

University of Stuttgart Institute of Industrial Automation and Software Engineering

> Automated Test Scenario Generation for Autonomous Driving from Real-World Traffic Accident Reports: Information Mining of Driving Behaviors and Events

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Electrical Engineering

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- Motivation
- Basis
- Conception Design
- Implementation
- Evaluation and Verification
- Summary and Outlook



Motivation

Current Autonomous Driving Test Methods





Physical testing on public roads

- An engineer supervises the car
- Real-world experience

(!) traffic events are trivial(!) limitation of time and physical space



Simulation Test

- Reproducible, no physical harm
- Not limited to time and physical space

(!) How <u>real</u> are the test cases?(!) How <u>risky</u> are the test cases?

Initial ideas

Real and risky test cases?



The major problem

	D BAFETT ADMINISTRATION	Case Number: 2005-002-004	NR)			
Images Only	Print Friendly Version of Case	Print Friendly Version of Current View	Download XML Source				
MODS Case	the second second	Crash Overview - Summary					
+ Case Summary	Crash Overview						
+ Vehicle 1	Case Number	4					
Vehicle 2	Date	01/2005					
	Day of Week	Friday					
	PAR Time of Crash	09:30					
	Crash Level KABCOU	A - Incapacitating injury					
		ne undivided roadway with a posted speed limit of 48 KPH (30 MPH) and a -2.2% grade. There was an if this early morning weekday crash.	intersecting driveway to the right with a -13.3% grade. The weather was clear, the roadway of	dr			
	obscured the approach of Vehi	care, was traveling north on the two lare undivided readway approaching the driveway. It bloud be note de 2. Vehicle 2, a 2000 Toyota Corolla, was traveling west on the driveway approaching the main roads obtained of the kit side of the readway, over a small outb, onto a private lawn and came to rest fairing a	ray. Vehicle 2 entered the main roadway and was struck in the left side by the front of Vehicle	e .			
		 was driven by a betted 50-year-old male who was transported, treated and released for a complaint o akes and steered right but NI Vehicle 2 on the left side. Vehicle 1 was towed due to damage. 	f pain. Vehicle 1 was traveling north on the roadway and saw Vehicle 2 corning down the driv	ve			
		Vehicle 1 was the encreachment of the other vehicle from a driveway, Intended path not known. The Cr gn, small hill and pole to this driver's right, which may have limited his sight of Vehicle 2's approach. No					
		was driven by a belied 23-year-old female who was transported, treated and hospitalized for 1 day due g the accident. Vehicle 2 was towed due to damage.	to a head injury. The driver of the Corolla stated that she had "blacked out" and did not recall	R			
		The Orbital Present Even for Vehicle 2 was its unknown travel decision. This was chosen do us to indication of tuning left or right and the increased and its done. The Orbital Paesa for the Otheral Paera physical impairment of the ability to act of the driver. An associated factor coded to this driver was the use of prescription medications. The was taking two medications, a listific control pil and an artificiation. They do the crash.					
	Factor Summary						
		Vehicle 1	Vehicle 2				
	Aggressive Behavior						
	Alcohol						
	Cargo Shift						
	Cell Phone Use						
	Decision						
	Distraction						
	Driver Fatigue						
	Driver Inexperience						
	Driver Performance						
	Driver Physical		Present				
	Driver Stress/Emotion						
	Drugs		Present				
	Roadway						
	SneedDistance						

Real Traffic Accident Reports

Unstructured data

<?xml version="1.0" encoding="UTF-8"?> constant of a const <ParameterDeclarations> <ParameterDeclaration name="lea
</parameterDeclarations>
<CatalogLocations/>
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<CaodHetwork>
<LogicFile filepath="Town@1"/>
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</RaadNetwork>
</RaadNet <Entities> <ScenarioObject name="hero"> Schwar Jobuject mames" herb of the scheme sche <BoundingBox> <Center x="1.5" y="0.0" z="0.9"/>
<Dimensions width="2.1" length="4.5" height="1.8"/> </rearXie maxSteering="0.0" wheelDiameter="0.6" trackWidth="1.8" positionX="0.0" positionZ="0.3"/>
</Axles> <Properties> <property name="type" value="ego_vehicle"/> <Property name="color" value="0,0,255"/> </Properties> </Vehicle> </ScenarioObject> </crearioubject name="adversary">
 </crearioubject name="adversary"
 <Axles> <FrontAxle maxSteering="0.5" wheelDiameter="0.6" trackWidth="1.8" positionX="3.1" positionZ="0.3"/> <RearAxle maxSteering="0.0" wheelDiameter="0.6" trackWidth="1.8" positionX="0.0" positionZ="0.3"/> </Axles> <Properties> <Property name="type" value="simulation"/>
<Property name="color" value="255,0,0"/> </Vehicle> </ScenarioObject> </Entities> <Storyboard> <Init> <Actions> <GlobalAction> <EnvironmentAction> <Environment name="Environment1"> <inuering also an allow and also allow and also allow and allow all

Simulation Cases (OpenSCEANARIO file)

Store the structured information of a

driving scenario



Natural Language Processing

- Motivation
- Basis
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Basis

Large Language Models





Solve a complex task

Answer a question

Generation capability

→ Generate test cases?

LLM fails

X		Case Number: 2005-002-004			
d Images Only Prin	t Friendly Version of Case	Print Friendly Version of Current View	Download XML Source		
CIUMAR CALIF	CONTRACT OF STATE	Crash Overview - Summary	DOW MAD AND DOUGH		
IVOCS Case	Crash Overview	Crash Overview - Summary			
+ Case Summary	Case Number	4			
Vehicle 1	Case number	4 01/2005			
Vehicle 2	Day of Week	Friday			
	PAR Time of Crash	09:30			
	Crash Level KABCOU	A - Incapacitating injury			
	Citati Certi Interco	A - mapananty oper			
	and it was daylight at the time of Vehicle 1, a 1996 Chernold Bas document be approach of Vehicle Control of Vehicle 2 was robatic control of the Chernold Baser (Vehicle 2) at to the right. He part on his the time of the Percensite Event of the control water Percensite Event of the control water to the central percenting accident of the events preceding accident of the events preceding the Too Critical Percensite Event for the percent percensite accident of the events preceding the Too Critical Percensite Event for the the Percensite Event Science (Science 1) the Too Critical Percensite Event for the percent percent percent percent for the Percent Percent Percent for the too the term of the percent percent for the percent percent for the percent percent percent for the percent	This way homore seeksing years. This way homore seeksing years and years hereing your homore barries which is not known, approaching the only way and years and years of the processing of the processing way only the processing years and years and years of the processing years and years of the processing years and other the years of the processing years and years and years and years and other the years of the processing years and years and years and years and years and years and years and years and years and years and years way multiple and years and years and years and years and years way multiple and years and years and years and years and years years and years and years and years and years and years and years and years and years and years and years and years and years years and	Is bandy comb to the low buy excluded notably spectrality to memory. If hold is noted that man as hope sign, and this is not induces point to the form' right, which we put is a 2000 Topic Control to the memory. If hold is the memory and the memory and the memory of the set of the memory of the set of the memory and the memory of the set of the set of the set of the memory of the memory of the memory of the set of the		
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	Cathar annually	Vehicle 1	Vehicle 2		
	Appressive Behavior				
	Alcohol				
	Caroo Shift				
	Cell Phone Use				
	Decision				
	Distraction				
	Driver Fatigue				
	Driver Inexperience				
	Driver Performance				
	Driver Physical		Present		
	Driver Stress/Emotion				
	Drugs		Present		
	Readway				

Real Traffic Accident Reports

ChatGPT

Creating a complete OpenSCENARIO file based on the detailed accident report you provided would be quite complex, as it requires a deep understanding of both the OpenSCENARIO XML schema and the specific details of the accident. However, I can provide you with a basic structure for an OpenSCENARIO XML file that you could expand upon. Here's a simplified example:

- (!) LLM fails in generating OpenSCENARIO files
- (!) Hallucination

Hypothesis Add a new ingredient: Ontology



- Ontology provide more semantic information
- Reference to understand domain concepts and knowledge

Basis

Ontology



[6]

- concepts in a specific domain
- structured framework
- consistent understanding

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Conceptual Design



- (1) Design the ontology
- (2) Integration of ontology and LLM

Fundamental Ontology Creation How to create the ontology?



Conduct Comprehensive Literature Research	 Google Scholar Keywords: "driver v driving" "behavior v event v style v maneuver " "classification v detection v recognition" Literature Research: Academic papers Cuidance decuments
Define Key Concepts and Entities	Guidance documents Driving license test questions Basic Driving Behaviors • Driving straight • Lane change • Turn • Turn
	• Stop
Define the Relationship between Entities	 Reversing Acceleration Deceleration Maintain speed



Conceptual Design



- (1) Design the ontology
- (2) Integration of ontology and LLM

Conceptual Design



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NHTSA Crash Viewer

NMVCCS (2005-2007)

			Page: 1 v next >	Ca	ses 1-40 of 81
#	Case String	Vehicle Count	Severity	Case ID	
1	2005-002-004	2	A - Incapacitating injury	2005002229042	
2	2005-003-017	2	A - Incapacitating injury	2005003588301	
3	2005-005-035	2	A - Incapacitating injury	2005005289462	
4	2005-009-002	2	A - Incapacitating injury	2005009276021	
5	2005-011-076	2	A - Incapacitating injury	2005011269063	
6	2005-013-042	2			
7	2005-013-017			S Case Viewer	/
8	2005-043-053	\ / 👬 NH I 5		nber: 2005-049-142	
9	2005-045-112	ext and images Only	CHISTRATION C	ase ID: 2005049603789 Print Friendly Version of Current View	Download June Source
10	2005-048-016	NMVCCS Case + Case Summary	Crash Overview	Crash Overview - Summary	
11	2005-048-005	Vehicle 1 Vehicle 2	Case Number 142 Date 11/2005 Day of Week Saturday		
12	2005-048-052		PAR Time of Crash 15.02 Crash Level KABCOU A - Incapacitating inju	y.	
			nod is a 4-line divide concete making from north to south. It crash which are (V1), a 2002 from a strain of the south of the south in formise with one passenger, it south of the south in the future at a southeast V 2 related counter circlestee after the impact, and in due to longer the mit the souther. South of the souther mode to longer the south is used. The souther the souther mode to longer the souther to view.	at a interaction with traffic lights. The quesce limit for the conclusion is in §4 hingh- and a schering theory with graphical considery more to scars. The radie of a scale schering theory with the second laws of hydits approaching the interaction is well advected as a schering theory of hydits approaching the interaction with north. It came is nest within the interaction listicg subtracts. The other of org. onesting many privacity interaction. The other and the other advected lay to the other privacity interaction. The other and the other end of authorized lay to the other privacity interaction. The other and the interaction authorized lay to the other privacity interaction. The other and the interaction authorized lay to the other privacity interaction. The other and the interaction authorized lay to the other privacity interaction. The other and the interaction authorized lay to the other privacity interaction. The other and the other authorized lay to the other privacity interaction. The other and the other authorized lay to the other privacity interaction. The other and the other authorized lay to the other privacity interaction. The other and the other authorized lay to the other privacity interaction. The other and the other authorized lay to the other privacity interaction. The other and the other authorized lay the other and the other and the other and the other authorized lay to the other privacity interaction. The other and the other authorized lay the other and the other and the other and the other authorized lay the other and the other authorized lay the other and the other and the other and the other and the other authorized lay the other and the other and the other and the other and the other authorized lay the other and the other and the other and the other and the other and the other and the other and the other and the other and the other and	face was dry and there were no detrimental all of both notehange. Which is how (V2), a 1907 Mar of V2. Y1 related courser conclusions and co V 2 was transported to a local medical facility f all event was coded to V1 as a driver related fac a vehicle.
			Aggressive Behavior	Vehicle 1	Vehicle 2
			Carpa Shift Carpa Shift Distriction Distriction Distriction Distriction Distriction District Parlamente District Parlamente District Parlamente Distriction Distri	Preset	



XML Source

<XML_CASESUMMARY>

SUMMARY>This two-vehicle collision occurred in a four-way int south traffic controlled by a stop sign. Both roadways were th lane at the intersection), undivided, straight and level. The roadways was 72 kmph (45 mph). No adverse weather conditions p daytime crash. Vehicle one (V1), a 1992 Ford Aerostar, was tra intending to pass through the intersection. V2, a 2005 Volkswa in lane one of the eastbound roadway, also intending to travel intersection. V1 driver failed to notice the stop sign or V2 a and went through intersection without stopping. V2 driver noti intersection without slowing down and accelerated into interse of avoiding collision. In the intersection, the front of V1 st V2. V1 rotated counterclockwise, crossed two additional lanes four-quarter turns off the left side of roadway. During the ro struck a small sawhorse type traffic sign. V1 came to rest on V2 rotated counterclockwise and came to rest in middle of east southeast. V1 driver, a fifty-eight-year-old male, was driving nearby town to his home. He indicated that he had slept eight woke rested. He has been diagnosed with sleep apnea and sleeps also takes Zestril, a medication for high blood pressure, in a Lopressor. The driver rarely drives this route and indicated t attention as he drove through the intersection. He stated he l did not realize he had a stop sign, nor V2's presence. The cri V1 was coded: this vehicle traveling/ crossing over (passing t critical reason for the critical event was attributed to V1 dr survey roadway for both crossing traffic and traffic control d Inadequate surveillance (e.g. failed to look, looked but did n V2 driver, a forty-year-old female, was driving from church to route. She was well rested and had been driving only about 15 Synthroid, a medication to treat hypothyroidism. The critical coded: other vehicle encroachment/ from crossing street, acros reason for the crash was not assigned to the driver of V2.</SU </XML_CASESUMMARY>

Structured prompt



Dutput

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Police Repor

<u>×</u>

Ontology

Contains

Driving Behavior

Concepts Prompt 1 <u>₩</u>

-2-

Ontology

Contains

OpenSCENARIO

Concepts

Prompt 2

OpenSCENARIO

Structured prompt



XML

ΤΞ

Police Report

<u>.</u>

Ontology

Contains

<u> – w</u>

-2-

Ontology

Contains

OpenSCENARIO

OpenSCENARIO

System Overview



- Motivation
- Basis
- Conception Design
- Implementation
- Verification
- Summary and Outlook



Verification

Comparison of Ontology Integration in Behavior Identification

Information extraction with ontology	Information extraction without ontology
 V1: 1999 Ford Ranger Behavior: stop, driving straight, collision, stop V2: 1992 Peterbilt Conventional 379 tractor Behavior: driving straight, collision, stop 	 V1: 1999 Ford Ranger Behavior: traveling southbound, attempting to cross the intersection, impacted by V2, departed towards southeast of the intersection, impacted with a telephone guy wire. V2: 1992 Peterbilt Conventional 379 Behavior: traveling eastbound in the second lane, observed V1 stationary, impacted the right side of V1, departed the left side of the road, rested northeast of the intersection.
Concise, Structured Mapping to predefined ontology elements	Uncontrolled generation (non-deterministic) Not compliant with OpenSCENARIO → Hallucination

Verification

10 traffic accident reports

comparison	Required information elements	Information elements generated	correct generated elements	Generation Rate	Information Element Correctness
without ontology	30(for each)	6.3	2.4	0.21	0.08
with ontology	30(for each)	16.8	13.8	0.56	0.46

- Motivation
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Summary and Outlook

Summary:

- Combining ontology with LLMs enhance behavior identification from crash reports
- With ontology get a higer generation rate in OpenSCENARIO

Outlook:

- Validation Test the file in simulation environment.
- Include more data sources to satisfy the required information by OpenSCENARIO files.
- Whether the model really "understand" the scenario (the model of dynamics)? Or mimic the pattern in text-data?



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Thank you!



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University of Stuttgart



Quelle

- <u>https://www.gamearter.com/blog/bmw-autonomous-driving-development</u>
- <u>https://www.audi.com/en/innovation/future-technology/autonomous-driving/driverless-</u> <u>test-drives-in-china.html</u>
- <u>https://thelowdown.momentum.asia/the-emergence-of-large-language-models-llms/</u>
- https://arxiv.org/pdf/1706.03762.pdf
- <u>https://www.ontotext.com/knowledgehub/fundamentals/what-are-ontologies/</u>

How system works?

Role and goal:

You are a data extractor to extract information from the input text. Your goal is to extract the process of the collision. You should consider the provided context, instructions, and example. Context:

The input data come from a crash report.

Instructions:

As information extractor, please read the crash report carefully and extract the following information: The trajectory of each vehicle: initial location, collision location, stop location.

The behavior of each vehicle, match the driving behavior ONLY based on the given range: collision, driving straight turn, turn back, stop, reversing, acceleration, deceleration and maintain speed.

For extracting these behaviors, refer to the provided definitions of these behaviors:

Driving straight: The act of operating a vehicle in a straight line, maintaining a constant course in a single lane Lane change: The act of moving a vehicle from one lane to another on a multi-lane road, typically executed to over vehicle. At the end of the event, the vehicle should be in the neighboring lane.

Turn: The act of changing the direction of a vehicle by rotating its wheels, typically either to the left or to the Turn back: The act of making a 180-degree turn to reverse the direction of travel.

Stop: The act of bringing a vehicle to a complete halt, usually by applying the brakes.

Reversing: The act of operating a vehicle in a direction opposite to its normal forward movement, often achieved b vehicle in reverse gear.

Acceleration: The act of increasing the speed of a vehicle by applying pressure to the accelerator.

Deceleration: The act of reducing the speed of a vehicle, usually by releasing the accelerator or applying the brai Maintain speed: The act of keeping a vehicle moving at a constant speed, typically by using cruise control or cons ion the accelerator.

From the beginning until the two cars stop, the whole process is divided into 3 to 5 behaviors in chronologica Only use the input data that are given.

Only output the desired format.

Example: Input: //

Dutput: //

V1: name

trajectory: initial location, collision location, stop location.

behavior: behavior1, behavior2, behavior3...

V2: name

trajectory: initial location, collision location, stop location. behavior: behavior1, behavior2, behavior3...

Input: {extracted_text}
Output:



?xml version="1.0" encoding="UTF-8"? OpenSCENARIO>

pensciender revNajor="1" revNinor="0" date="2020-03-20112:00:00" description="CARLA:FollowLeadingVehicle" author=""/>
<prameterDeclarations>

South control control of a stop sign a stop sign as the future of the stop sign and a stop sign. South control with a stop sign. So the stop with a stop with a stop sign. So the stop with a stop with with a stop with with with with with a stop with with with wit

V1: 1999 Ford Expedition

behavior: driving straight, failed to stop at stop sign, collision, rolled over two quarter turns,



V2: 2001 Dodge Ram 1500 truck↔

behavior: driving straight, collision, stop.↔

reason for the crash was not assigned to the driver of V2.</SUMMARY> </XML_CASESUMMARY>

<Properties> <Property name="type" value="simulation"/>

<Property name="color" value="255,0,0"/>
</Properties>

</Vehicle>

</ScenarioObject> </Entities>

<Storyboard> <Init>

stop.

<Actions>

-EnvironmentAction> <Environment name="Environment1"> <TimeOTay animation="false" dateTime="2020-03-20T12:00:00"/>





