## MathWorks AUTOMOTIVE CONFERENCE 2018

## Design and Test Traffic Jam Assist

A Case Study Using Automated Driving System Toolbox<sup>TM</sup>

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#### **Evolution of ADAS and Autonomous Driving Car Technologies**





#### ACC and Lane Following Control for Traffic Jam Assist

#### Automated Driving System Toolbox™ R2017b R2018a



ACC (Longitudinal Control)



Lane Following (Lateral Control) **R**2018**b** 



Traffic Jam Assist (Longitudinal + Lateral Control)



#### **Traffic Jam Assist**

- It helps drivers to follow the preceding vehicle automatically with a predefined time interval in a dense traffic condition
- ... while controlling steering for keeping current lane.



Lateral control with lane following



- Partial/conditional automation at level 2/3
  - Speed limit < 60~65 km/h</li>
  - Dense traffic condition in highway



#### Automated Driving System Toolbox™ Design and Test Traffic Jam Assist, A Case study







#### Design ACC and Lane Following Controller

- Create driving scenario
- Synthesize sensor detection
- Include Vehicle Dynamics
- Design sensor fusion algorithm
- Design controller using MPC

#### Automate Regression Test

- Define performance evaluation metrics
- Develop test cases
- Build test suites
- Verification and validation

#### Generate and Verify Code

- SIL test
- Code generation
- Coverage test



- ACC operation limits
  - Minimum operational speed,  $v_{min}$  = 5m/s
  - Average automatic deceleration of ACC  $\leq 3.5 \text{ m/s}^2$  (average over 2s)
  - Average automatic acceleration of ACC  $\leq$  2.0 m/s<sup>2</sup>

MathWorks<sup>®</sup>



#### **Lane Following Performance Requirements**

Vehicle should follow the lane center with allowable lateral deviation.

$$\left| (d_{left} + d_{right})/2 \right| \le e_{max}$$

where,

 $d_{left}$ : lateral offset of left lane w.r.t. ego car

 $d_{right}$ : lateral offset of right lane w.r.t. ego car

 $e_{max}$  : allowable lateral deviation

For example,  $e_{max} = (LaneWidth - VehicleWidth)/2 = (3.6-1.8)/2 = 0.9 \text{ m}$ 



#### Automated Driving System Toolbox™ **Create Test Scenario using Driving Scenario Designer**



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R2018a



#### Simulation with Simulink Model for Traffic Jam Assist



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## Simulation with Simulink Model for Traffic Jam Assist





#### **Architecture for ACC and Lane Following Controller**





#### **Architecture for ACC and Lane Following Controller**





## What is model predictive control (MPC)?

- Multi-variable
   control strategy
   leveraging an internal
   model to predict plant
   behavior in the near
   future
- Optimizes for the current timeslot while keeping future timeslots in account



- Mature control solution used in industrial applications
- Gaining popularity in automated driving applications to improve vehicle responsiveness while maintaining passenger comfort



#### What is model predictive control (MPC)?





#### How can MPC be applied to ACC?





#### How can MPC be applied to ACC and lane following control?



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#### Internal MPC model for ACC and Lane Following Controller



Longitudinal model for ACC

#### Measured outputs (OV)

- Relative distance (*D<sub>relative</sub>*)
- Ego velocity ( $V_{ego}$ )
- Lateral deviation  $(E_{lateral})$
- Relative yaw angle  $(E_{yaw})$

 $\begin{pmatrix} D_{relative} \\ V_{ego} \\ E_{lateral} \\ E_{yaw} \end{pmatrix} = sys \begin{pmatrix} a \\ V_{mio} \\ \delta \\ \rho \end{pmatrix}$ 

Lateral model for Lane Following



#### Manipulated variables (MV)

- Acceleration (*a*)
- Steering angle ( $\delta$ )

#### **Measured disturbance (MD)**

- MIO velocity (V<sub>mio</sub>)
- Previewed road curvature ( $\rho$ )



#### Longitudinal and Lateral Model for MPC

Longitudinal Model for ACC

$$\frac{d}{dt} \begin{bmatrix} \dot{V}_{x} \\ V_{x} \\ D_{relative} \end{bmatrix} = \begin{bmatrix} -\frac{1}{\tau} & 0 & 0 \\ 1 & 0 & 0 \\ 0 & -1 & 0 \end{bmatrix} \begin{bmatrix} \dot{V}_{x} \\ V_{x} \\ D_{relative} \end{bmatrix} + \begin{bmatrix} \frac{1}{\tau} & 0 \\ 0 & 0 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} a \\ V_{mio} \end{bmatrix}$$
$$\begin{bmatrix} D_{relative} \\ V_{x} \end{bmatrix} = \begin{bmatrix} 0 & 0 & 1 \\ 0 & 1 & 0 \end{bmatrix} \begin{bmatrix} \dot{V}_{x} \\ V_{x} \\ D_{relative} \end{bmatrix}$$

Lateral Model for Lane Following

$$\frac{d}{dt} \begin{bmatrix} V_{y} \\ \dot{\phi} \\ E_{lateral} \\ E_{yaw} \end{bmatrix} = \begin{bmatrix} -\frac{2C_{f} + 2C_{r}}{mV_{x}} & -V_{x} - \frac{2C_{f}l_{f} - 2C_{r}l_{r}}{mV_{x}} & 0 & 0 \\ -\frac{2C_{f}l_{f} - 2C_{r}l_{r}}{I_{z}V_{x}} & -\frac{2C_{f}l_{f}^{2} + 2C_{r}l_{r}^{2}}{I_{z}V_{x}} & 0 & 0 \\ 0 & 1 & 0 & 0 & V_{x} \\ 0 & 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} V_{y} \\ \dot{\phi} \\ E_{lateral} \\ E_{yaw} \end{bmatrix} + \begin{bmatrix} \frac{2C_{f}}{m} & 0 \\ \frac{2C_{f}l_{f}}{l_{z}} & 0 \\ 0 & 0 \\ 0 & -1 \end{bmatrix} \begin{bmatrix} \delta \\ V_{x}\rho \end{bmatrix}$$
$$\begin{bmatrix} E_{lateral} \\ E_{yaw} \end{bmatrix} = \begin{bmatrix} 0 & 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} V_{y} \\ \dot{\phi} \\ E_{lateral} \\ E_{yaw} \end{bmatrix}$$







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#### **Simulation result assessment**





#### **Performance Indicator**





#### **Performance Indicator**





#### Performance indicator and dashboard in Simulink model



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#### **Test scenarios (1/4)**

HW : Headway HWT : Headway time v\_set : set velocity for ego car

No	Test Name	Test Description	Host car	Lead car	Third car	Spec
1	ACC_01_ISO _TargetDiscriminationTest	Target Discrimination Test	initial velocity = 30m/s HWT = 2.2sec (HW = 66m) v_set = 30m/s	constant accel 24m/s $\rightarrow$ 27m/s @ 2m/s <sup>2</sup> $V_{end} = 27m/s (97.2kph)$	24m/s	ISO 15622 ISO 22178
2	ACC_02_ISO _ AutoDecelTest	Automatic Deceleration Test	initial velocity = 15m/s HWT = 2.2sec (HW = 33m) v_set = 15m/s	initial velocity = 13.9m/s decelerates to full stop with 2.5m/s <sup>2</sup>	none	ISO 22178
3	ACC_03_ISO _AutoRetargetTest	Automatic Retargeting Capability Test	initial velocity = 15m/s HWT = 2.2sec (HW = 33m) v_set = 15m/s	initial velocity = 13.9m/s Lead car changes lane @ HWT=3s to overtake slow moving car	constant speed = 2.1m/s	ISO 22178



HW : Headway HWT : Headway time v\_set : set velocity for ego car

## **Test scenarios (2/4)**

No	Test Name	Test Description	Host car	Lead car	Third car	Spec
4	ACC_04_ISO _CurveTest	Curve Capability Test (curvature of test track = 1/500 m)	initial velocity = 31.6m/s HWT = 1.5sec (HW = 47.4m) v_set = 31.6m/s	sinitial velocity = 31.6m/s Drive at a constant speed for 10s, decrease speed by 3.5m/s in 2s, and keep it constant.	none	ISO 15622 ISO 22178
5	ACC_05_StopnGo	Stop and Go in highway	initial velocity = 27m/s HWT = 1.5sec (HW = 40.5m) v_set = 27m/s	initial velocity = 27m/s Lead car slows down to 15m/s at -3m/s <sup>2</sup> and stay constant for 7s, then speed up to 25m/s at 2.5m/s <sup>2</sup>	8 slow moving cars at 12m/s in the second lane	Real-world scenario



#### **Test scenarios (3/4)**

HW : Headway HWT : Headway time v\_set : set velocity for ego car

No	Test Name	Test Description	Host car	Lead car	Third car	Spec
6	LFACC_01_DoubleCurve _DecelTarget	Automatic Deceleration Test	initial velocity = 22m/s	initial velocity = 22m/s	none	Real-world scenario
			HWT = 2sec	Drive at a constant speed for		
	(Similar with ACC_04_150 CurveTest)		(HVV = 44M)	about 11s, decrease speed by 3 5m/s in		
			v set = 22m/s	2s (deceleration: $-1.8 \text{ m/s}^2$ )		
				and keep it const.		
				Velocity 21 21 21 21 21 21 21 21 21 21		
				<sup>1</sup> / <sub>2</sub> -1.8m/s <sup>2</sup> -1.5 -20 6 10 16 20 25 30		
7	LFACC_02_DoubleCurve	Automatic Retargeting Capability Test	initial velocity = 15m/s	initial velocity = 13.9m/s	Slow moving	~ISO 22178
	_AutoRetarget_TooSlow			Load car changes lang @	car at	
	(Similar with ACC 03 ISO		(HW = 43m)	HWT=3s to overtake slow	speed =	
	_AutoRetargetTest)		(	moving car	2.1m/s	
			v_set = 15m/s			
8	LFACC_03_DoubleCurve	Automatic Retargeting Capability Test	initial velocity = 15m/s	initial velocity = 13.9m/s	Slow moving	~ISO 22178
	_AutoRetarget			Load car changes lang @	car at	
	(Similar with ACC 03 ISO		(HW = 43m)	HWT=3s to overtake slow	speed =	
	_AutoRetargetTest)			moving car	10m/s	
			v_set = 15m/s			



#### **Test scenarios (4/4)**

HW : Headway HWT : Headway time v\_set : set velocity for ego car

Nc	Test Name	Test Description	Host car	Lead car	Third car	Spec
9	LFACC_04_DoubleCurve	Stop and Go in curved highway	initial velocity = 14m/s	initial velocity = 14m/s	10 slow	Real-world
	_Stophed (Similar with ACC_05_StopnGo)		HWT = 3.6sec (HW = 50m) v_set = 14m/s	Lead car slows down to 8m/s at -1.7m/s <sup>2</sup> and stay constant for 10s, then speed up to 13m/s at 1.3m/s <sup>2</sup> $t_{0}^{-1}$	at 8m/s in the 3 <sup>rd</sup> lane 3 fast moving cars at 15m/s in the 1 <sup>st</sup> lane	Scenano
10	LFACC_05_Curve	Lead car cut in and out in curved highway	initial velocity = 20.6m/s	sInitially, fast moving car	Slow moving	Real-world
	_CutInOut	(curvature of road = 1/500 m)	L 11 A / T /	(orange) at 19.4m/s	car (purple) at	scenario
			HVVI = 4Sec	Passing car (vollow) at	11.1m/s in the	
			((1)) = ~0011)	19 6m/s cut in the ego path		
			v_set = 21.5m/s	with HWT=2.3s,		
				then cut out		
				Representat	ive test s	cenario
11	LFACC_06_Curve	Lead car cut in and out in curved highway	initial velocity = 20.6m/s	sInitially, fast moving car	Slow moving	Real-world
	_CutInOut_IooClose	(curvature of road = 1/500 m)	HMT = 4000	(orange) at 19.4m/s	car (purple) at	scenario
			HW = -80m	Passing car (vellow) at	2 <sup>nd</sup> lane	
				19.6m/s cut in the ego path		
			v_set = 21.5m/s	with HWT=1.5s,		
				then cut out		



#### **Test Manager in Simulink<sup>®</sup> Test**<sup>™</sup>

Automate Simulink model testing using test cases with pass-fail criteria





## **Requirements Editor**

Requirements Editor		- 🗆 X	
File Edit Display Analysis Report Help	Requireme	ents description	
🔥 🗀 📮 🗟 🖻 👗 🐴 👘 🔸 🤮	✓ Properties		
View: Requirements	Index: 10		
Index ID Summary Verified	Custom ID: 10		
ACCTestRequirements	Summary: LFACC_Curve_CutInOut		
1 ACC_ISO_TargetDiscriminationTest	Description Rationale		
2 2 ACC_ISO_AutoDecelTest	Arial	✓ 8 ✓ B I U ■ ≣ ≡ ≡ □ ✓ ▲	
3 3 ACC_ISO_AutoRetargetTest	Test Description	Host car Lead car	
4     4     ACC_ISO_CUrveTest       5     5     ACC_StopnGo	Lead car cut in and out in curved highway	initial velocity = 20.6m/sInitially, fast moving car	
6 6 LFACC_DoubleCurveDecelTarget	(curvature of read = 1/500  m)	(orango) at 10 4m/s	
7 7 LFACC_DoubleCurve_AutoRetarget_Too		(Orange) at 19.4m/s	
8 8 LFACC_DoubleCurve_AutoRetarget		HVVI = 4sec	
9 9 LFACC_DoubleCurveStopnGo		(HW = ~80m) Passing car (yellow) at	
10     10     LFACC_Curve_CutInOut		19.6m/s cut in the ego	
		v_set = 21.5m/s path with HWT=2.3s,	
List of Requirements		then cut out	
		× 1	
		<b>`</b>	
	Keywords:		
Image: Construction       Properties         Image: Construction       Image: Construction			
<pre>v Properties v requerements v r</pre>			
	□ ⇔ Verified by:		
	□ LFACC 05 Curve CutinOut		
	Tes	st result status reflected	
	i i	n Requirements Editor	
	► Comments		



#### Test Report with baseline parameter set for 11 test cases

#### **Report Generated by Test Manager**

Title:	ACCAndLaneFollowing (baseline)
Author:	Seo-Wook Park
Date:	21-Apr-2018 16:01:50

#### **Test Environment**

Platform: PCWIN64 MATLAB: (R2018a)

Note) Baseline parameter set was tuned based on a single test scenario.



Summary		I	POF Jo
Name	Outcome	Duration (Seconds)	
<u>TestScenarios Baseline</u>	8 🕗 3😢	565	
ACCTest	3 🕗 2😣	210	
ACC 01 ISO TargetDiscriminationTest	0	35	
■ <u>ACC 02 ISO AutoDecelTest</u>	8	22	
■ <u>ACC 03 ISO AutoRetargetTest</u>	8	32	
■ ACC 04 ISO CurveTest	0	43	
■ <u>ACC 05 StopnGo</u>	0	73	
LFACCTest	5 🥝 1😣	354	
LFACC 01 DoubleCurve DecelTarget	0	43	
LFACC 02 DoubleCurve AutoRetarget Toos	8	36	
LFACC 03 DoubleCurve AutoRetarget	0	65	
LFACC 04 DoubleCurve StopnGo	0	111	
■ LFACC 05 Curve CutInOut	0	48	
LFACC 06 Curve CutInOut TooClose	0	49	



#### **Fine-tune control parameters (1/3)**





#### **Fine-tune control parameters (1/3)**





#### **Fine-tune control parameters (2/3)**







#### **Fine-tune control parameters (2/3)**





#### **Fine-tune control parameters (3/3)**







#### **Fine-tune control parameters (3/3)**





#### **Baseline vs. Fine-tuned parameters**

Parameter Name	Description	Baseline	Fine-tuned
assigThresh	Detection assignment threshold for multiObjectTracker	50	20
time_gap	ACC time gap (sec)	1.5	2.0
<pre>default_spacing</pre>	ACC safe distance margin (m)	0	10
min_ac	Minimum acceleration (m/s^2)	-3.0	-3.5



#### **Test Report with fine-tuned parameter set for 11 test cases**

#### **Report Generated by Test Manager**

Title:	ACCAndLaneFollowing Fine-tuned
Author:	Seo-Wook Park
Date:	26-Apr-2018 13:53:39

#### **Test Environment**

Platform: PCWIN64 MATLAB: (R2018a)

Summary Name	Outcome	Duration (Seconds)	POF
TestScenarios FineTuned	110	3541	
□ <u>ACCTest</u>	50	1521	
ACC_01_ISO_TargetDiscriminationTest	0	245	
ACC_02_ISO_AutoDecelTest	0	323	
ACC 03 ISO AutoRetargetTest	0	262	
ACC 04 ISO CurveTest	0	331	
<u>ACC_05_StopnGo</u>	0	360	
LFACCTest	6🥑	2015	
LFACC 01 DoubleCurve DecelTarget	0	333	
LFACC 02 DoubleCurve AutoRetarget Toos	٥	380	
LFACC 03 DoubleCurve AutoRetarget	0	291	
LFACC 04 DoubleCurve StopnGo	0	398	
LFACC_05_Curve_CutInOut	0	335	
LFACC_06_Curve_CutInOut_TooClose	0	278	



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#### Simulation with SIL mode

Radar

Detection

Vision Detection

Lane

Detection





#### **Code Generation Report**

Embedded	Cod	er <sup>TM</sup>
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🞦 Code Generation Report	-	$\times$
🗢 🔶 ⋐ Find:	5	
Contents	dL.cpp	^
<u>Summary</u>	ed for Simulink model 'LFRefMdL'.	
Subsystem Report	n : 1.621	
Traceability Report	er version : 8.14 (R2018a) 06-Feb-2018	
Static Code Metrics Report	code generated on : Tue Apr 17 16:58:59 2018	
Code Replacements Report	tion: ert.tlc dware selection: Intel->x86-64 (Windows64)	
Generated Code	ion objectives: Unspecified esult: Not run	
[-] Model files		
LFRefMdl.cpp	Mdl.h" Mdl_private.h"	
<u>LFRefMdl.h</u>	k_YRMETceB.h"	
LFRefMdl_private.h	nts for MATLAB Function: ' <s6>/optimizer'</s6>	
LFRefMdl_types.h	1_nu (2.0)	
[-] Subsystem files	l_nv (3.0) l_ny (4.0)	
LFRefMdl_TrackingandSensor	MATLAD Sunstions 1/00 (ontimizen)	
LFRefMdl_TrackingandSensor	<pre>owingControllerRefMdlModelClass::LFRefMdl_mod(real_T x)</pre>	
[+] Shared files (37)		
[+] SIL/PIL files (36)	(x)) && (!rtIsNaN(x))) {	
	0) {	
< >	<pre>fmod(x, LFRefMdl_ny);</pre>	~
	OK	Help



#### **Aggregated Code Coverage Report**

		<pre>1778 static boolean_T LFRefMdl_objectTrack_checkPromotion(const</pre>	
	~	1779 driving_internal_objectTrack_LFRefMdl_T *track)	
	Summary	1780 {	
	_	1781 boolean_1 topromote;	
	File/Complexity	1782 int32 T h.	
1		1784 boolean T track data[50]:	
Report Generate	TOTAL COVERAGE	1785 int32_T track_size[2];	
Report Generate	1 <u>LFRefMdl.cpp</u>	<u>1786</u> if (track->ObjectClassID != 0.0) {	
	2 LFRefMdl TrackingandS	1787 toPromote = true;	
Title: ACCAndLane	3rtGetInf.cpp	1788 } else {	
Author: Seo-Wook Pa	4rtGetNaN.cpp	<u>1789</u> if ((track->pUsedHistoryLength < track->ConfirmationParameters[1])	
Date: 26-Apr-2018	5rt nonfinite.cpp		X
		Decisions analyzed:	
Test Environment	Summer Dr. M.	(track->pllsedHistorylength < track->ConfirmationParameters[1])    rtIsNaN(track->ConfirmationParameters[1]) 5	50%
rest Environment	Summary By MC		
Platform: PCWIN64		false 1303	8/13038
MATLAB: (R2018a)	Model Object	true	0/13038
	1. <u>LFRefMd1</u>		
	2 <u>Controller</u>	Conditions analyzed:	
	3 <u>MPC Controller</u>	Description: True False	
-	4 <u>MPC</u>		
	5 <u>optimizer</u>	track->pUsedHistoryLength < track->ConfirmationParameters[1] 0 $13038$	
	6 <u>Safe distance</u>		
	7 Estimate Lane Center	rtisNaN(track->ConfirmationParameters[1]) 0 13038	
	8 <u>Center from Left</u>		
	9 <u>Center from Left and I</u>	MC/DC analysis (combinations in parentheses did not occur)	
	10 <u>Center from Right</u>		
	11 MATLAB Function	decision outcomes:	
	12 <u>Preview curvature</u>	Out Out	
	13 Tracking and Sensor Fus	Conditions:	
	14 <u>Clock</u>	$t_{rack} \rightarrow t_{rack} $	
	15 <u>Counter Limited</u>	track-sposednistorytength < track-sconfirmationFarameters[i] (IX) II	
	16 <u>Find Lead Car</u>	rtIsNaN(track->ConfirmationParameters[1]) (FT) FF	
-			42



#### **Design and Test Traffic Jam Assist**

 A Case study Using
 • Automated Driving System Toolbox™
 • MPC Toolbox™
 • VDBS™

 • Simulink™
 • Simulink Test™
 • Simulink Control Design™
 • Embedded Coder™







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## Learn more about Traffic Jam Assist (Lane Following Control) by exploring examples in R2018b

#### Automated Driving System Toolbox<sup>™</sup>



#### Simulink Test<sup>™</sup>





# Thank you for your attention !!

## Email: <a href="mailto:seo-wook.park@mathworks.com">seo-wook.park@mathworks.com</a>