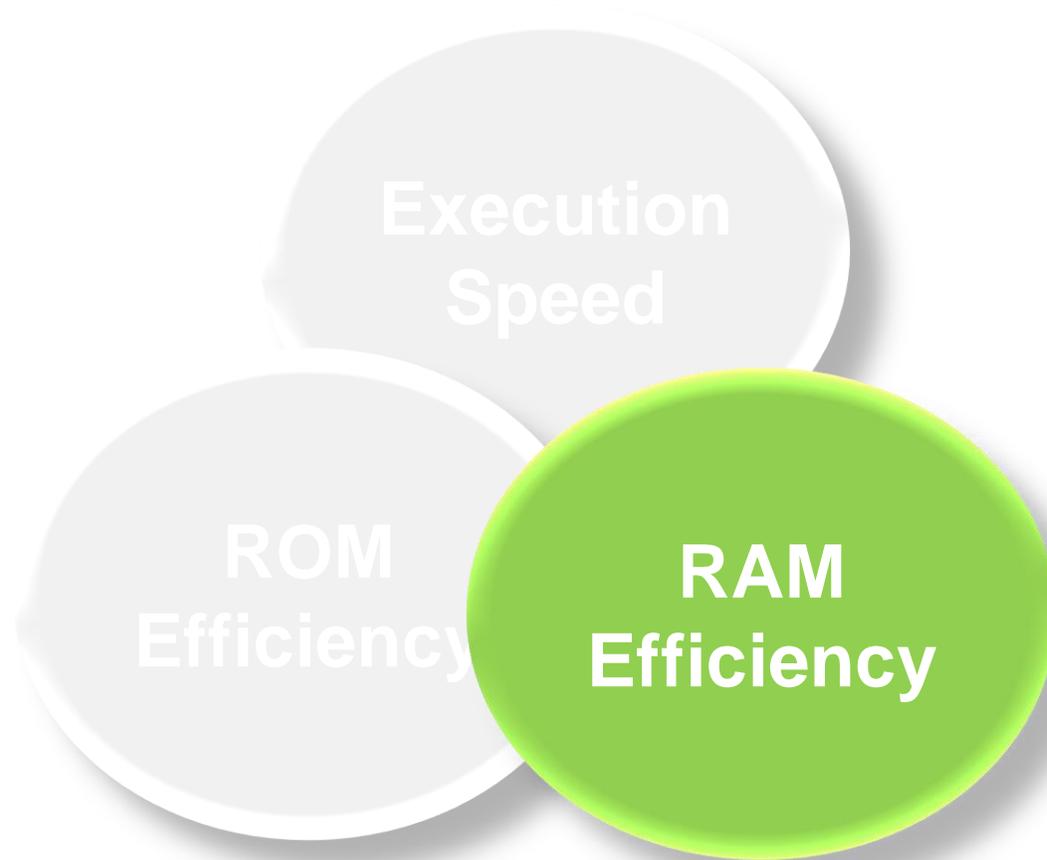
- Library-based Subsystem Code Generation **R2019a**
  - Lock down function interfaces
  - Generate small reusable sub-functions
  - Verify usage within a model using SIL/PIL
  - SIL/PIL unit test in library with code coverage** **R2020a**



# RAM, ROM and Execution Performance

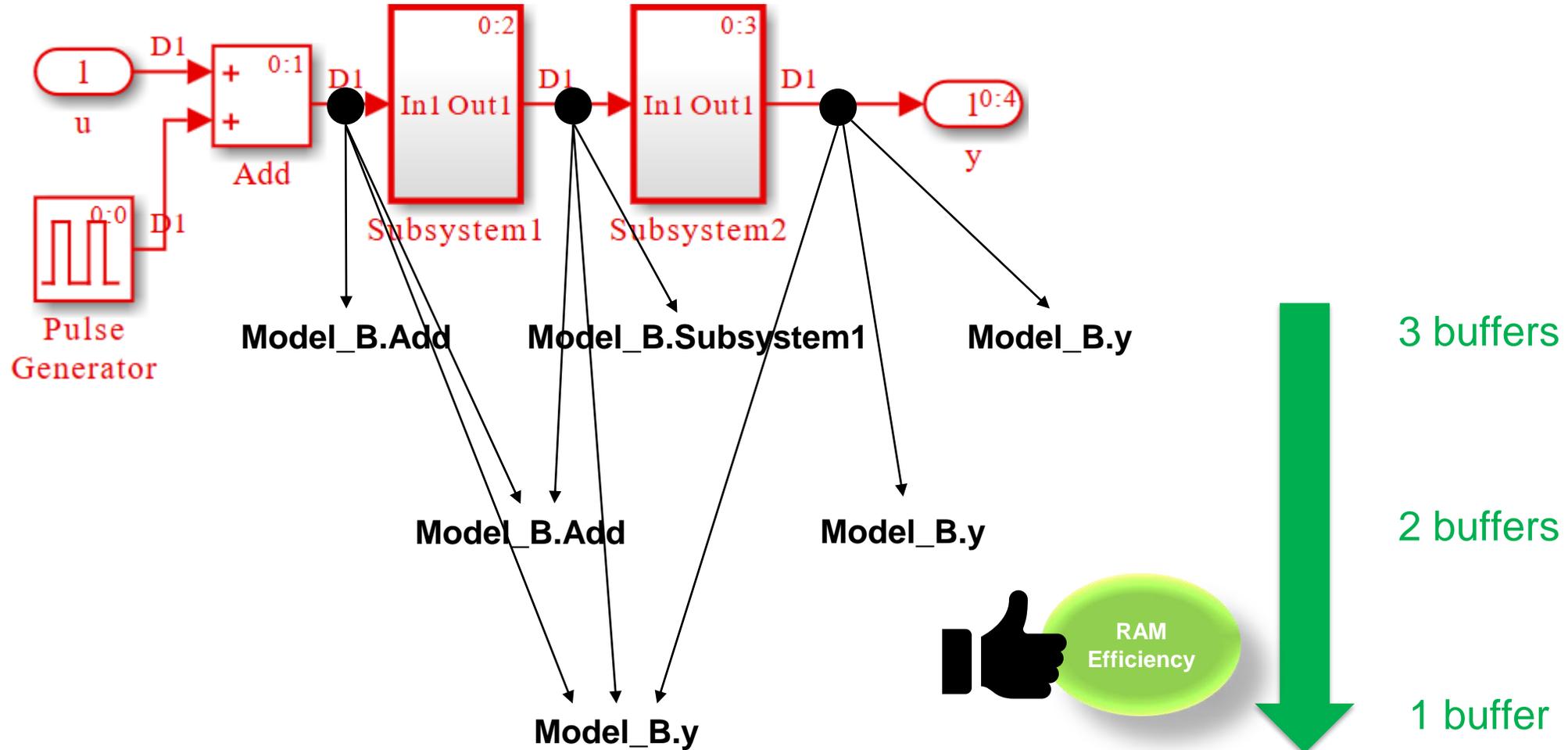


# RAM, ROM and Execution Performance



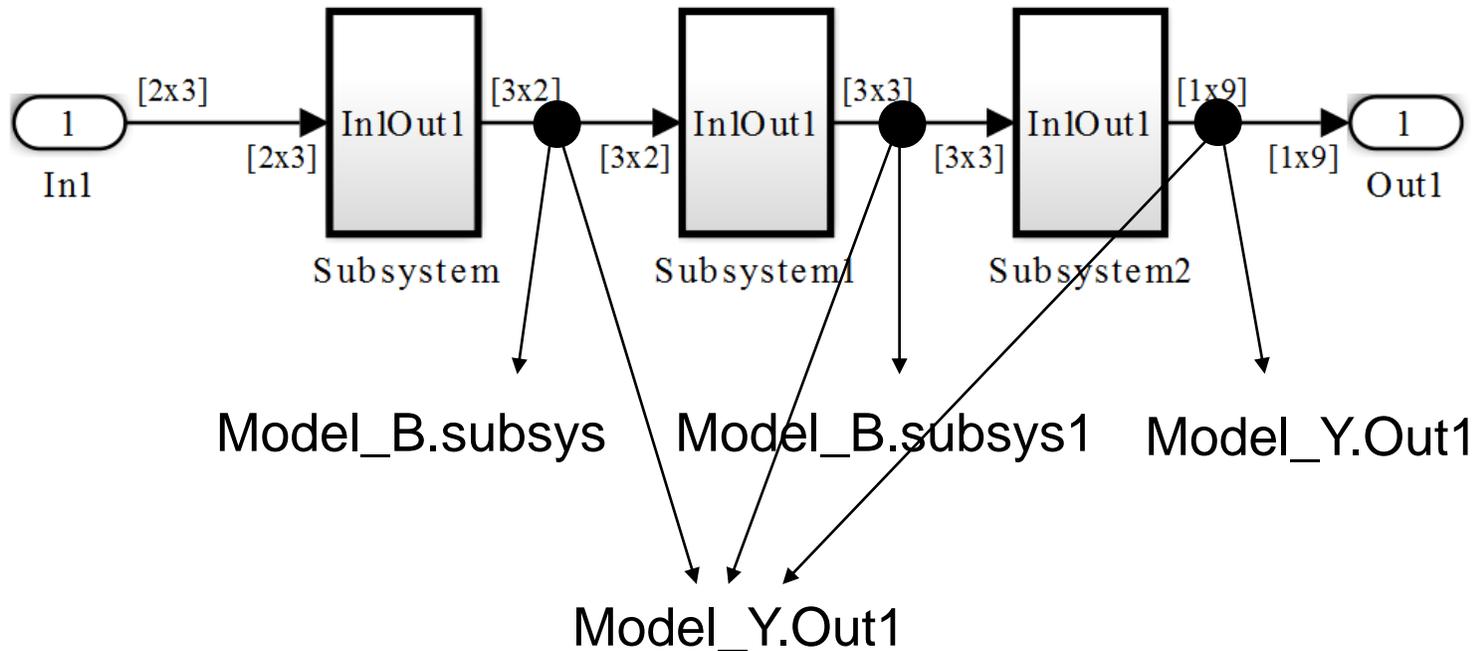
# Reuse Local Block Output

RAM Efficiency

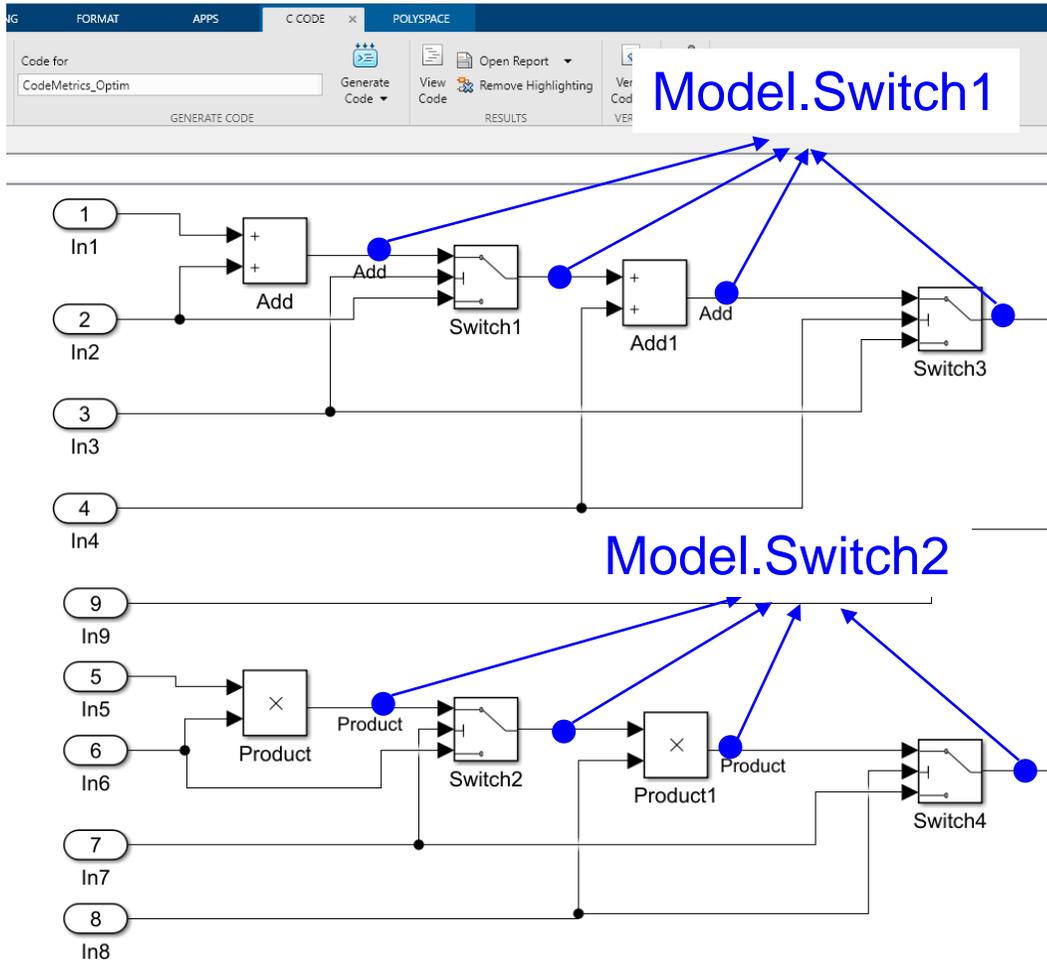


# Reuse Local Block Output

- Reuse buffers with **different sizes and/or shapes** (dimensions)
  - Different buffers collapse to one, the biggest size is kept



# Reuse Local Block Output



A screenshot of the "Configuration Parameters: CodeMetrics\_NonOptim/Configuration (Active)" dialog box. The "Optimization" section is expanded, and a red box highlights the following checked options: "Signal storage reuse", "Enable local block outputs", "Reuse local block outputs", "Eliminate superfluous local variables (expression folding)", "Reuse global block outputs", "Perform in-place updates for Assignment and Bus Assignment blocks", and "Reuse buffers for Data Store Read and Data Store Write blocks". A blue callout bubble with the text "Reuse signal storage" points to the "Signal storage reuse" option. The "Level" is set to "Maximum".

# Reuse Local Block Output

RAM  
Efficiency

- Review Code Generation Report

```
Code Generation Report
Find: 
Match Case

Contents
Summary
Subsystem Report
Code Interface Report
Traceability Report
Static Code Metrics Report
Code Replacements Report
Coder Assumptions

Generated Code
[-] Main file
ert_main.c
[-] Model files
CodeMetrics_Optim.c
CodeMetrics_Optim.h
CodeMetrics_Optim_private.h
CodeMetrics_Optim_types.h
[-] Data files
CodeMetrics_Optim_data.c
[+] Shared files (1)

29 /* Model step function */
30 void CodeMetrics_Optim_step(void)
31 {
32     uint16_T rtb_Switch2;
33     int32_T rtb_Switch;
34     uint8_T rtb_Switch3;
35
36     /* Switch: '<Root>/Switch1' incorporates:
37      * Inport: '<Root>/In1'
38      * Inport: '<Root>/In2'
39      * Inport: '<Root>/In3'
40      * Sum: '<Root>/Add'
41      */
42     if (CodeMetrics_Optim_U.In3 >= CodeMetrics_Optim_P.Switch1_Threshold) {
43         rtb_Switch3 = (uint8_T)((((uint32_T)CodeMetrics_Optim_U.In1) + ((uint32_T)
44             CodeMetrics_Optim_U.In2));
45     } else {
46         rtb_Switch3 = CodeMetrics_Optim_U.In2;
47     }
48
49     /* End of Switch: '<Root>/Switch1' */
50
51     /* Switch: '<Root>/Switch3' incorporates:
52      * Inport: '<Root>/In3'
53      * Inport: '<Root>/In4'
54      * Sum: '<Root>/Add1'
55      */
56     if (CodeMetrics_Optim_U.In4 >= CodeMetrics_Optim_P.Switch3_Threshold) {
57         rtb_Switch3 = (uint8_T)((((uint32_T)rtb_Switch3) + ((uint32_T)
58             CodeMetrics_Optim_U.In4));
59     } else {
60         rtb_Switch3 = (uint8_T)CodeMetrics_Optim_U.In3;
```

Use only 3 variables for 9 blocks  
-. Reduce 6 variables

# Reuse Local Block Output

RAM  
Efficiency

- Review Static Code Metrics Report

The screenshot shows the 'Code Generation Report' window. The 'Static Code Metrics Report' is selected in the left sidebar. The main content area displays a table of file metrics and a table of global variables.

File Name	Lines of Code	Lines	Generated On
<a href="#">rtwtypes.h</a>	81	152	06/08/2020 12:53 PM
<a href="#">CodeMetrics_Optim.h</a>	44	115	06/08/2020 1:30 PM
<a href="#">CodeMetrics_Optim.c</a>	42	120	06/08/2020 1:30 PM
<a href="#">CodeMetrics_Optim_data.c</a>	9	52	06/08/2020 1:30 PM
<a href="#">CodeMetrics_Optim_types.h</a>	6	35	06/08/2020 1:30 PM
<a href="#">CodeMetrics_Optim_private.h</a>	4	26	06/08/2020 1:30 PM

**2. Global Variables [hide]**

Global variables defined in the generated code.

Global Variable	Size (bytes)	Reads / Writes	Reads / Writes in a Function
[+] <a href="#">CodeMetrics_Optim_U</a>	9	15	15
[+] <a href="#">CodeMetrics_Optim_P</a>	5	5	5
[+] <a href="#">CodeMetrics_Optim_M</a>	4	0*	0*
[+] <a href="#">CodeMetrics_Optim_Y</a>	4	2	2
<b>Total</b>	<b>22</b>	<b>22</b>	

\* The global variable is not directly used in any function.

**3. Function Information [hide]**

View function metrics in a call tree format or table format. Accumulated stack numbers include the estimated stack size of the function plus the maximum of the accumulated stack size of the subroutines that the function calls.

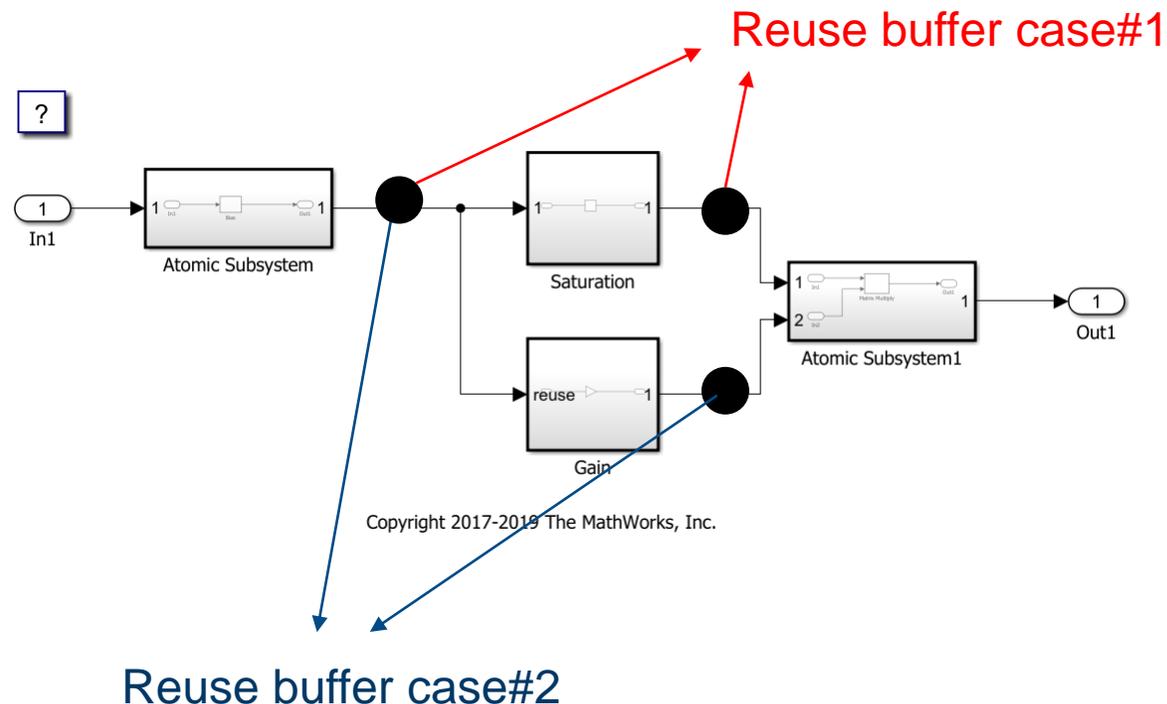
View: Call Tree | [Table](#)

Function Name	Accumulated Stack Size (bytes)	Self Stack Size (bytes)	Lines of Code	Lines	Complexity
<a href="#">CodeMetrics_Optim_step</a>	7	7	30	78	6
<a href="#">CodeMetrics_Optim_initialize</a>	0	0	0	4	1

	Before	After
<b>Lines of Code</b>	33	30
<b>Total Lines</b>	89	78

# Reuse Buffer Using Signal Labels

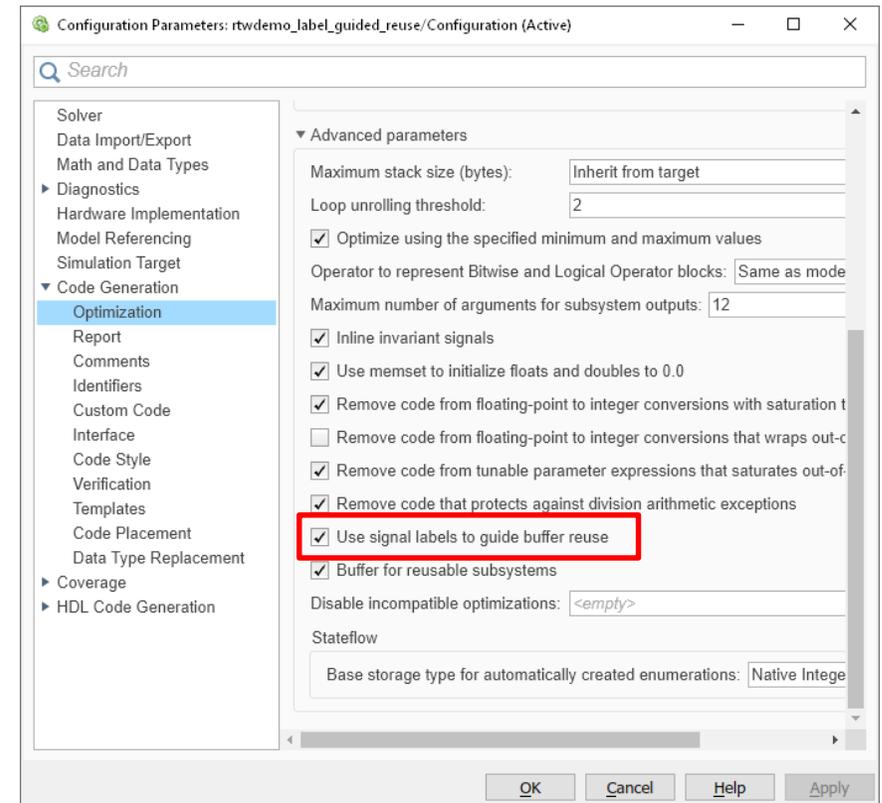
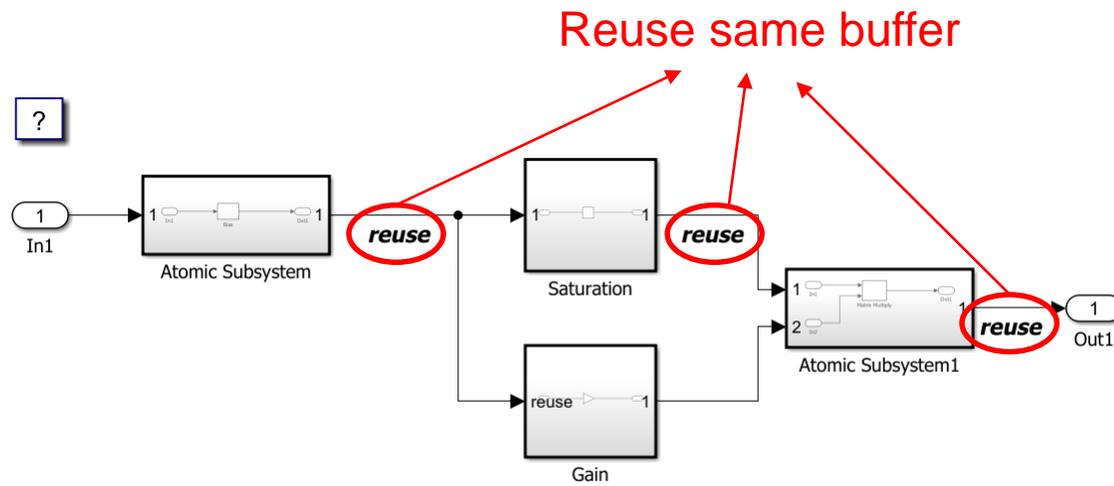
- Using Signal Labels to Guide Buffer Reuse
  - Case#1: Same variable for the Atomic Subsystem and Saturation block outputs
  - Case#2: Same variable for the Atomic Subsystem and Gain block outputs



# Reuse Buffer Using Signal Labels



- Using Signal Labels to Guide Buffer Reuse
  - Same variable for the Atomic Subsystem and Saturation block outputs



# Reduce Code Complexity by Refactoring Subsystem



The screenshot shows the Simulink environment with a subsystem block highlighted. A yellow arrow points from the subsystem block to the "Block Parameters: Subsystem" dialog box. In the dialog box, the "Subsystem Reference" tab is selected, and the "Function packaging" dropdown menu is set to "Reusable function".

**Block Parameters: Subsystem**

Select the settings for the subsystem block. To enable parameters for code generation, select 'Treat as atomic unit'.

Main Code Generation Subsystem Reference

Function packaging: Reusable function

Function name options: Auto

File name options: Auto

Memory section for initialize/terminate functions: Inherit from model

Memory section for execution functions: Inherit from model

OK Cancel Help Apply

# Reduce Code Complexity by Refactoring Subsystem

RAM  
Efficiency

- Review Code Generation Report

The screenshot shows a 'Code Generation Report' window. On the left, there is a 'Contents' pane with a tree view. Under 'Generated Code', the 'Model files' section is expanded, and 'CodeMetrics\_Optim.c' is highlighted. The main pane displays C code. A red dashed box highlights the function definition for 'CodeMetrics\_Optim\_Subsystem' starting at line 33. A blue callout box with a white arrow points to this function definition, containing the text 'Create subsystem function'. The code includes comments for switches and products, and logic for setting 'rtb\_Switch2' based on 'rtu\_In3' and 'rtu\_In2' values.

```
28 /* Real-time model */
29 RT_MODEL_CodeMetrics_Optim_T CodeMetrics_Optim_M;
30 RT_MODEL_CodeMetrics_Optim_T *const CodeMetrics_Optim_M = &CodeMetrics_Optim_M;
31
32 /* Output and update for rtu's system: <S1>/Subsystem */
33 void CodeMetrics_Optim_Subsystem(uint8_T rtu_In1, uint8_T rtu_In2, int8_T
34   rtu_In3, int8_T rtu_In4, B_Subsystem_CodeMetrics_Optim_T *localB,
35   P_Subsystem_CodeMetrics_Optim_T *localP)
36 {
37   uint16_T rtb_Switch2;
38
39   /* Switch: <S1>/Switch2 incorporates:
40    * Product: <S1>/Product
41    */
42   if (rtu_In3 >= localP->Switch2_Threshold) {
43     rtb_Switch2 = (uint16_T)(((uint32_T)rtu_In1) * ((uint32_T)rtu_In2));
44   } else {
45     rtb_Switch2 = (uint16_T)rtu_In2;
46   }
47
48   /* End of Switch: <S1>/Switch2 */
49
50   /* Switch: <S1>/Switch4 incorporates:
51    * Product: <S1>/Product1
52    */
53   if (rtu_In4 >= localP->Switch4_Threshold) {
54     localB->Switch4 = ((int32_T)rtb_Switch2) * ((int32_T)rtu_In4);
55   } else {
56     localB->Switch4 = (int32_T)rtu_In3;
57   }
58
59   /* End of Switch: <S1>/Switch4 */
60 }
61
62 /* Model step function */
```

Function: CodeMetrics\_Optim\_Subsystem (stack: 2 byte, total stack: 2 byte)  
CodeMetrics\_Optim\_Subsystem defined at CodeMetrics\_Optim.c line 33

# Reduce Code Complexity by Refactoring Subsystem



- Review Static Code Metrics Report

The screenshot shows the 'Code Generation Report' window. The 'Static Code Metrics Report' section is highlighted. It contains two tables:

**2. Global Variables [hide]**

Global Variable	Size (bytes)	Reads / Writes	Reads / Writes in a Function
[+] CodeMetrics_Optim_U	9	12	12
[+] CodeMetrics_Optim_P	5	4	4
[+] CodeMetrics_Optim_B	4	2	2
[+] CodeMetrics_Optim_M	4	0*	0*
[+] CodeMetrics_Optim_Y	4	2	2
<b>Total</b>	<b>26</b>	<b>20</b>	

\* The global variable is not directly used in any function.

**3. Function Information [hide]**

View function metrics in a call tree format or table format. Accumulated stack numbers include the estimated stack size of the function plus the maximum of the accumulated stack size of the subroutines that the function calls.

View: Call Tree | Table

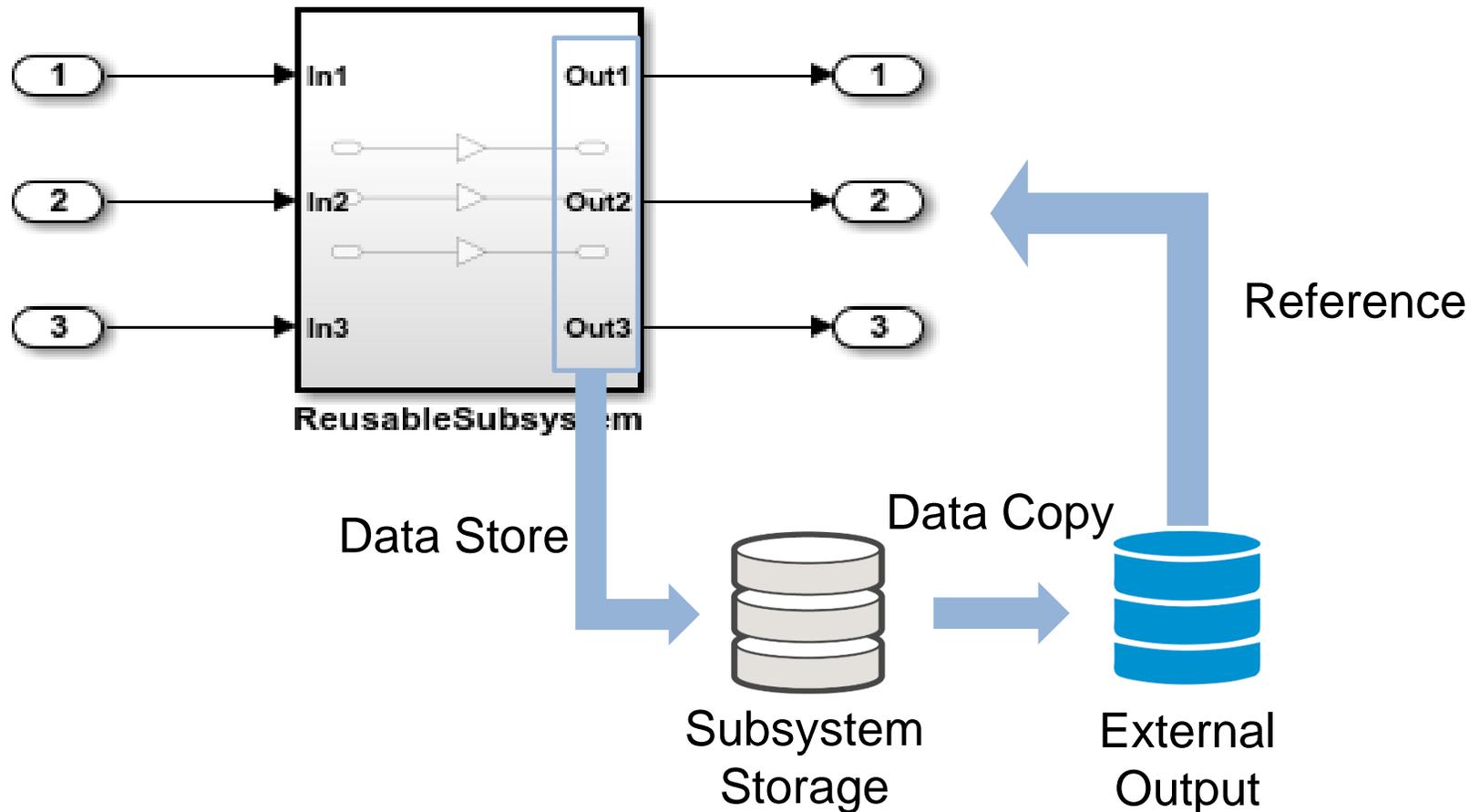
Function Name	Accumulated Stack Size (bytes)	Self Stack Size (bytes)	Lines of Code	Lines	Complexity
[+] CodeMetrics_Optim_step	3	1	21	58	4
CodeMetrics_Optim_Subsystem	2	2	11	28	3
CodeMetrics_Optim_initialize	0	0	0	4	1

	Before	After
Complexity	6	4
Lines of Code	33	11
Total Lines	78	58

# Optimize Generate Code in Reusable Subsystem

RAM  
Efficiency

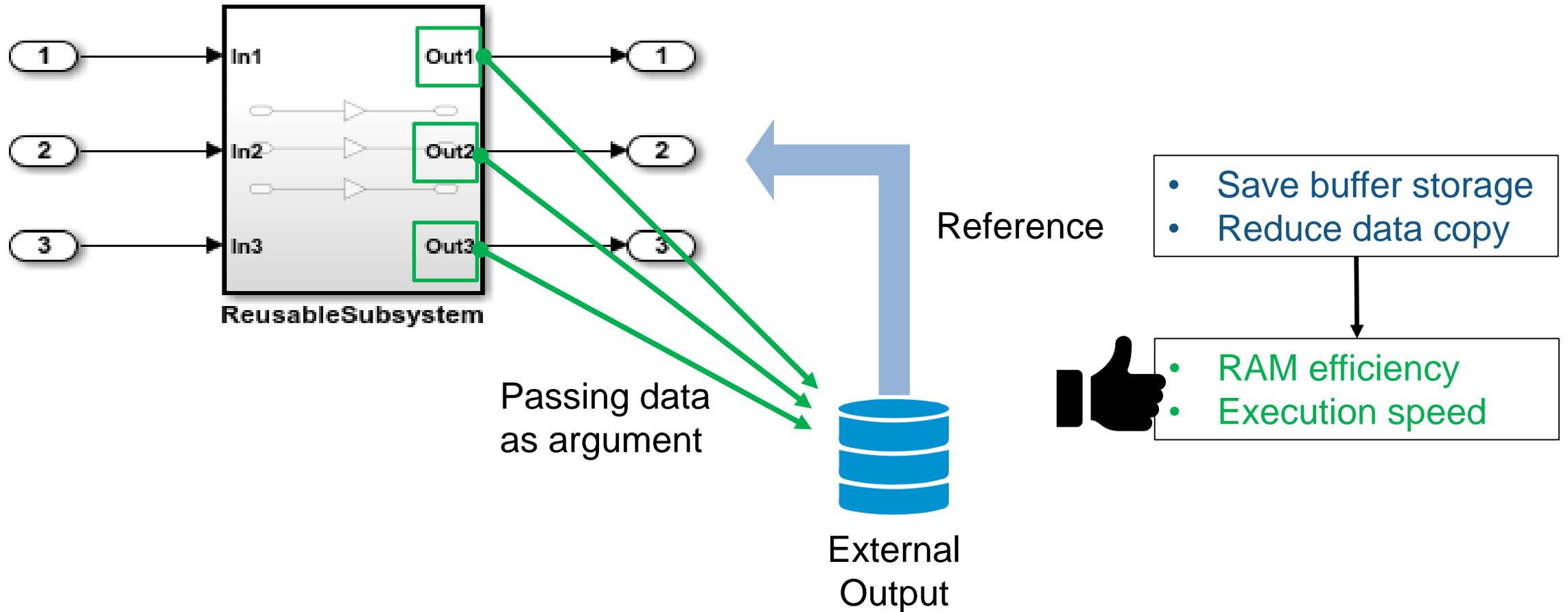
- Passing Reusable Subsystem Outputs as *Structure Reference*



# Optimize Generate Code in Reusable Subsystem



- Passing Reusable Subsystem Outputs as *Individual Argument*



# Optimize Generate Code in Reusable Subsystem



The image shows the Simulink software interface. On the left, a block diagram of a "ReusableSubsystem" is displayed, enclosed in a red box. It has three input ports labeled 1, 2, and 3, and three output ports labeled 1, 2, and 3. A mouse cursor is pointing at the bottom right of the subsystem. On the right, the "Configuration Parameters" dialog box is open for the "Configuration (Active)" block. The "Code Generation" section is expanded, and the "Optimization" sub-section is selected. In this section, the "Pass reusable subsystem outputs as" dropdown menu is set to "Individual arguments" and is highlighted with a red box. Other settings include "Level: Maximum" and "Priority: Balance RAM and speed".

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# Optimize Generate Code in Reusable Subsystem

RAM  
Efficiency

- Review Code Generation Report

```
37 /* Gain: '<S1>/Gain' */
38 localDW->Gain = 5.0 * rtu_In1;
39
40 /* Gain: '<S1>/Gain1' */
41 localDW->Gain1 = 6.0 * rtu_In2;
42
43 /* Gain: '<S1>/Gain2' */
44 localDW->Gain2 = 7.0 * rtu_In3;
45 }
46
47 /* Model step function */
48 void rtwdemo_reusable_sys_outputs_step(void)
49 {
50 /* Outputs for Atomic SubSystem: '<Root>/ReusableSubsystem' */
51
52 /* Inport: '<Root>/In1' incorporates:
53 * Inport: '<Root>/In2'
54 * Inport: '<Root>/In3'
55 */
56 ReusableSubsystem(rtU.In1, rtU.In2, rtU.In3, &rtY.Out1, &rtY.Out2, &rtY.Out3);
57
58 /* End of Outputs for SubSystem: '<Root>/ReusableSubsystem' */
59
60 /* Output: '<Root>/Out1' */
61 rtY.Out1 = rtDW.ReusableSubsystem_d.Gain;
62
63 /* Output: '<Root>/Out2' */
64 rtY.Out2 = rtDW.ReusableSubsystem_d.Gain1;
65
66 /* Output: '<Root>/Out3' */
67 rtY.Out3 = rtDW.ReusableSubsystem_d.Gain2;
68 }
```

3 times data copy from  
subsystem structure

[Structure reference]

```
31 /* Output and update for atomic system: '<Root>/ReusableSubsystem' */
32 static void ReusableSubsystem(real_T rtu_In1, real_T rtu_In2, real_T rtu_In3,
33 real_T *rty_Out1, real_T *rty_Out2, real_T *rty_Out3)
34 {
35 /* Gain: '<S1>/Gain' */
36 *rty_Out1 = 5.0 * rtu_In1;
37
38 /* Gain: '<S1>/Gain1' */
39 *rty_Out2 = 6.0 * rtu_In2;
40
41 /* Gain: '<S1>/Gain2' */
42 *rty_Out3 = 7.0 * rtu_In3;
43 }
44
45 /* Model step function */
46 void rtwdemo_reusable_sys_outputs_step(void)
47 {
48 /* Outputs for Atomic SubSystem: '<Root>/ReusableSubsystem' */
49
50 /* Inport: '<Root>/In1' incorporates:
51 * Inport: '<Root>/In2'
52 * Inport: '<Root>/In3'
53 * Output: '<Root>/Out1'
54 * Output: '<Root>/Out2'
55 * Output: '<Root>/Out3'
56 */
57 ReusableSubsystem(rtU.In1, rtU.In2, rtU.In3, &rtY.Out1, &rtY.Out2, &rtY.Out3);
58
59 /* End of Outputs for SubSystem: '<Root>/ReusableSubsystem' */
60 }
```

1 times data passing  
using arguments

[Individual argument]

# Optimize Generate Code in Reusable Subsystem

- Review Static Code Metrics Report

[Structure reference]

2. Global Variables [hide]

Global variables defined in the generated code.

Global Variable	Size (bytes)	Reads / Write	Reads / Writes in a Function
[+] <a href="#">rtDW</a>	24	4	4
[+] <a href="#">rtU</a>	24	3	3
[+] <a href="#">rtY</a>	24	3	3
[+] <a href="#">rtM_</a>	8	0*	0*
<b>Total</b>	<b>80</b>	<b>10</b>	

\* The global variable is not directly used in any function.

[Individual argument]

2. Global Variables [hide]

Global variables defined in the generated code.

Global Variable	Size (bytes)	Reads / Writes	Reads / Writes in a Function
[+] <a href="#">rtU</a>	24	3	3
[+] <a href="#">rtY</a>	24	3	3
[+] <a href="#">rtM_</a>	8	0*	0*
<b>Total</b>	<b>56</b>	<b>6</b>	

\* The global variable is not directly used in any function.



Global variables: -24bytes  
Read/Write: -4 times

# Easy to Configure Options for Optimizing Code



CodeMetrics\_Optim - Simulink

Configuration Parameters: CodeMetrics\_Optim/Configuration (Active)

Search

Solver  
Data Import/Export  
Math and Data Types  
Diagnostics  
Hardware Implementation  
Model Referencing  
Simulation Target  
Code Generation  
**Optimization**  
Report  
Comments  
Identifiers  
Custom Code  
Interface  
Code Style  
Verification  
Templates  
Code Placement  
Data Type Replacement  
Coverage  
HDL Code Generation  
Polyspace

Default parameter behavior: Tunable  
Pass reusable subsystem outputs as: Structure reference

Data initialization  
 Remove root level I/O zero initialization  
 Remove internal data zero initialization

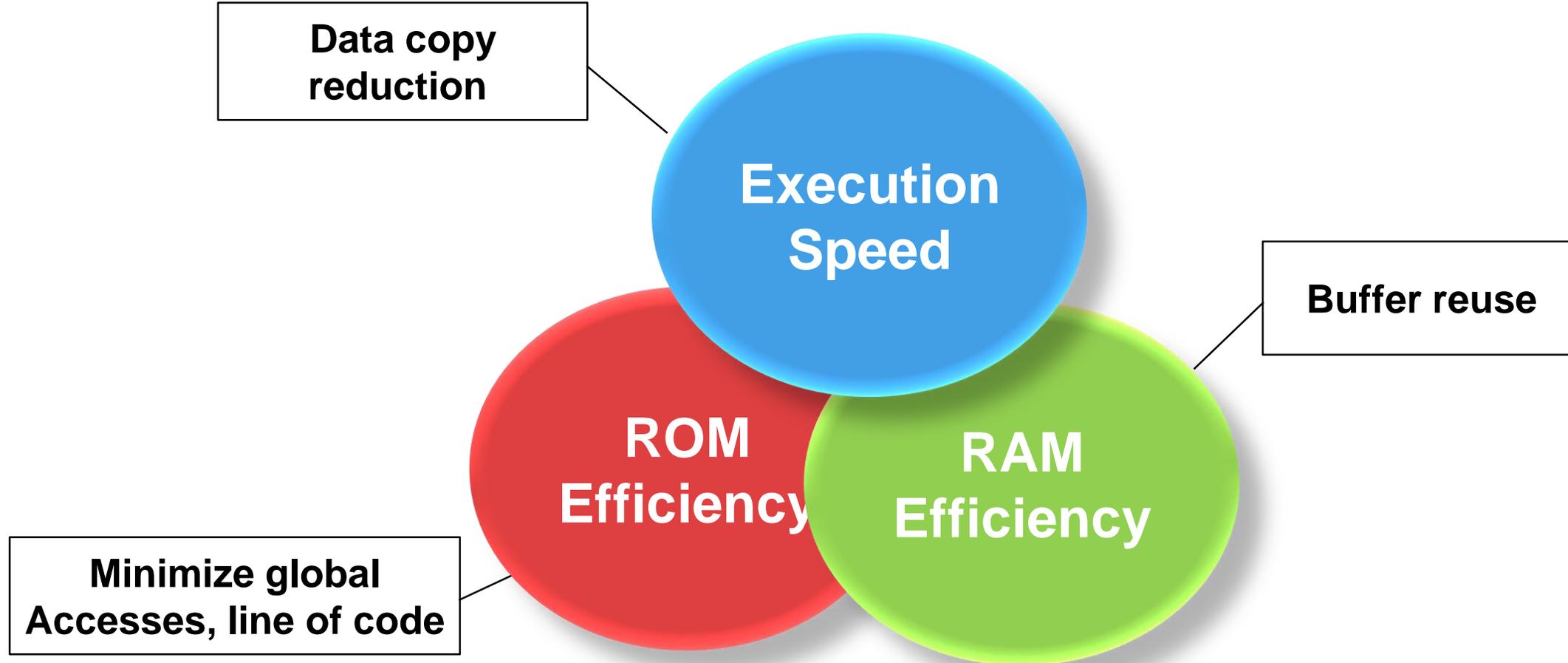
Optimization levels  
Level: Maximum  
Priority: Balance RAM and speed  
Minimum (debugging)  
Balanced with readability  
Maximum

Details  
 Use memcpy for vector assignment Memcpy threshold (bytes): 64  
 Signal storage reuse  
 Enable local block outputs  
 Reuse local block outputs  
 Eliminate superfluous local variables (expression folding)  
 Reuse global block outputs  
 Perform in-place updates for Assignment and Bus Assignment blocks  
 Reuse buffers for Data Store Read and Data Store Write blocks  
 Simplify array indexing  
 Reuse buffers of different sizes and dimensions  
 Generate parallel for loops  
 Pack Boolean data into bitfields  
Optimize global data access: Use global to hold temporary results  
Optimize block operation order in the generated code: Improved Code Execution Speed  
Stateflow  
 Use bitsets for storing state configuration  
 Use bitsets for storing Boolean data

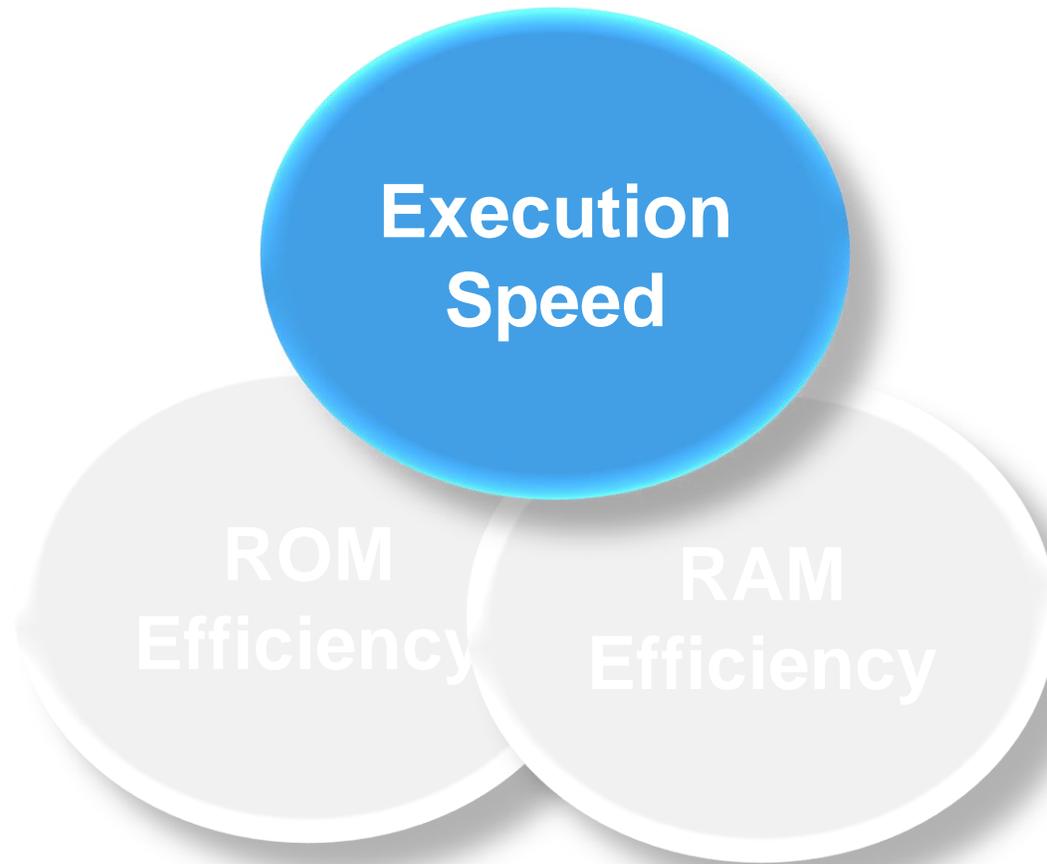
Automatically checked options

OK Cancel Help Apply

# RAM, ROM and Execution Performance



# RAM, ROM and Execution Performance



# Row-Major vs. Column-Major

- Row-Major layout
  - Elements of the rows are contiguous
  - C and C++ use row-major layout

$$X = \begin{bmatrix} x_1 & x_2 & x_3 \\ x_4 & x_5 & x_6 \\ x_7 & x_8 & x_9 \end{bmatrix}$$

The elements of the array are stored :

$x_1 x_2 x_3 x_4 x_5 x_6 x_7 x_8 x_9$

- Column-Major layout
  - Elements of the columns are contiguous
  - MATLAB<sup>®</sup> and Fortran use column-major layout

$$X = \begin{bmatrix} x_1 & x_2 & x_3 \\ x_4 & x_5 & x_6 \\ x_7 & x_8 & x_9 \end{bmatrix}$$

The elements of the array are stored :

$x_1 x_4 x_7 x_2 x_5 x_8 x_3 x_6 x_9$

# Row-Major vs. Column-Major



Column-major  
code  
generation:

```
M[] = {11, 21, 31, 12, 22, 32};
```

```
M[2] = 31
```

Column-major  
indexing

MATLAB:

```
M = [ 11 12  
      21 22  
      31 32 ]
```



Row-major  
code  
generation:

```
M[] = {11, 12, 21, 22, 31, 32};
```

```
M[2] = 21
```

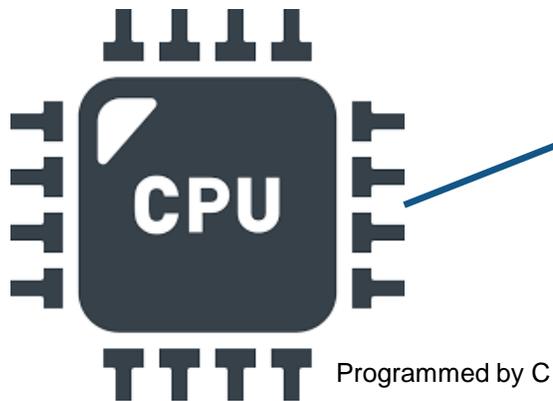
Row-major  
indexing

# Row-Major vs. Column-Major

Execution Speed

- CPUs Process Sequential Data More Efficiently than nonsequential data

$$A = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \end{bmatrix}$$



$a_{11}, a_{12}, a_{13}, \dots$

Sequentially  
data read



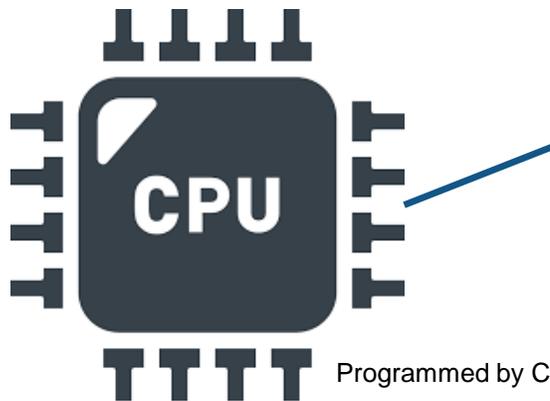
Address	Access	Value
0	A[0][0]	$a_{11}$
1	A[0][1]	$a_{12}$
2	A[0][2]	$a_{13}$
3	A[1][0]	$a_{21}$
4	A[1][1]	$a_{22}$
5	A[1][2]	$a_{23}$

[Row-major order]

# Row-Major vs. Column-Major

- CPUs Process Sequential Data More Efficiently than nonsequential data

$$A = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \end{bmatrix}$$



$a_{11}, a_{12}, a_{13}, \dots$

Need data indexing!!

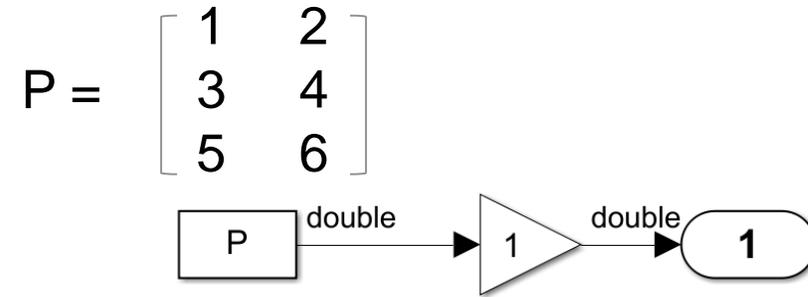
Address	Access	Value
0	A[0][0]	$a_{11}$
1	A[1][0]	$a_{21}$
2	A[0][1]	$a_{12}$
3	A[1][1]	$a_{22}$
4	A[0][2]	$a_{13}$
5	A[1][2]	$a_{23}$

[Column major order]

Memory access times increase!!

# Row-Major vs. Column-Major

Execution Speed



Column-major layout

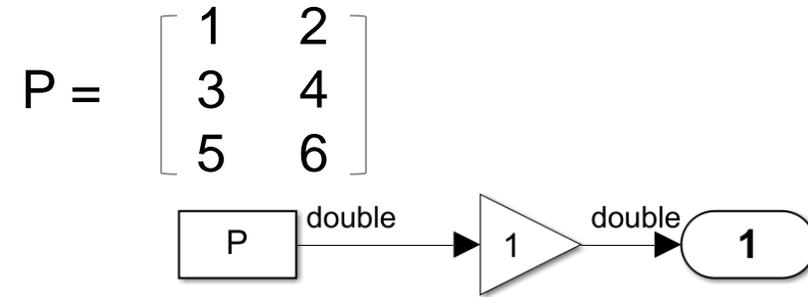
```
P rtP = {  
  /* Variable: P  
   * Referenced by: '<Root>/Constant'  
  */  
  { 1.0, 3.0, 5.0, 2.0, 4.0, 6.0 }  
};
```

Row-major layout

```
P rtP = {  
  /* Variable: P  
   * Referenced by: '<Root>/Constant'  
  */  
  { 1.0, 2.0, 3.0, 4.0, 5.0, 6.0 }  
};
```

# Row-Major and Multi-Dimension Indexing

Execution Speed



Row-major layout

```
P rtP = {  
  /* Variable: P  
   * Referenced by: '<Root>/Constant'  
   */  
  { 1.0, 3.0, 5.0, 2.0, 4.0, 6.0 }  
};
```

Multi-Dimensional layout

```
P[3][2] = { { 1.0, 2.0 }, { 3.0, 4.0 }, { 5.0, 6.0 } } ;
```

# Generating Row-Major Code

Execution Speed

The screenshot shows the 'Code Generation Report' window. The left sidebar contains a 'Contents' section with links to Summary, Subsystem Report, Code Interface Report, Traceability Report, Static Code Metrics Report, Code Replacements Report, and Coder Assumptions. Below this is the 'Generated Code' section, which is expanded to show a tree view of files: Main file (ert\_main.c), Model files (rtwdemo\_row\_lut2d.c, rtwdemo\_row\_lut2d.h), Data files (mycode.c, which is highlighted), and Shared files (1).

The main area displays the C code for 'File: mycode.c':

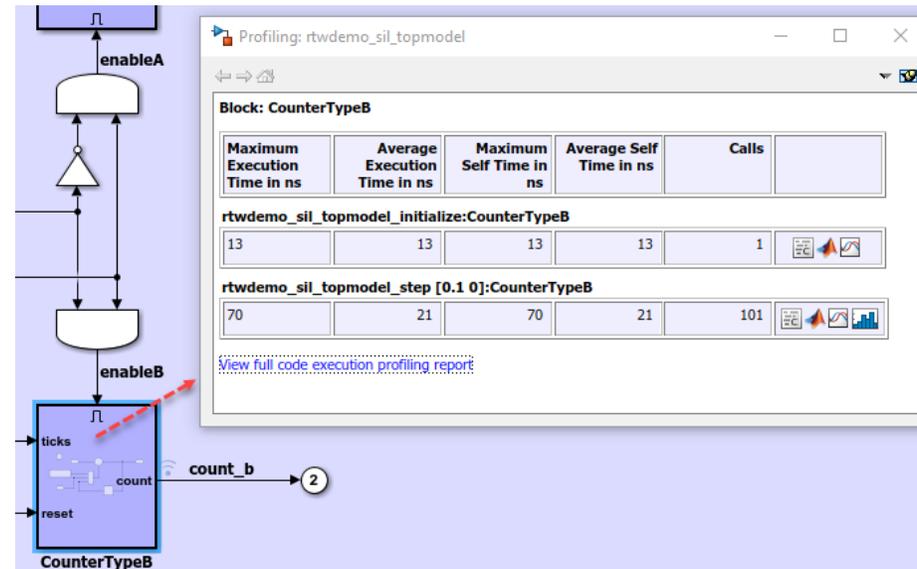
```
1 /*
2  * File: mycode.c
3  *
4  * Code generated for Simulink model 'rtwdemo_row_lut2d'.
5  *
6  * Model version           : 1.22
7  * Simulink Coder version  : 9.1 (R2019a) 23-Nov-2018
8  * C/C++ source code generated on : Tue Apr 16 15:15:58 2019
9  *
10 * Target selection: ert.tlc
11 * Embedded hardware selection: Specified
12 * Code generation objectives: Unspecified
13 * Validation result: Not run
14 */
15
16 #include "rtwdemo_row_lut2d.h"
17
18 /* Exported data definition */
19
20 /* Definition for custom storage class: ExportToFile */
21 real_T P[3][2] = { { 1.0, 2.0 }, { 3.0, 4.0 }, { 5.0, 6.0 } };
22
23 /*
24  * File trailer for generated code.
25  *
26  * [EOF]
27  */
28
```

At the bottom right of the window are 'OK' and 'Help' buttons.

# Code Execution Profiling with SIL and PIL

Execution  
Speed

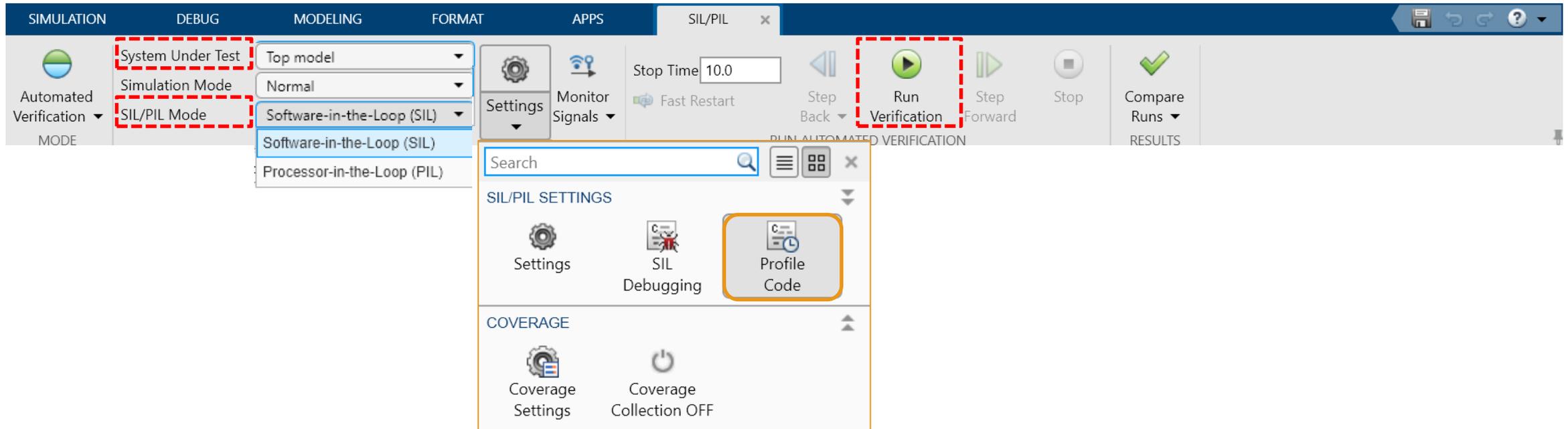
- Produce execution time metric for tasks and functions in the generated code
  - Measure execution time, self time, CPU utilization and number of calls
  - Identify tasks that require the most execution time
  - In these tasks, investigate code sections that require the most execution time



# Code Execution Profiling with SIL and PIL

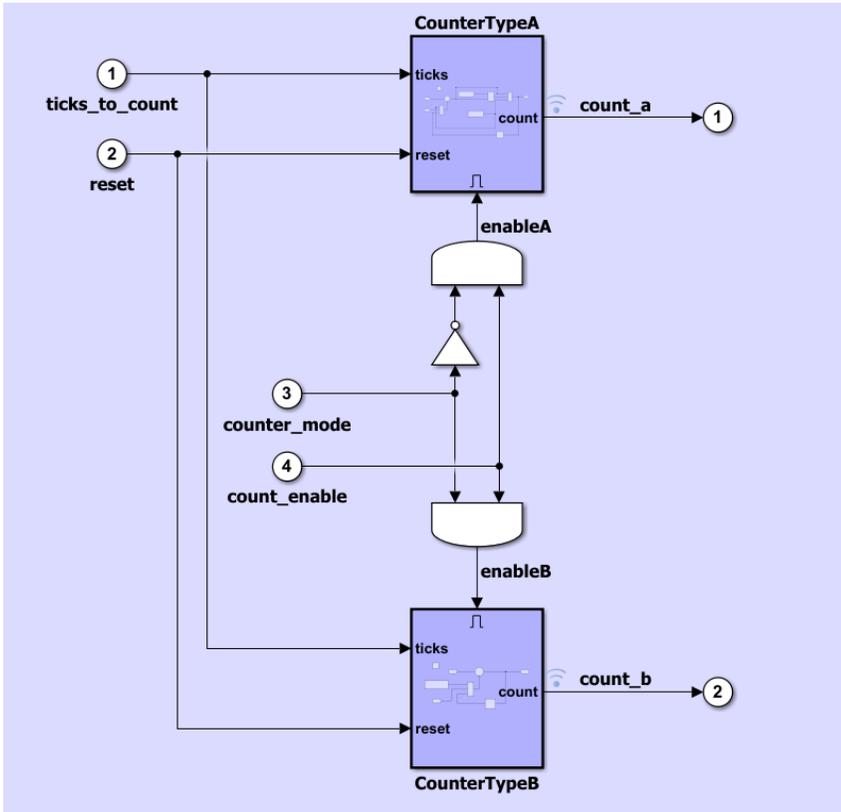
Execution Speed

- How to Generate Execution-Time Metrics in SIL/PIL Manager



# Improving Code and Model Performance

Execution Speed



Profiling: rtwdemo\_sil\_topmodel

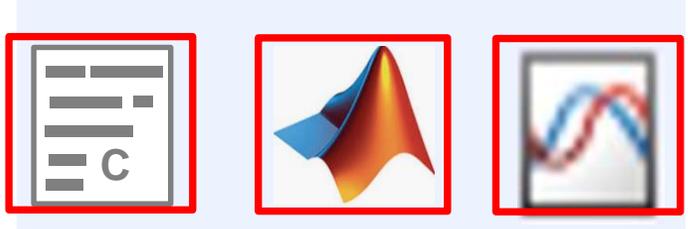
Model: rtwdemo\_sil\_topmodel

Maximum Execution Time in ns	Average Execution Time in ns	Maximum Self Time in ns	Average Self Time in ns	Calls
<b>rtwdemo_sil_topmodel_initialize</b>				
112	112	66	66	1
<b>rtwdemo_sil_topmodel_step [0.1 0]</b>				
2735	171	2652	101	101

[View full code execution profiling report](#)

# Improving Code and Model Performance

Execution Speed



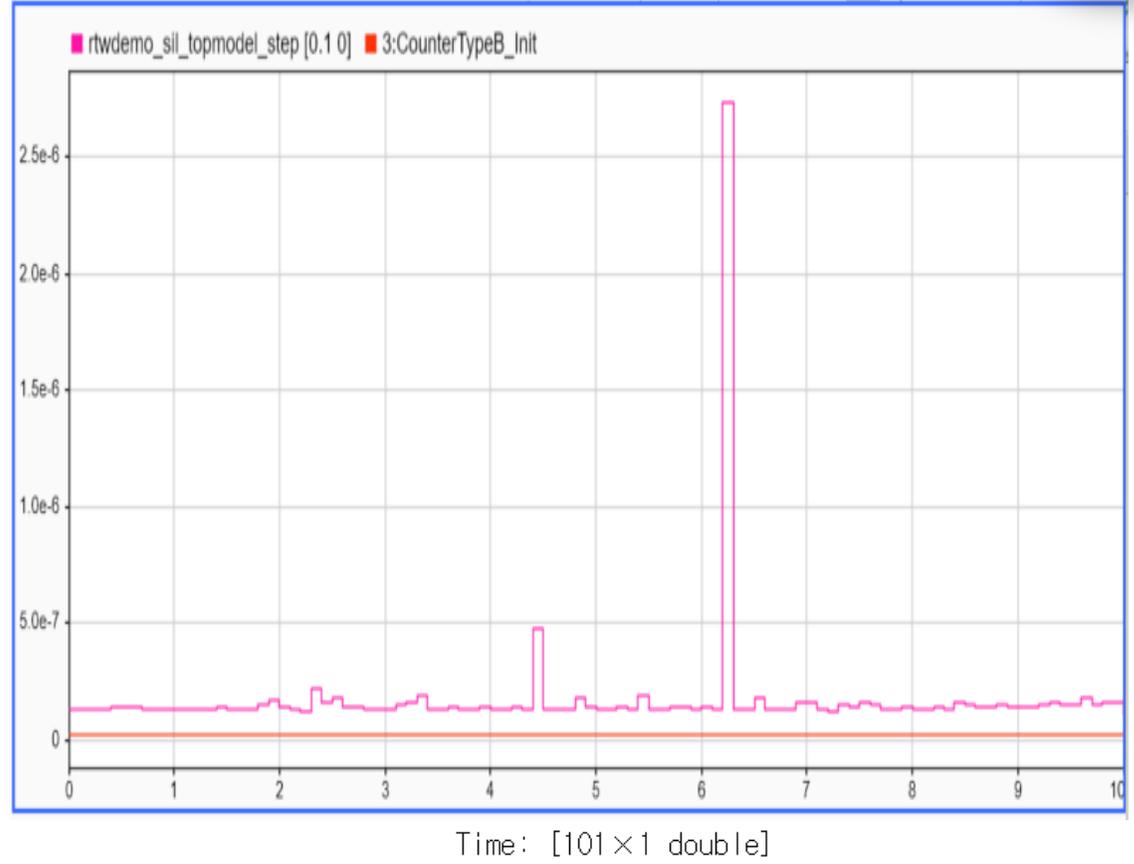
Profiling: rtwdemo\_sil\_topmodel

Model: rtwdemo\_sil\_topmodel

Maximum Execution Time in ns	Average Execution Time in ns	Maximum Self Time in ns	Average Self Time in ns	Calls
<b>rtwdemo_sil_topmodel_initialize</b>				
112	112	66	66	1
<b>rtwdemo_sil_topmodel_step [0.1 0]</b>				
2735	171	2652	101	101

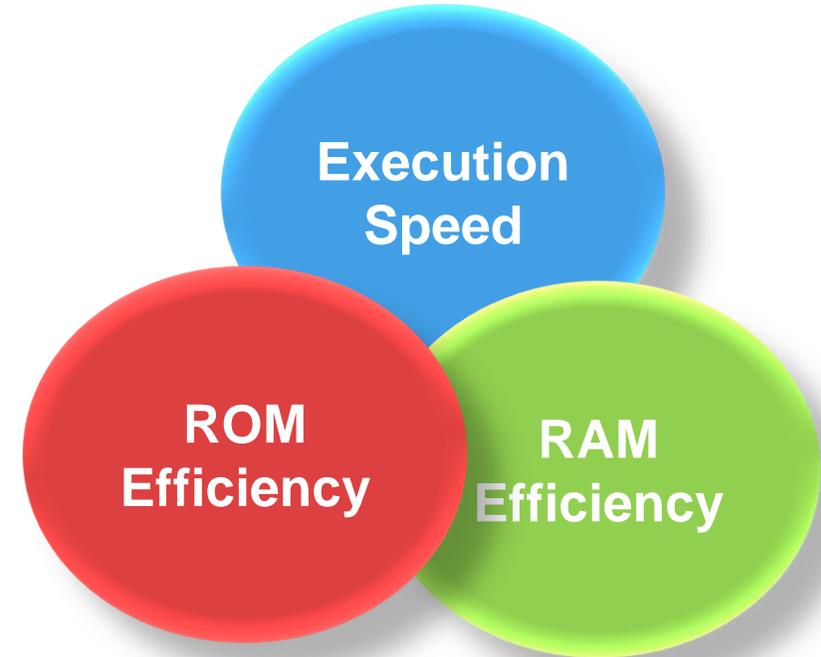
[View full code execution profiling report](#)

```
>> out.get('executionProfile').Sections(4)
```



# Key Takeaway

- Improving Modeling Patterns for Efficiency
  - Clone detection, memory efficiency
- RAM and Data Copy Reduction
  - Buffer reuse, reduction data copy
- Execution Speed
  - Row-major and column-major
  - Code execution profiling



**Thank You !!**