

# Trust, Control, and Communication in the Transport Network

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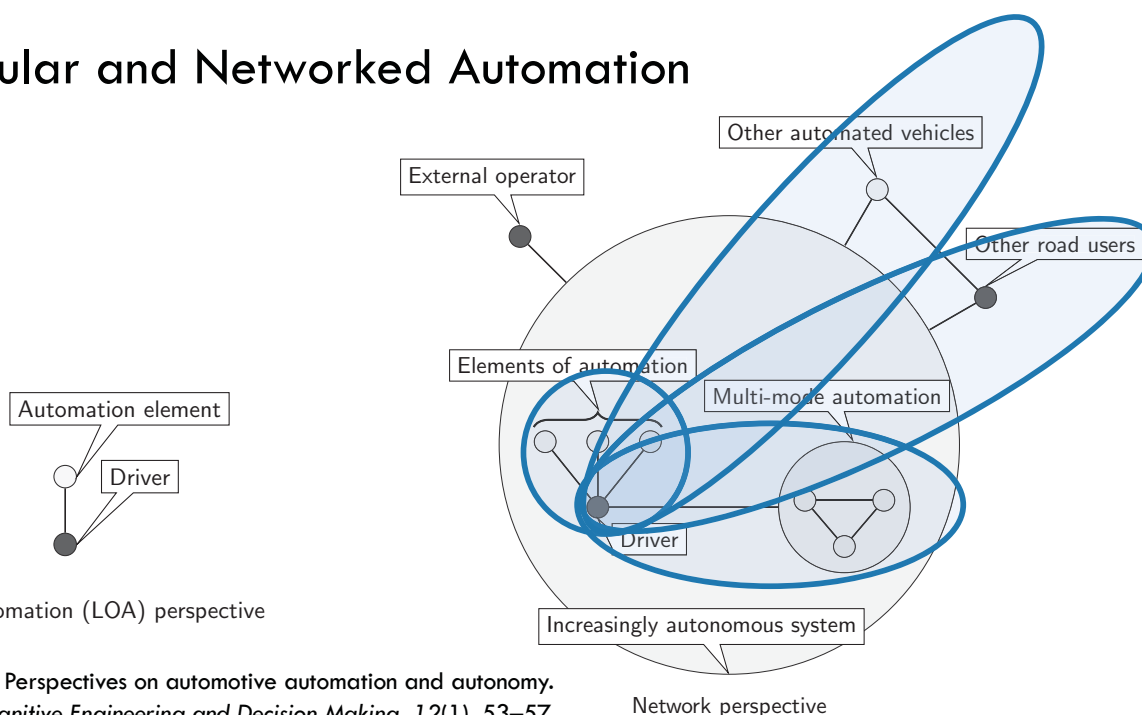
## Trust in Automation

- “Trust ... the attitude that an agent will help achieve an individual’s goals in a situation characterized by uncertainty and vulnerability.” (Lee & See, 2004)
- But what about:
  - Communicating through performance?
  - Control of “Autonomous” systems?
  - Incidental users?
  - Networks of people and technology?

Lee, J. D., & See, K. A. (2004). Trust in automation: Designing for appropriate reliance. *Human Factors*, 46(1), 50–80.



## Singular and Networked Automation



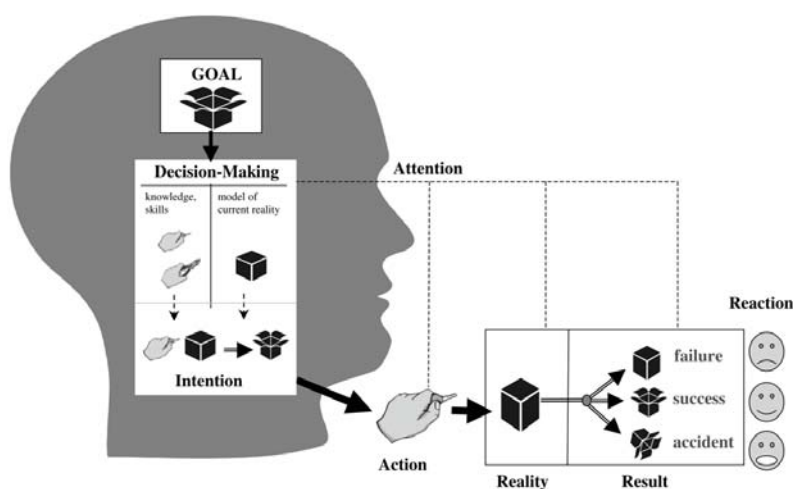
Lee, J. D. (2018). Perspectives on automotive automation and autonomy. *Journal of Cognitive Engineering and Decision Making*, 12(1), 53–57.

## Varieties of Control

- Pragmatic—Control to achieve goals
- Epistemic—Control to learn
- Communicative—Control to signal intent to others
- Existential—Control for self-efficacy

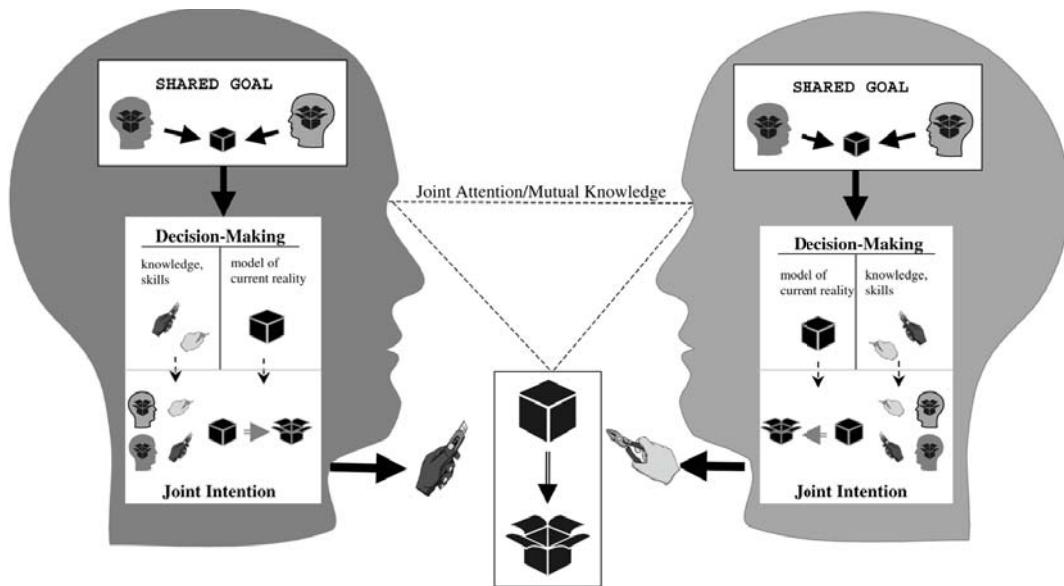
“These two lanes will take us anywhere” (Springsteen, 1975)

## Control: From intention to action

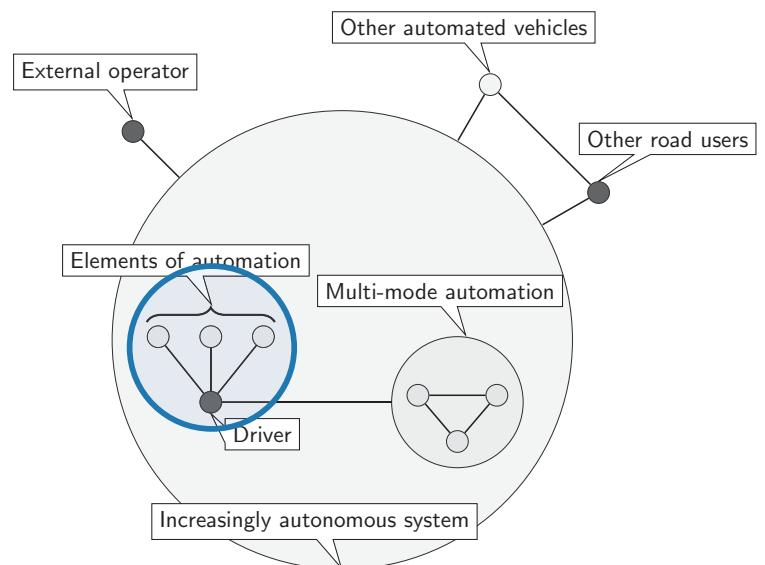


Tomasello, M., Carpenter, M., Call, J., Behne, T., & Moll, H. (2005). Understanding and sharing intentions: the origins of cultural cognition. *The Behavioral and Brain Sciences*, 28, 675-691

## Control: Communicating intention and coordinating joint action

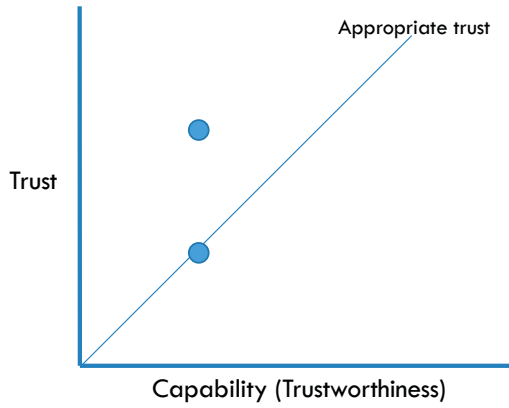


## Trust in sometimes-semi-self-driving cars

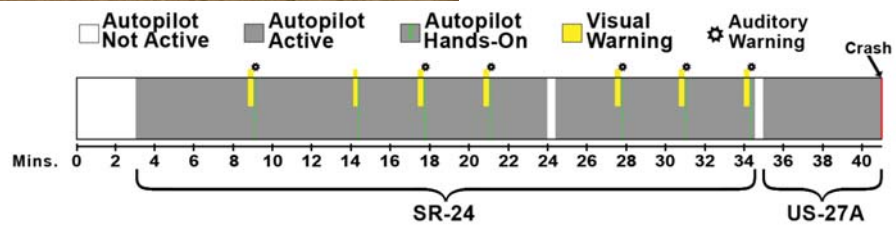


Lee, J. D. (2018). Perspectives on automotive automation and autonomy. *Journal of Cognitive Engineering and Decision Making*, 12(1), 53–57. Network perspective

# Overtrusting Automation

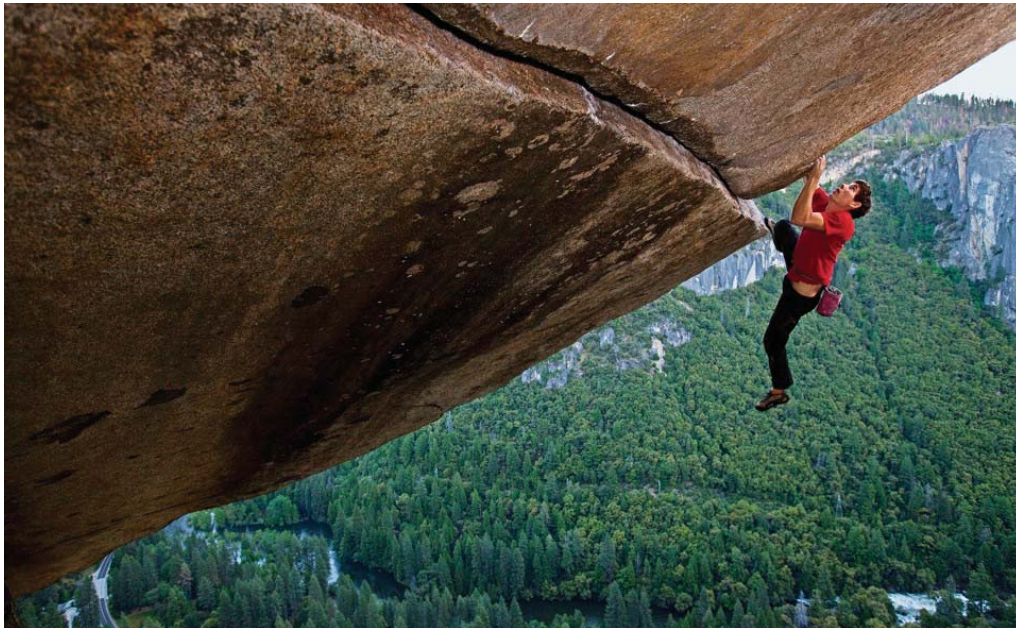


# NTSB Investigation of Fatal Tesla Crash

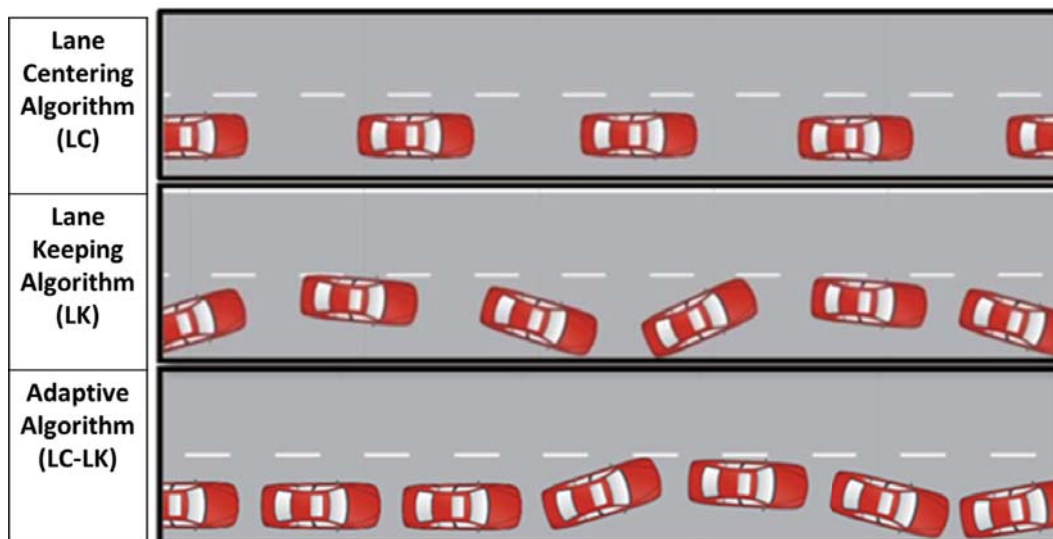




## Risk is Not So Obvious with “Self-driving” Cars

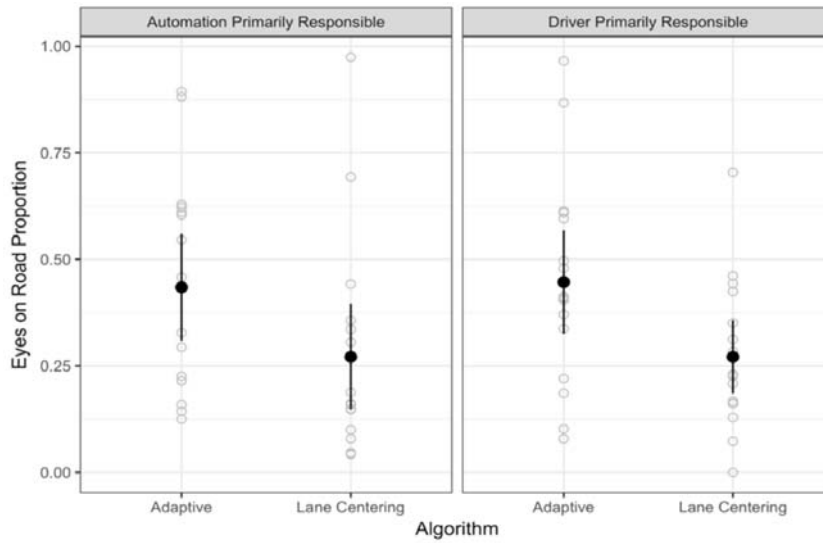


## Algorithms to Mitigate Overtrust



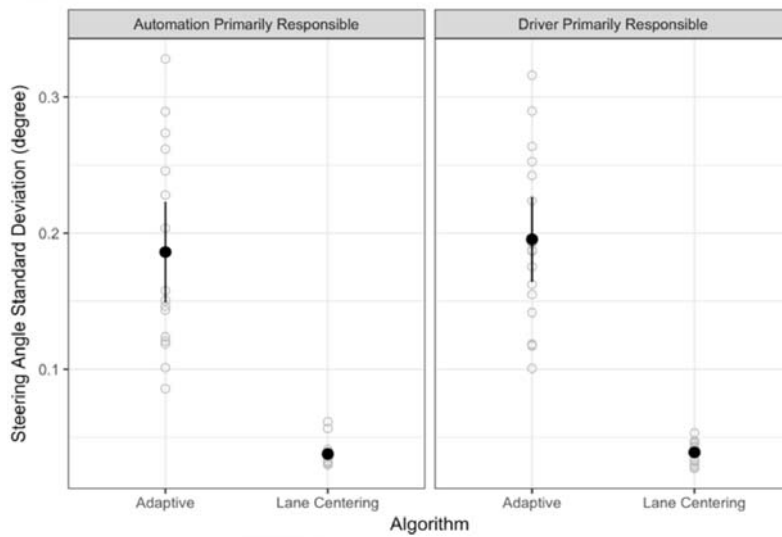
Price, M. A., Venkatraman, V., Gibson, M. C., Lee, J. D., & Mutlu, B. (2016). Psychophysics of trust in vehicle control algorithms. *SAE Technical Paper*, (2016-01-0144).

# Algorithms to Mitigate Overtrust



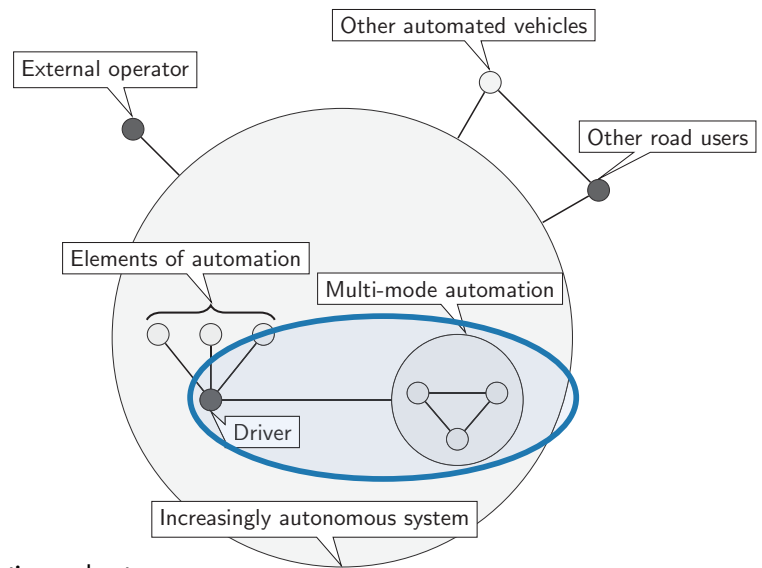
Alsaïd, A., Lee, J. D., & Price, M. (in press). Moving into the loop: An investigation of drivers' steering behavior in highly automated vehicles. *Human Factors*.

# “Vicarious Steering” Indicates Trust



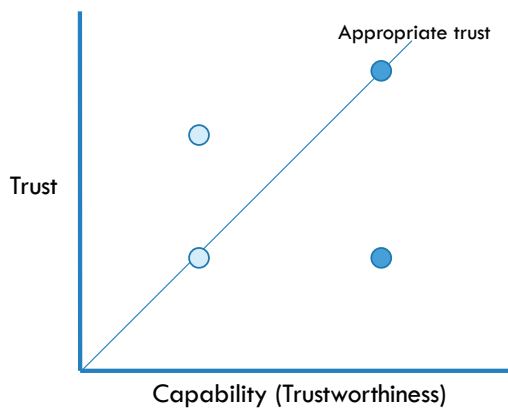
Alsaïd, A., Lee, J. D., & Price, M. (in press). Moving into the loop: An investigation of drivers' steering behavior in highly automated vehicles. *Human Factors*.

# Trust in Self-Driving Cars



Lee, J. D. (2018). Perspectives on automotive automation and autonomy. *Journal of Cognitive Engineering and Decision Making*, 12(1), 53–57. Network perspective

# Undertrust and Comfort in Driverless Cars



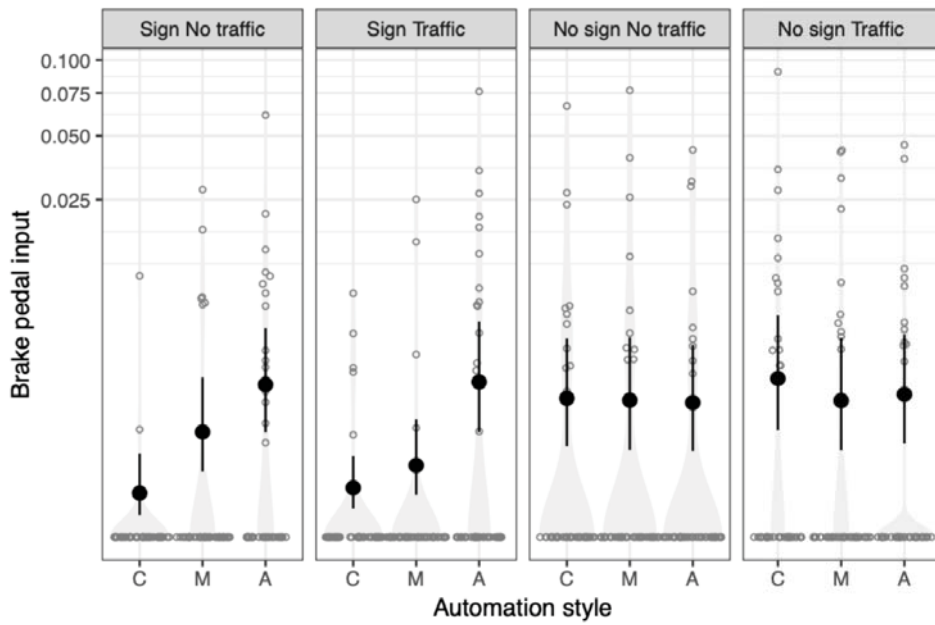
## Determinants of trust:

Micro—moment-to-moment movement

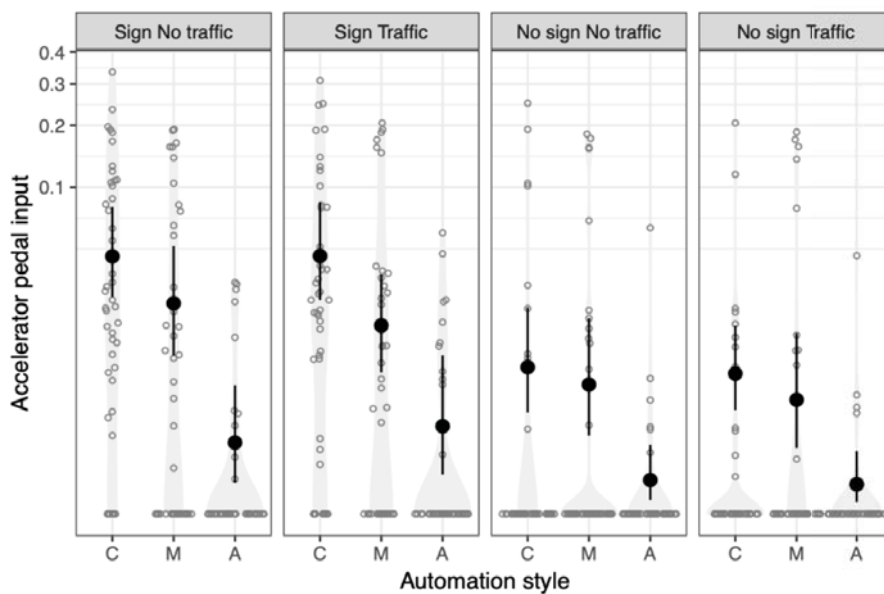
Macro—Reputational and societal influence



## Drivers Press the Brake When There Is No Sign

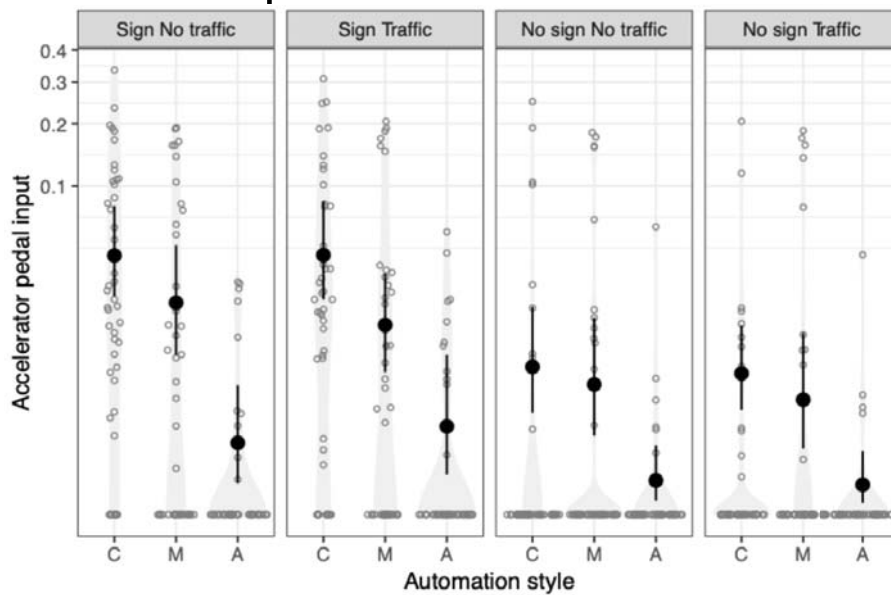


## Drivers Press the Accelerator After Experiencing Slow Intersections

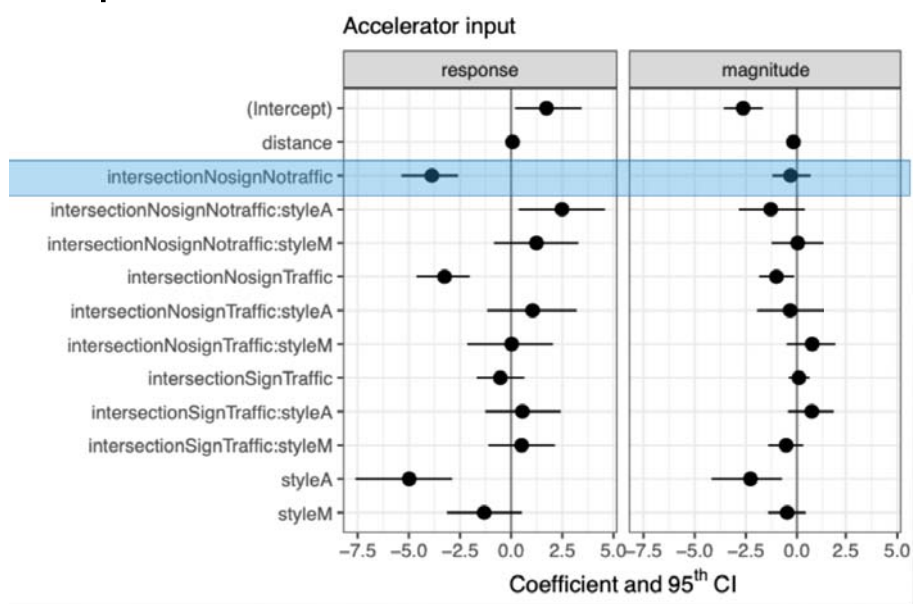


# How to Model Accelerator Input?

## Discrete response the continuous

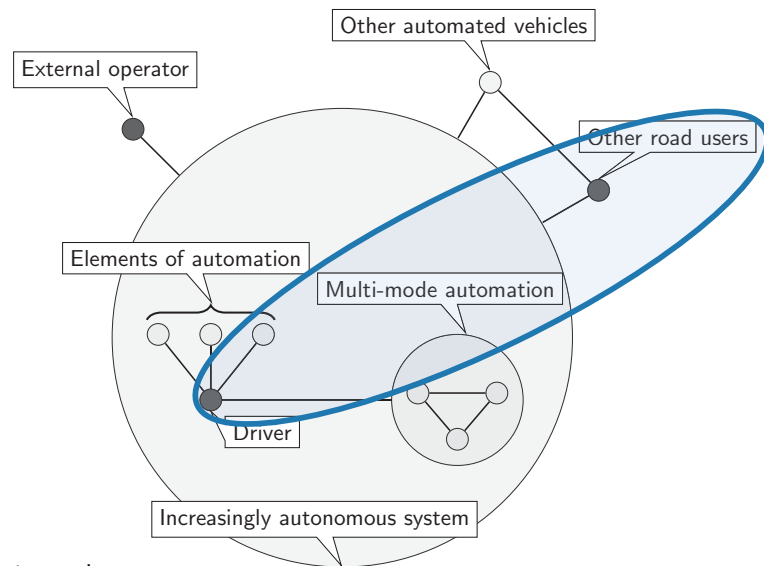


## Two-part Model: How often and how much



Lee, J. D., Liu, S.-Y., Domeyer, J., & Dinparastdjadid, A. (in review). Assessing driver acceptance of fully automated vehicle with a two-part model of intervention tendency and magnitude. *Human Factors*

# Trust in Driverless Cars



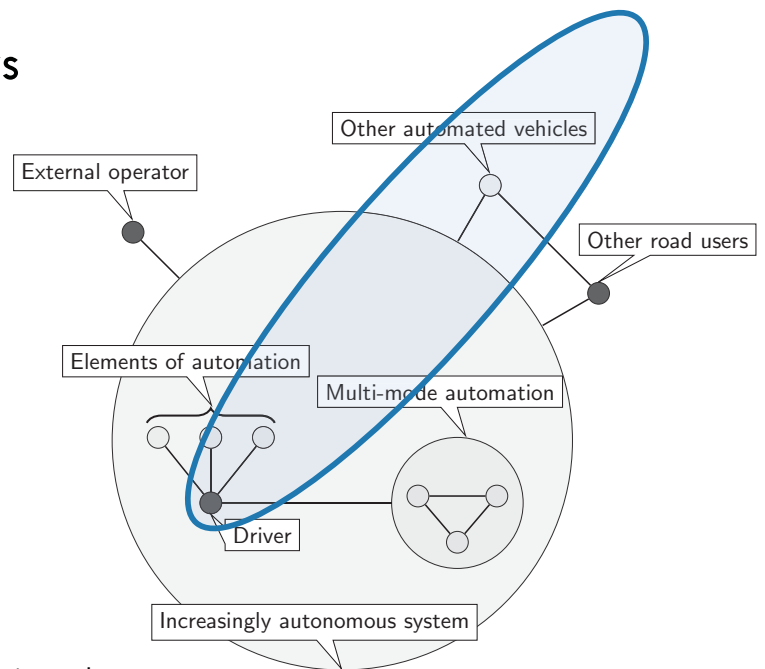
Lee, J. D. (2018). Perspectives on automotive automation and autonomy. *Journal of Cognitive Engineering and Decision Making*, 12(1), 53–57. Network perspective

# Micro Determinants and Consequences of Trust: Chronemics, Proxemics, and Kinesics



Doymeyer, J., Dinparastdjadid, A., Lee, J. D., & Douglas, G. (2019). Proxemics and kinesics in automated vehicle-pedestrian communication: Representing ethnographic observations. *Transportation Research Record: Journal of the Transportation Research Board*.

## Trust in Driverless Cars



Lee, J. D. (2018). Perspectives on automotive automation and autonomy. *Journal of Cognitive Engineering and Decision Making*, 12(1), 53–57.

Network perspective

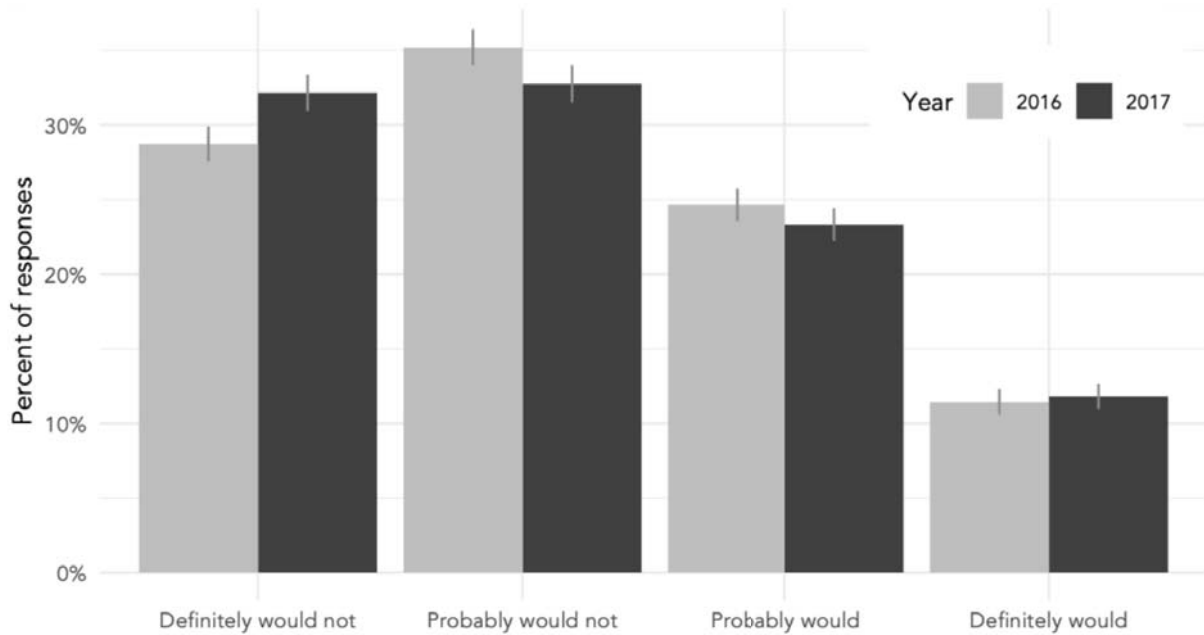
## Macro Determinants and Consequences of Trust



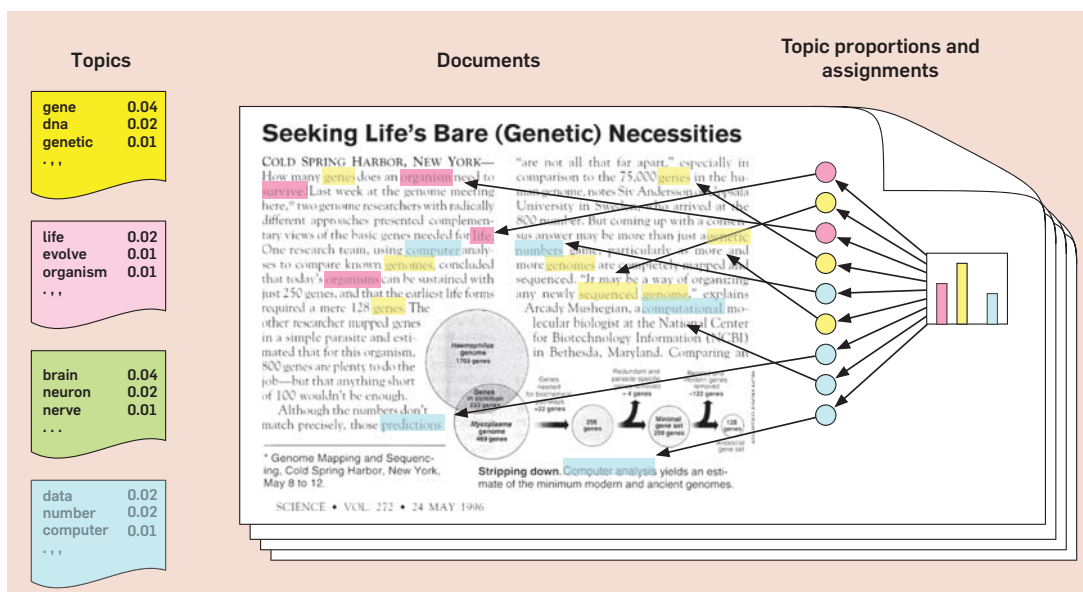
- Online panel survey 7,947 in 2016 and 8,517 in 2017
- “How much would you trust the ability of a vehicle equipped with self-driving technology to operate without a human driver’s input?”
- Open-ended responses with Likert ratings

Lee, J. D., & Kolodge, K. (2018). Understanding attitudes towards self-driving vehicles: Quantitative analysis of qualitative data. *Proceedings of the Human and Ergonomics Society Annual Meeting*, 62(1), 1399–1403.

## Responses Are Less Favorable in 2017: Why?



## Topic Modeling for Quantitative Analysis of Qualitative Data



Blei, D. M. (2012). Introduction to probabilistic topic models. *Communication of the ACM*, 55(4), 77–84.

## Distribution of Topics over Words and Comments

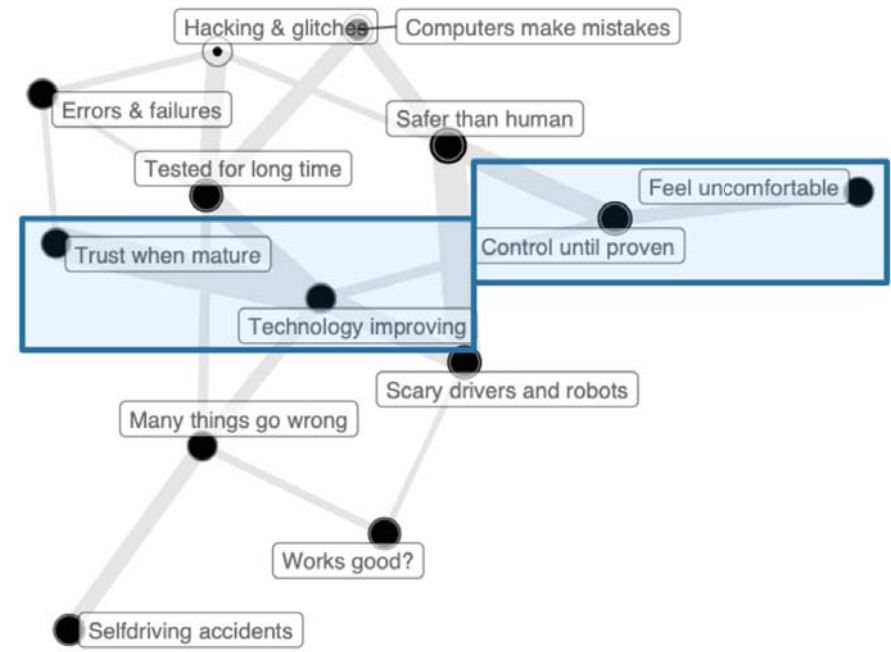
Topic and keywords	Exemplar comments
<b>Control until proven</b> FREX: proven, issues, given, worried, safe, control	"I do not like giving up control and do not think the tech has progressed sufficiently at this point to be safe and secure"  "not proven enough yet,, would feel out of control"
<b>Feel uncomfortable</b> FREX: feel, operation, functions, actions, risky	"I can't explain it.....I just don't feel comfortable with a car operating on its own. I like to be in charge of the car."

## Distribution of Topics over Words and Comments

Topic and keywords	Exemplar comments
<b>Trust when mature</b> FREX: trust, point, years, life, early	"I do not trust this type technology at this point of development"  "I trust the technology will be advanced to the point that it will be safe when it's available for purchase"
<b>Technology improving</b> FREX: develop, interested, technology, fully, fail	"Technology is at a peak and still improving. And all new technologies MUST secure federal permission to function, and NO sane person/agency would approve the use of an unsafe technology"



## Topics and Their Connections



## How Does Topic Prevalence Depend on Year and Rating?

- Structural topic modeling moves topic modeling from an unsupervised learning technique to a semi-supervised learning technique
- Distribution of topics across comments not assumed to be uniform, but linked to covariates (e.g., year and rating)

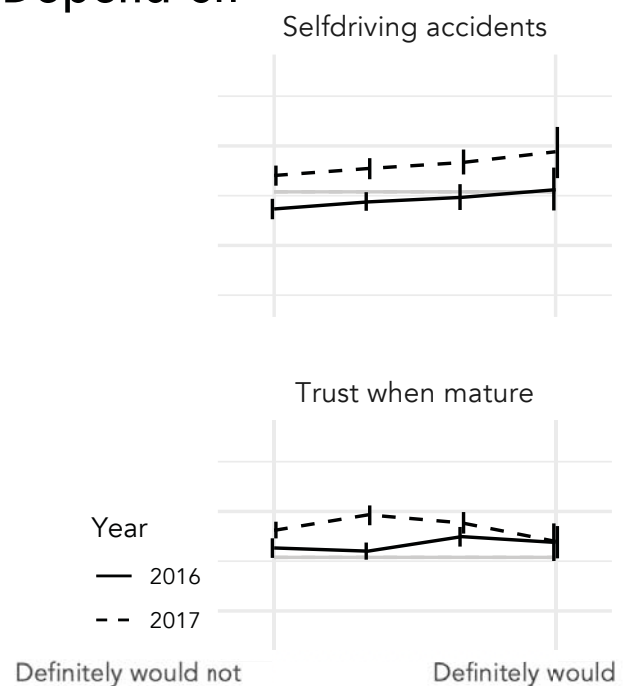
## How Does Topic Prevalence Depend on Year and Rating?

- Hacking is worrisome
- Other drivers are also worrisome



## How Does Topic Prevalence Depend on Year and Rating?

- The mention of self-driving car crashes increased in 2017
- Negative comments associated trusting mature technology increased in 2017



“I can't explain it.....I just don't feel comfortable with a car operating on its own. I like to be in charge of the car.” ?”

- Dread risk—Risks that are uncontrollable and unobservable

(Slovic, P. (1987). Perception of risk. *Science*, 236(4799), 280–285)



## Psychophysics of Dread Risk

- Dread risk perceived as 1000 times greater than controlled risk

(Slovic, P. (1987). Perception of risk. *Science*, 236(4799), 280–285)

- Dread risk guides society to risky outcomes

(Gigerenzer, G. (2004). Dread risk, September 11, and fatal traffic accidents. *Psychological Science*, 15(4))

- Trust declines with easy misses

Madhavan, P., Weigmann, D. A., & Lacson, F. C. (2006). Automation failures on tasks easily performed by operators undermine trust in automated aids. *Human Factors*, 48(2), 241–256

Small changes produced 100% misclassification

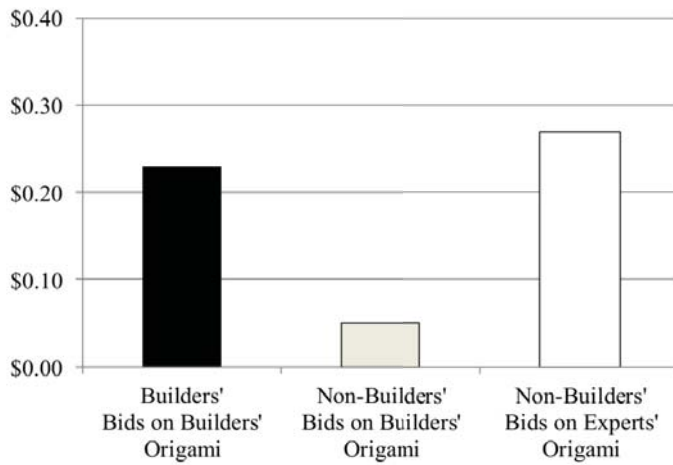
Evtimov, I., Eykholt, K., Fernandes, E., Kohno, T., Li, B., Prakash, A., Song, D. (2017). Robust physical-world attacks on machine learning models.



Make Less Dreadful: Make observable

Make Less Dreadful: Make directable

## Existential Control and the Ikea Effect: More value, less perceived risk



Nordgren, L. F., Van Der Pligt, J., & Van Harreveld, F. (2007). Unpacking perceived control in risk perception: The mediating role of anticipated regret. *Journal of Behavioral Decision Making*.

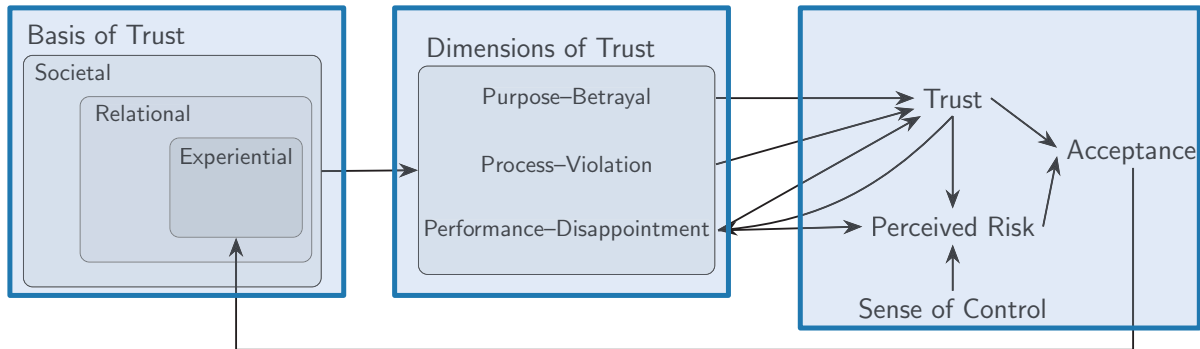
Norton, M. I., Mochon, D., & Ariely, D. (2012). The IKEA effect: When labor leads to love. *Journal of Consumer Psychology*

“I face a disconcerting void—an absence of controls”



## Determinants and Consequences of Trust

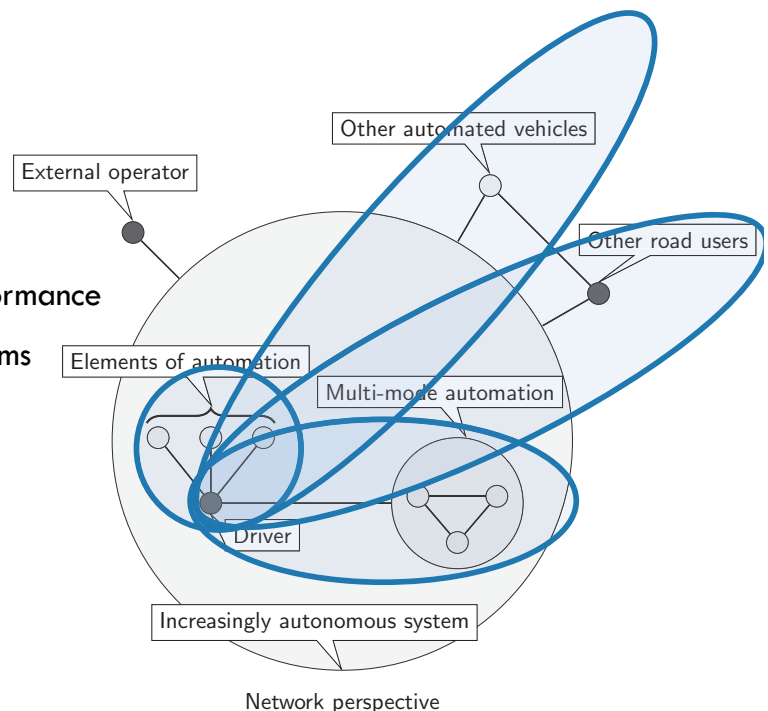
- The basis of trust is not just direct experience
- Dimensions of trust shift with the basis
- Sense of control, trust, and performance combine to influence perceived risk



Lee, J. D., & Kolodge, K. (in review). Exploring trust in self-driving vehicles with text analysis. *Human Factors*.

## Trust in Automation

- Communicate capability through performance
- Support control of “Autonomous” systems
- Consider trust of incidental users
- Networks influence trust



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