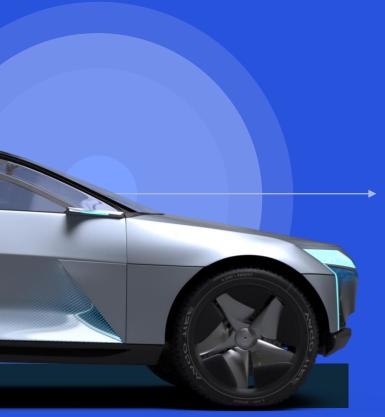
# How Critical Are Localization and Perception Technologies for Enhanced Autonomous Driving?

Dheeraj Ahuja

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# Autonomous driving is evolving

Features across each level of autonomous driving scale differently in performance and complexity





Level 1/2



Level 2+



► Level 4+

### **Active safety**

Forward collision warning, automatic emergency braking

Lane keep assist, departure warning

Blind-spot collision warning

Adaptive cruise control

### Convenience

Adaptive cruise control with lane-keeping

Hands-off highway autopilot

Automated lane change

Autonomous parking

### **Self-driving**

Robo taxis, robo delivery

Long-haul trucking

Parking lot to parking lot

Key solution requirements

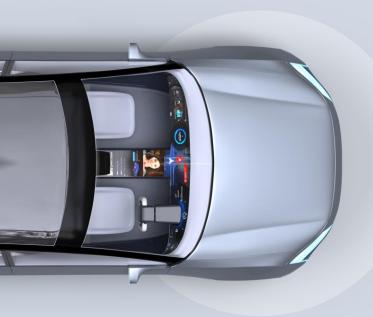
Safe, robust, and efficient

Power and thermal efficiency

Scalable across multiple car classes

For unique safety and convenience experiences

# Focusing on the nervous system of the automated vehicle





Process information from diverse sensors

### Active vehicle sensors



#### Radar

Bad weather conditions, long range, low light situations



#### Lidar

Depth perception, 3D long range



#### Camera

Interprets objects/signs, practical cost and FOV<sup>1</sup>



Low cost, short range

### Extending horizon sensors



#### **5G V2X**

#### wireless sensor

All weather, all lighting, 360° non-line of sight sensing, extended range sensing



### 3D HD maps

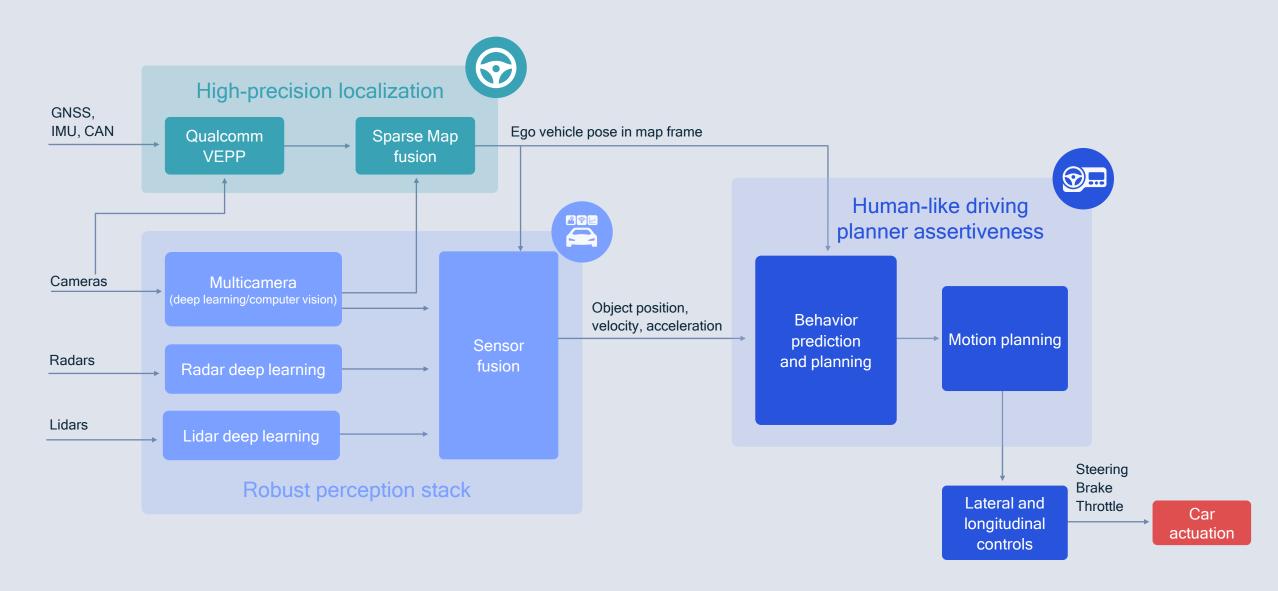
HD live map update, sub-meter level accuracy of landmarks



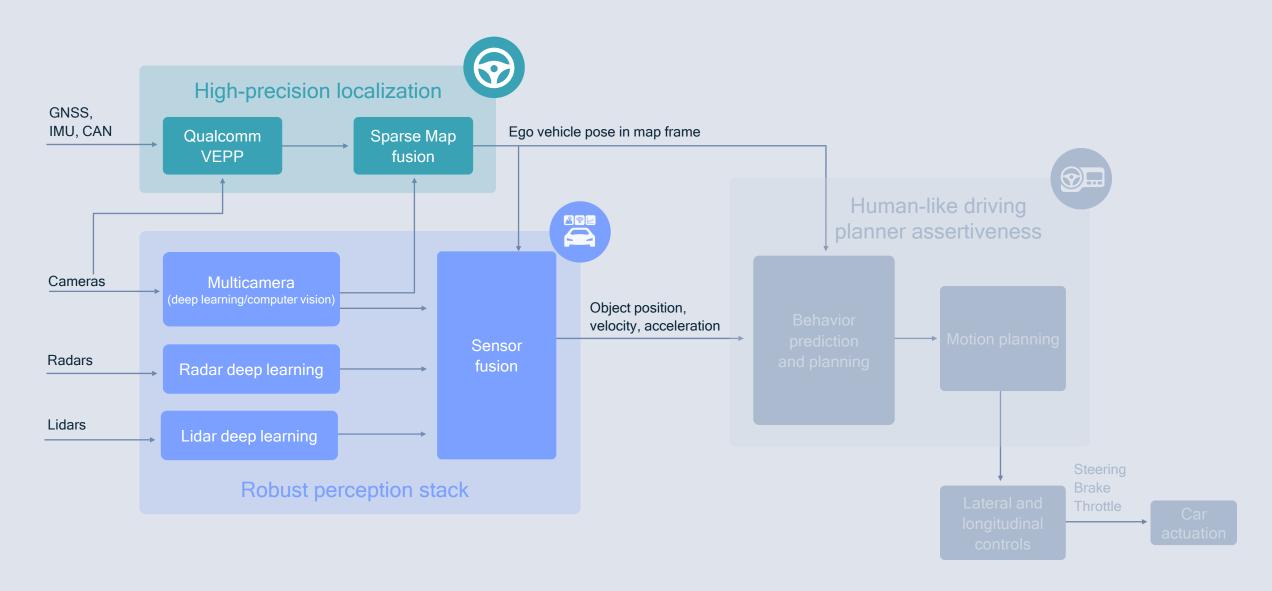
## Precise positioning

GNSS² positioning, dead reckoning, Qualcomm VEPP³

## Solving complex autonomous driving problems

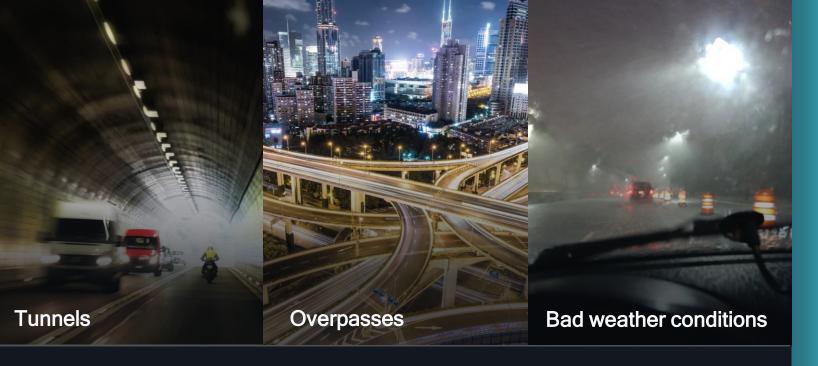


## Solving complex autonomous driving problems



Unified localization and mapping approach:
Global and Local accuracy



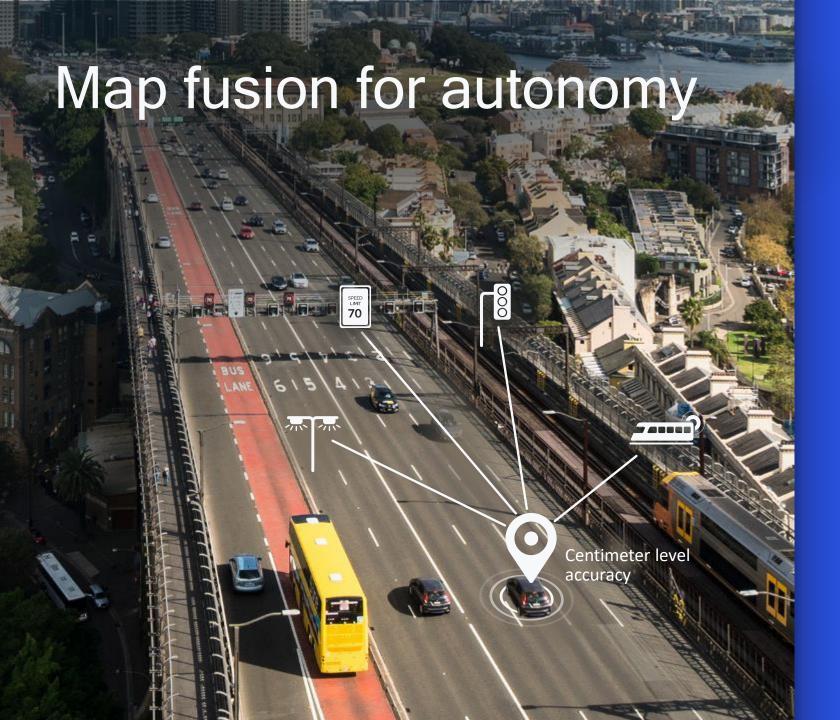




Lane-level positioning virtually anywhere, anytime
Optimized for Qualcomm® Snapdragon™ processors



Qualcomm VEPP fuses camera and GNSS measurements to data from diverse on-board sensors providing lane-level accurate positioning and precise heading in the global frame in virtually all environments



# Map fusion: Centimeter level accuracy for autonomous driving

MAP fusion with "sparse" HD maps provides high accuracy

Using front and side cameras to identify localization features on road

Less than 10 cm lateral and longitudinal accuracy

Supports APIs from leading HD map providers



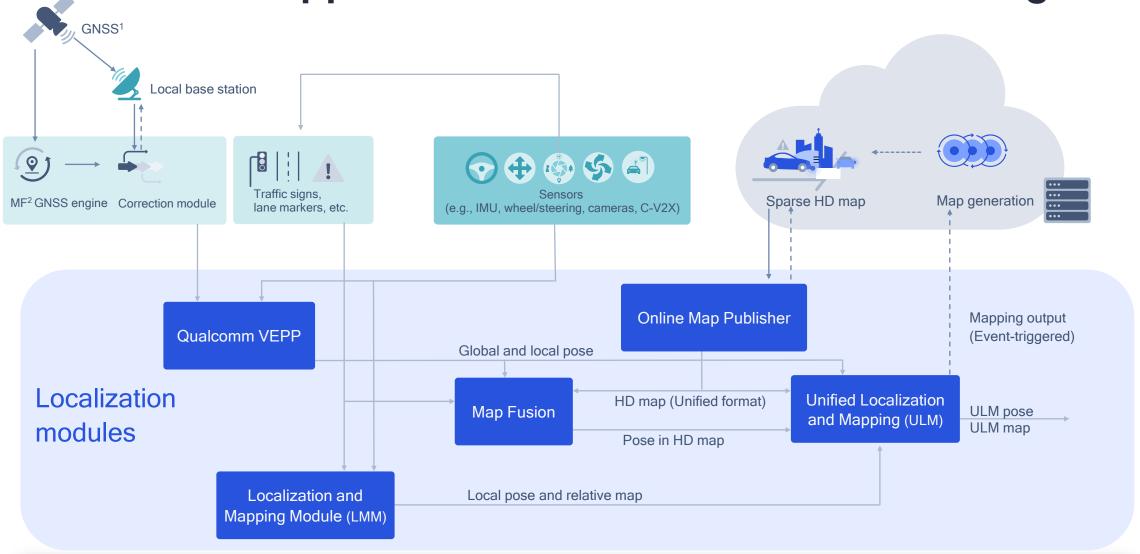
# Unified localization approach

With or without HD maps

Solve challenges associated with new and/or repainted lanes

Vehicle continues safely in autonomous mode

## Holistic approach to solve localization challenges



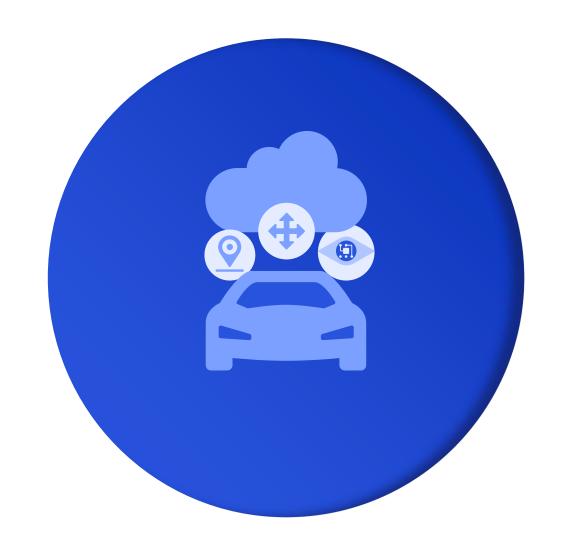
### Levels of autonomous driving

# Qualcomm® Snapdragon Ride™

On Device real time map estimation for autonomous driving

- Seamless operation in the presence of gaps and errors in HD-Map
- Crowdsourcing of road changes to refresh HD-Map

Innovating novel ways for efficient and accurate environment perception



# Harnessing complementary sensors for robustness and redundancy



### Camera

Analyze road types, text on road signs, color of lanes/traffic lights



### Radar

Affordable, long range, low visibility, velocity measurement



### Lidar

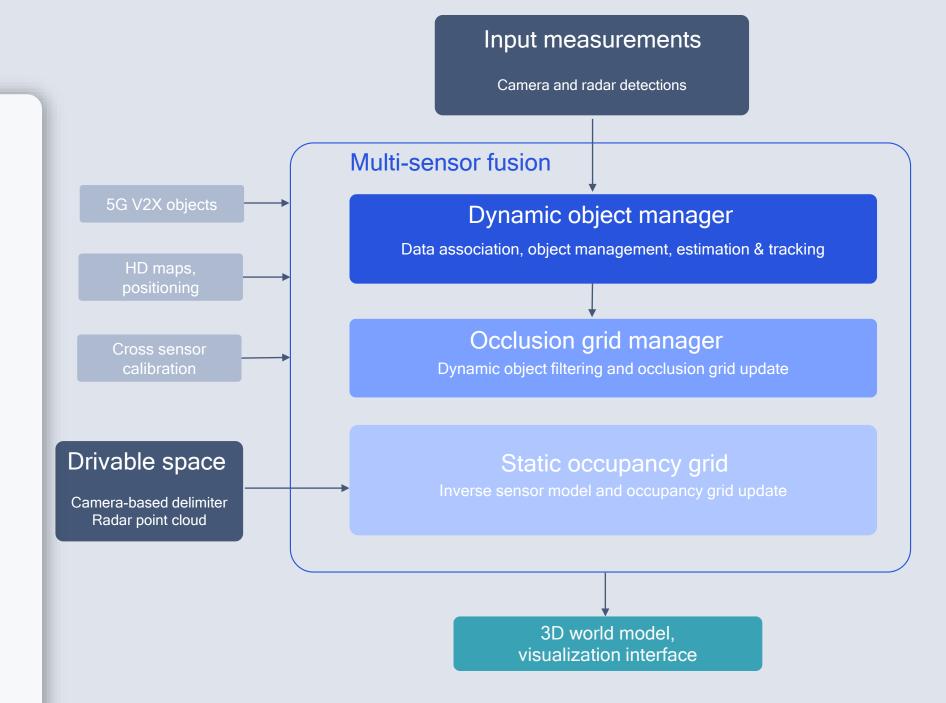
3D, long-range, high-precision

360° surround perception

Accurate 6DoF estimation

Range, velocity, and orientation

# Driving advanced sensor fusion technology for scalability and robustness





Unique approaches to solve data association using multiple cameras to achieve robust estimation and tracking

# Novel self-supervised learning technique









Screen captures from test video during on-road testing

## Monocular depth estimation

Extracting depth of objects using a single camera



# Achieving accuracy in vehicle keypoint detection for improved 3D object detection and ranging

Screen captures from test video during on-road testing

# Multimodal robust 3D estimation

### Appearance and geometry based

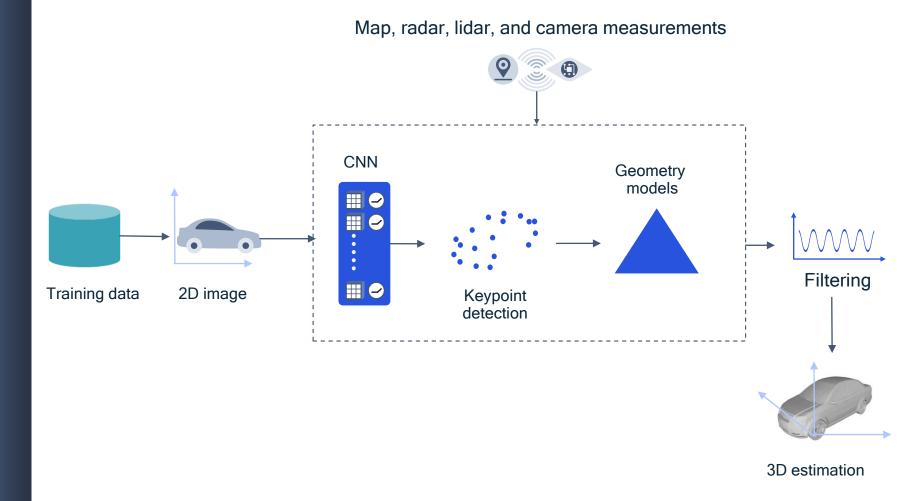
Combining visual and semantic features with deep learning and geometry models

# Tracking using advanced uncertainty-aware filter

Position and speed estimation in dynamic real-world conditions with uncertainty in sensor detections and localization

### Using camera, radar, and map

Uses measurement from multiple cameras, radars, and map information



# Transforming 2D camera data to 3D estimations of dynamic objects

# Enhancing autonomous driving with more accurate estimations

# Benefits of multimodal 3D estimation

### More accurate pose estimation

Provides accurate 6DoF pose of other vehicles on roads for safer driving



### More precise size tracking

Localize large sized objects (e.g., trucks) with improved accuracy



### Enable advanced autonomous features

E.g., In-lane maneuvers, lane merges, different trucks, lane-splitting motorcycles, and other complex scenarios

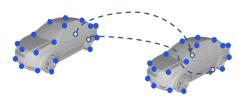


# Multiview tracking for accurate 3D estimation

Self-supervised monocular depth estimation

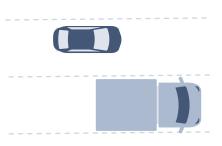
Camera and radar-based size tracking











Corner points and semantic points along with feature tracking on a time-axis

Power/compute efficient and cost-effective technique for depth estimation using single image

Hybrid geometry and learning-based estimations, Kalman filter, improved localization

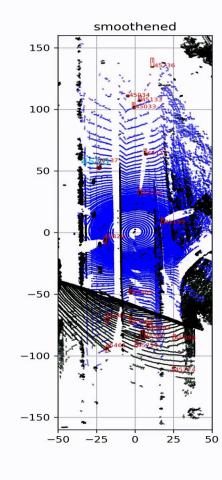
Supports HD-map or camera lane detections, lateral offset estimation for all vehicles, complex situations like merges and truck overtaking

### Applying multimodal multiview optimizations for 3D estimation

Camera | Radar | Maps



# Lidar-based detection and tracking for enhanced reliability



### Creating a redundancy path

Lidar-camera fusion for lane detection and classification

Object classification for road edges, static objects, traffic signs, and more

### Building a validation pipeline

Facilitates automated annotation and training of camera/radar

Verification and validation of camera-radar fusion pipeline

# System approach to scale autonomous driving solutions





### Accelerate with comprehensive frameworks and tools

Solving key challenges in taking autonomous driving from lab to mass market

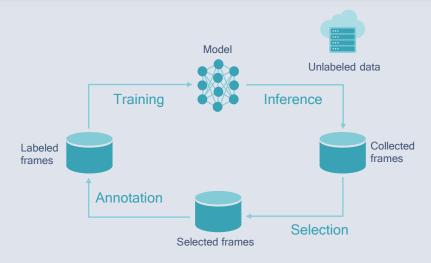


### **Cross sensor calibration**

Data-driven technique for stringent and complex requirements

Auto calibration using optimized transformation parameters

Pre-calibrated parameters updated for aging and fluctuation



### **Active learning**

Continuous learning framework

Improved failure identification and performance of deep learning networks

Automated system that expedites the cycle from data collection to retraining the network

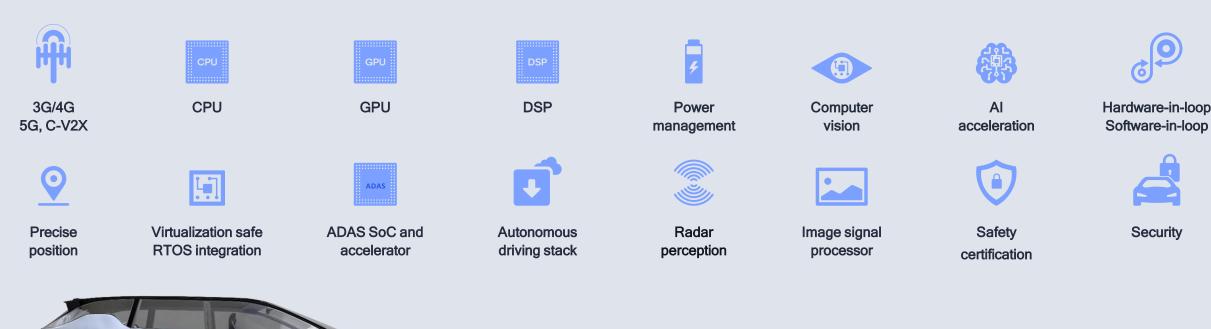


### Big data management

Vehicles equipped with data collection mechanism

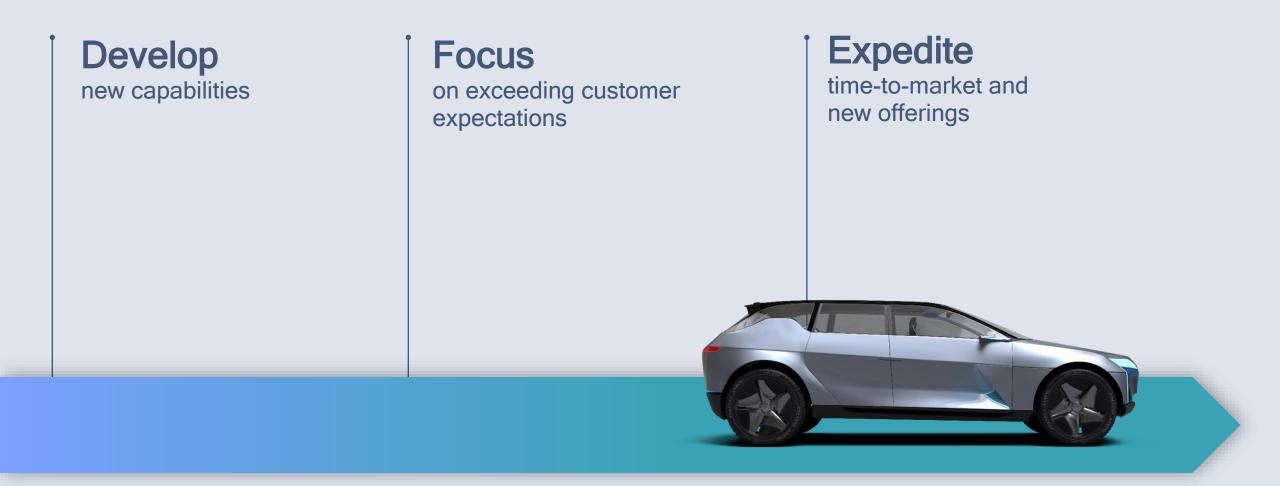
Cloud-based data ingestion and management

Hardware-in-loop and software-in-loop testing for real-time testing





## Build on our strengths in foundational technologies



## Driving automakers to continuously transform

### Qualcomm

# Thank you

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