



### Use of AI for simulation and digital twins



## First, physics sandboxes are now key to develop and test vehicles









# Those digital twins have been used to guide design choice and find best trade-offs

By optimizing multiple parameters and find best trade-offs using DOEs and optimization



Wheel Base  $(W_b)$ 

CG Position (X,)

Wheel Center Rear

Wheel Center Front





### And evaluate input loads on the structure





## They allow making new vehicle that will operate in different gravity

MESR vehicle seen at NASA's Ohio proving ground







We are now building driver-in-the-loop and immersive simulators using said models





# Second, Machine learning and AI applications in vehicles are exploding in popularity

- This clutch is fully automated on the Can-am Spyder thanks to machine learning
- The hydraulic pressure sent to the clutch is adapted continuously for:
  - Tolerance variation
  - Wear
  - Coefficient of friction loss







## Allowing to learn and adapt in complex systems

- The machine learning algorithm correlates the clutch torque to the pressure during the launch if favorable conditions are met
- It finds the kisspoint pressure and coefficient of friction

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## We use AI to estimate vehicle trajectories

- Fusing GPS, yaw rate sensor, steering, throttle and brake
- And avoid future collisions







## A 2<sup>nd</sup> order Vold-Kalmann gives excellent results for trajectory prediction

- This could be used for collision avoidance for example or issuing warnings
- Very light in terms of resources and can be done for the closest 10 vehicles if C-V2X information is received





# Al and Digital Twins can be used together to accelerate development despite the growing complexity



We are beginning to simulate virtual sensors and validate software stack for autonomous driving in a virtual environment







# **Digital vehicle + Digital environment**

- We already have high-fidelity digital twins for dynamic behavior
- We plan to scan our real test environment with LiDAR

1000

750 500

> Vehicle hardware and control logic being tested with multiple vehicles and scenarios

# We can use this to develop bots that drive the vehicle on an off-road test track

- In a virtual sandbox:
  - We are starting to use Reinforcement Learning to control Throttle, Brake and Steering
    - Rewards for staying on track
    - Rewards for maintaining a high speed and scoring good checkpoint times
    - We randomize parameters such as weight and traction to make the controller robust
- Once satisfied with our model, we will try zero-shot generalization from simulation to natural environments
  - Using GPS, cameras, flash lidars and radar with Nvidia Drive
  - Having a C-V2X collision avoidance supervisor and Geofencing to limit collision risk and avoid vehicle leaving certain areas





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