

HOW SAFE IS SAFE ENOUGH?

Measuring and Predicting Autonomous Vehicle Safety



Regulatory Policy for Autonomous Vehicle Safety & Deployment



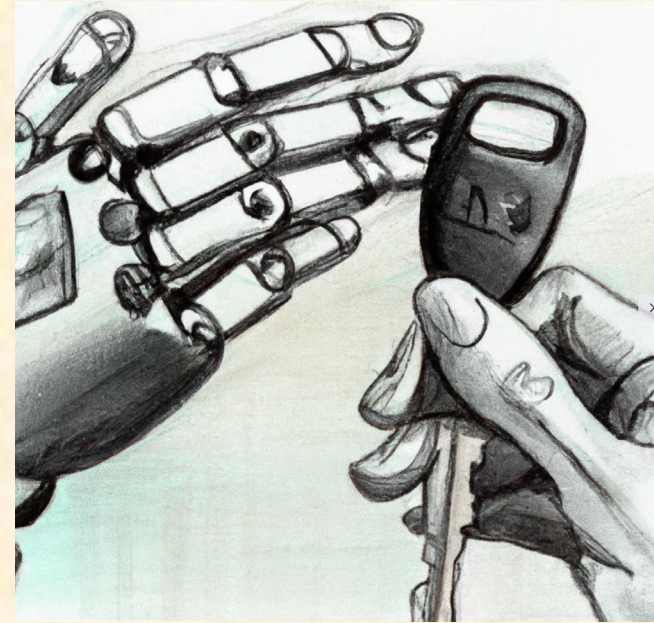
Prof. Philip Koopman

November 2022

www.Koopman.us

Carnegie
Mellon
University

- **Autonomous Vehicles (AVs):**
 - Sold on safety
 - But so far safety is aspirational
- **Industry response to slow progress**
 - Automotive safety disinformation
 - Promoting a non-safety standard for regulators to use (SAE J3016)
- **This can be fixed**
 - Base regulations on human driver safety responsibility
 - Involve more stakeholders on deployment decisions



[Dall-e]

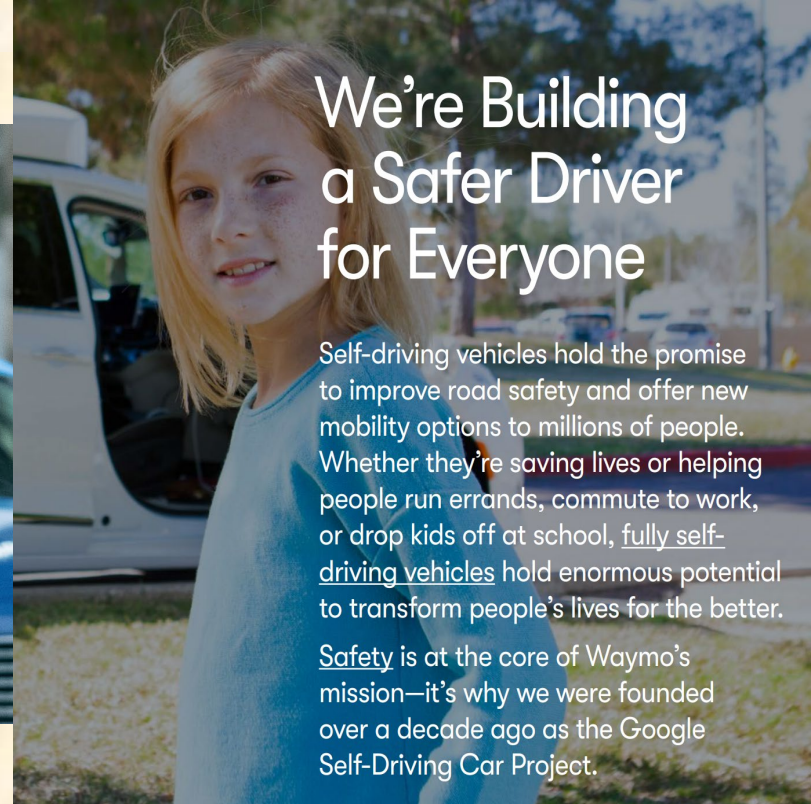
ADS Technology: Sold Based on Safety



**A MATTER
OF TRUST**

Ford VSSA <https://bit.ly/3njionT>

Waymo VSSA <https://bit.ly/2QuYhai>



**We're Building
a Safer Driver
for Everyone**

Self-driving vehicles hold the promise to improve road safety and offer new mobility options to millions of people. Whether they're saving lives or helping people run errands, commute to work, or drop kids off at school, fully self-driving vehicles hold enormous potential to transform people's lives for the better.

Safety is at the core of Waymo's mission—it's why we were founded over a decade ago as the Google Self-Driving Car Project.

How's It Going With Autonomy Testing?

- Uber ATG fatality, Tempe AZ/US: March 2018
 - Uber ATG closed: January 2021
- Easymile phantom braking injuries: 2019, 2020
- Pony.AI crash: CA/US: Oct. 2021
 - Uncrewed test permit revoked
- WeRide sleeping tester: Oct. 2021
- Local Motors injury, Whitby CA: Dec. 2021
 - Company closed: Jan. 2022
- TuSimple truck testing crash: April 2022
 - Alert, trained safety driver unable to prevent crash
- Cruise left turn injury: June 2022



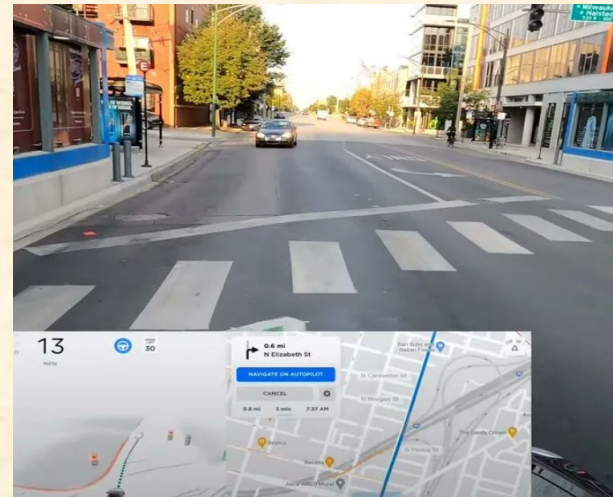
How's It Going With Tesla?

■ Tesla FSD “beta test” US: multiple incidents

- Videos of reckless driving by testers
- Exploiting Level 2 loophole for L3/L4 testing

■ Tesla AutoPilot: injuries and fatalities

- Multiple crashes investigated by NTSB
 - Common theme: inadequate driver monitoring
- NHTSA engineering analysis
 - 16 crashes; 15 injuries; 1 fatality
for crashes into emergency vehicles/workers
- NHTSA mandated reporting from all Level 2 and higher vehicles
- Felony charges for fatal AP-related crash (Jan. 2022)



<https://bit.ly/33L0Bk7>

<https://bit.ly/3nQUfXI>

Why Is AV Safety Complicated?

■ Public expectations

- Expect super-human machine performance
- Trust too easily given, backlash when broken

■ Technical challenges

- Machine Learning safety is work in progress
- Statistical techniques struggle with rare events

■ Historical industry culture clash

- Autonomy researchers: it's all about the cool small-scale demo
- Silicon Valley: move fast + break things
- Automotive: blame driver for not mitigating equipment failures
- Regulators: test-centric; weak digital safety expertise



<https://bit.ly/32qGUgR>

What People Mean By “Safe”

- Human drivers are bad, so computers will be safe
 - Industry rhetorical talking points are ubiquitous
- “Safety is our #1 priority”
- Safe driving behavior
 - Follows traffic laws; good roadmanship
- Tested/simulated for millions of miles
- Risk is managed via insurance
- Conforms to safety standards
- Positive Risk Balance (better than human)
- Safety cases supported by evidence



[Dall-e]

Hierarchy Of Concurrent Safety Needs



Standards-Based Engineering Approach

SYSTEM SAFETY	ANSI/UL 4600		Safety Beyond Dynamic Driving	HIGHLY AUTOMATED VEHICLE SAFETY CASE ANSI/UL 4600
DYNAMIC DRIVING FUNCTION	ISO 21448	SaFAD/ISO TR 4804	Environment & Edge Cases	
FUNCTIONAL SAFETY	ISO 26262		Equipment Faults	
CYBER-SECURITY	SAE J3061	SAE 21434	Computer Security	
VEHICLE SAFETY	FMVSS	NCAP	Basic Vehicle Functions	
				ROAD TESTING SAFETY SAE J3018

US Regulatory Posture As Of Early 2022

- Federal / equipment safety: **almost nothing for AVs**
 - NHTSA ANPRM proposing industry standards Dec. 2020
 - Started collecting crash data in 2021
- State / driver safety: **administrative only**
 - California: permits, driver checks, reporting
 - Texas, Arizona, etc. “open for business”
 - Aggressive state-by-state lobbying
- Municipal / local conditions: **mixed**
 - NYC DOT requires SAE J3018 for testing
 - Munis hobbled by state preemption



STUDENT DRIVER

#1 Issue: Deployment Governance

- Who decides it's time to deploy, based on what?
- US: self-certification to FMVSS (no homologation)
 - Vehicle test of some basic functions only
 - No requirement for engineering standards
 - State permits are licensing & insurance
 - Regulations based on SAE J3016 Level
 - *J3016 is not a safety standard!*
- Companies decide when to test/deploy
 - Opaque about their safety goal
 - Opaque about criteria to deploy
 - Enormous pressure: \$Billion milestones



J3016™	APR2021
Issued	2014-01
Revised	2021-04
SURFACE VEHICLE RECOMMENDED PRACTICE	
<small>(R) <u>Taxonomy and Definitions</u> for Terms Related to Driving Automation Systems for On-Road Motor Vehicles</small>	

- Waymo Safety Methodologies report, Oct 2020
 - What it might seem to say: Look at us, ISO 26262! Woohoo!
 - But only looked at HARA (portion of part 3), not whole standard
 - “does not rely” – doesn’t say they use HARA at all!
 - “not a perfect fit” – even though tailoring to fit is routine
 - Bottom line: “We don’t want to follow the industry standard.”

action to address the hazard. ISO 26262 has provided significant insights for Waymo’s hazard analysis processes. However, Waymo does not rely strictly or exclusively on ISO 26262’s principles, which are not a perfect fit for a Level 4 ADS, where there is a need for a special focus on the plethora of conditions likely to be encountered in the intended ODD, and where separate analysis of individual items may not be as useful as analysis of hazards related to system interactions.

- “94% fatalities due to human error”
 - No data showing AVs are safer than human drivers
- “Regulate or Innovate”
 - Safety standards are technology neutral
- “Existing checks and balances sufficient”
 - Software safety largely unaddressed
- “Safety standards don’t apply to us”
- “A million miles of testing → safe”
- “Disclosing safety outcomes reveals our secret sauce”
- ...

DESIGNLINES | AUTOMOTIVE DESIGNLINE

Autonomous Vehicle Myths: The Dirty Dozen

By Philip Koopman, Carnegie Mellon University

10.22.2021  2

<https://bit.ly/3AqDGq1>

Industry Behaviors That Erode Trust

- **Messaging the Dirty Dozen Myths**
 - Safety theater of various forms
- **Enabling insufficiently safe deployment**
 - Possibly employing Moral Crumple Zones
- **Lobbying states for favorable terms**
 - Preempt municipal ordinances
 - FOMO-driven narrative (other states; China)
 - Computer is “driver” – no person to hold accountable
 - Low insurance limits vs. \$12M statistical life
 - No defined level of safety; little government oversight over safety
 - Selected bills here: bit.ly/305ZfDg (Feb 10, 2022 blog post)

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AUTONOMOUS VEHICLE REGULATION & TRUST:
THE IMPACT OF FAILURES TO COMPLY WITH
STANDARDS

William H. Widen* & Philip Koopman**

<https://bit.ly/3rMKKKh>

Insurance Costs Won't Force Safety



- Cost of excessive risk drives improvement
 - Reducing risk tends to improve safety, but...
- Affordable risk might exceed acceptably safe
 - Life insurance for combat military personnel
 - Commercial space launch insurance
 - Motorcycle insurance
 - Cost of fatality settlement compared to \$2M-\$5M/day burn rate
- Risk management is not enough for acceptable safety
 - Risk transfer (occupants vs. pedestrians)
 - Existential pressure for company to deploy with unproven safety

Need A Better Regulatory Approach

■ SAE J3016 is unsuitable for regulations

- Explicitly not a safety standard
- Easily gameable to degrade public safety
- Level definitions have safety gaps
 - e.g., driver monitoring is optional



■ Should regulate safety outcomes, not how vehicles are built

■ Need a clear assignment of driver safety role

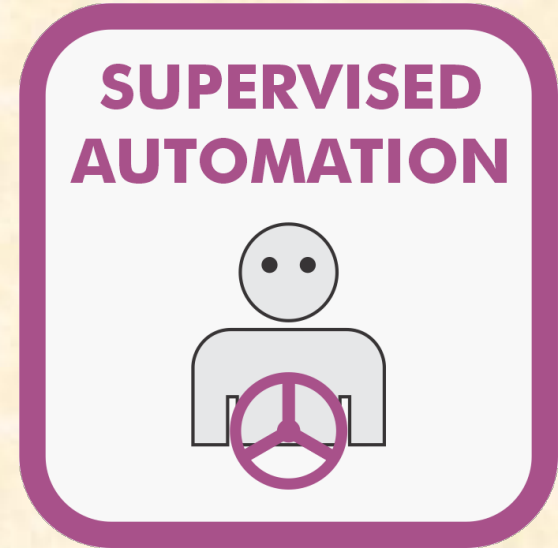
- Make sure the driver (if any) can ensure safety
- Emphasize driver attention & ability to intervene when needed

- Driver is required to steer
 - Roadway departure without driver steering
 - Hands on steering wheel continuously
- Conventional driving
 - Speed-based cruise control OK
 - Distance-based cruise control OK
 - Momentary collision avoidance OK
 - But NOT automated continuous steering
- Regulation:
 - Conventional vehicle rules



Driver Supervises Automation

- Driver supervises automation
 - Effective driver monitoring required
 - Might permit some hands off steering wheel
- Speed + steering “cruise control”
 - Lane and speed maintenance
 - Driver initiated lane changes OK
 - System warns whenever takeover required
 - Automated intersection turns *excluded*
- Regulation:
 - Evidence of effective driver monitoring



Vehicle Testing

- Driver intervenes to mitigate design defects
 - Testing → presumption that system has defects
- Public road testing is hazardous to road users
 - Use only trained, vetted testers
 - Driver + vehicle pair shown to be acceptably safe
 - Do not test known defective behaviors
- Regulation:
 - Testing permits & report safety incidents
 - Conform to SAE J3018 public road testing for driver management
 - Require Safety Management System (SMS)



Autonomous Operation

- Driver can fall asleep (safely)
 - Driver is entirely optional
- True autonomous vehicle
 - AV handles driving safety
 - AV handles other aspects of safety
 - Both passenger & cargo vehicles
- Regulation:
 - Conform to industry safety standards: ISO 26262, ISO 21448, ANSI/UL 4600, security standards



■ Deployment Governance

- Stakeholders involved in criteria & decision
- Safety culture assures fair dealing on decision

■ Acceptable risk

- Good human PRB + safety factor for unknowns
- Safety & security industry engineering standards
- Ethical concerns addressed

■ Safety case

- Transparent argument based on evidence
- Lifecycle uncertainty management via field feedback

■ Safety while public road testing



[Dall-e]

■ AV industry at a crossroads:

1. Adversarial to regulation; risk of backlash, or
2. Collaborative governance to establish trust or
3. Lean into the Level 2++ unregulated loophole

■ Should companies own safety governance?

- Huge financial benefits for early to market
- \$ Billion funding and milestone pressure
- Tesla behavior: no consequences; stock value increases
 - Will other companies successfully resist cutting safety corners?



■ Detailed paper on AV Regulation and Trust:

- <http://dx.doi.org/10.2139/ssrn.3969214> (UCLA J. Law & Tech.)