

# Principles of Robot Autonomy I

Course overview, intro to robotic systems and ROS



**Stanford**  
University



# From automation...



# ...to autonomy

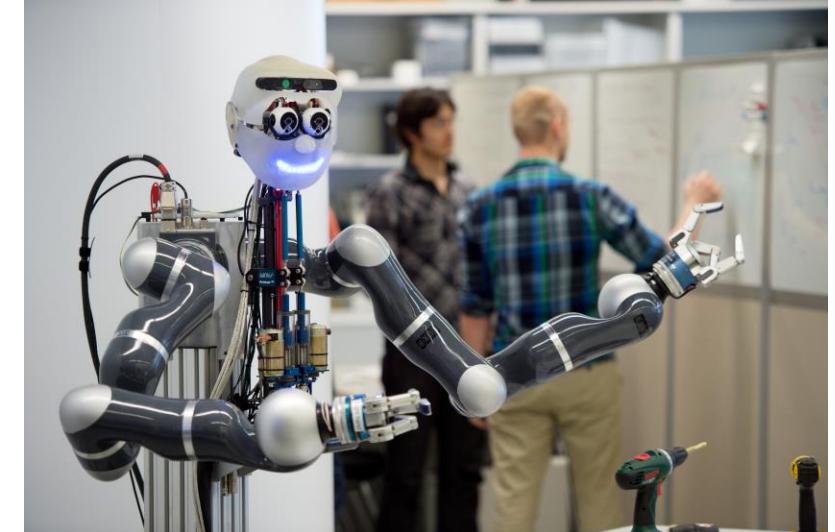
Waymo Self-Driving Car



Intuitive DaVinci Surgical Robot



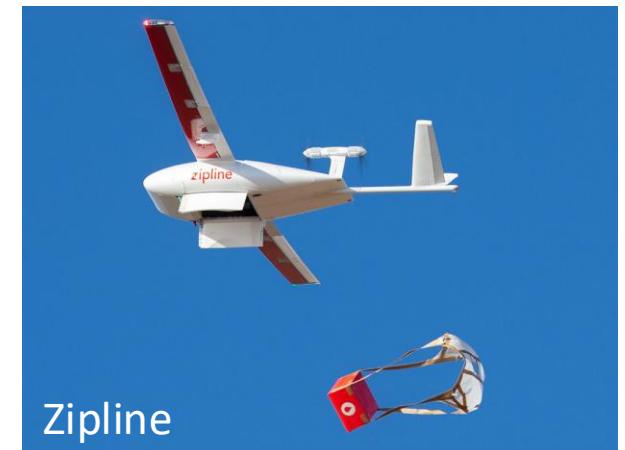
Apollo Robot at MPI



Boston Dynamics – Spot Mini



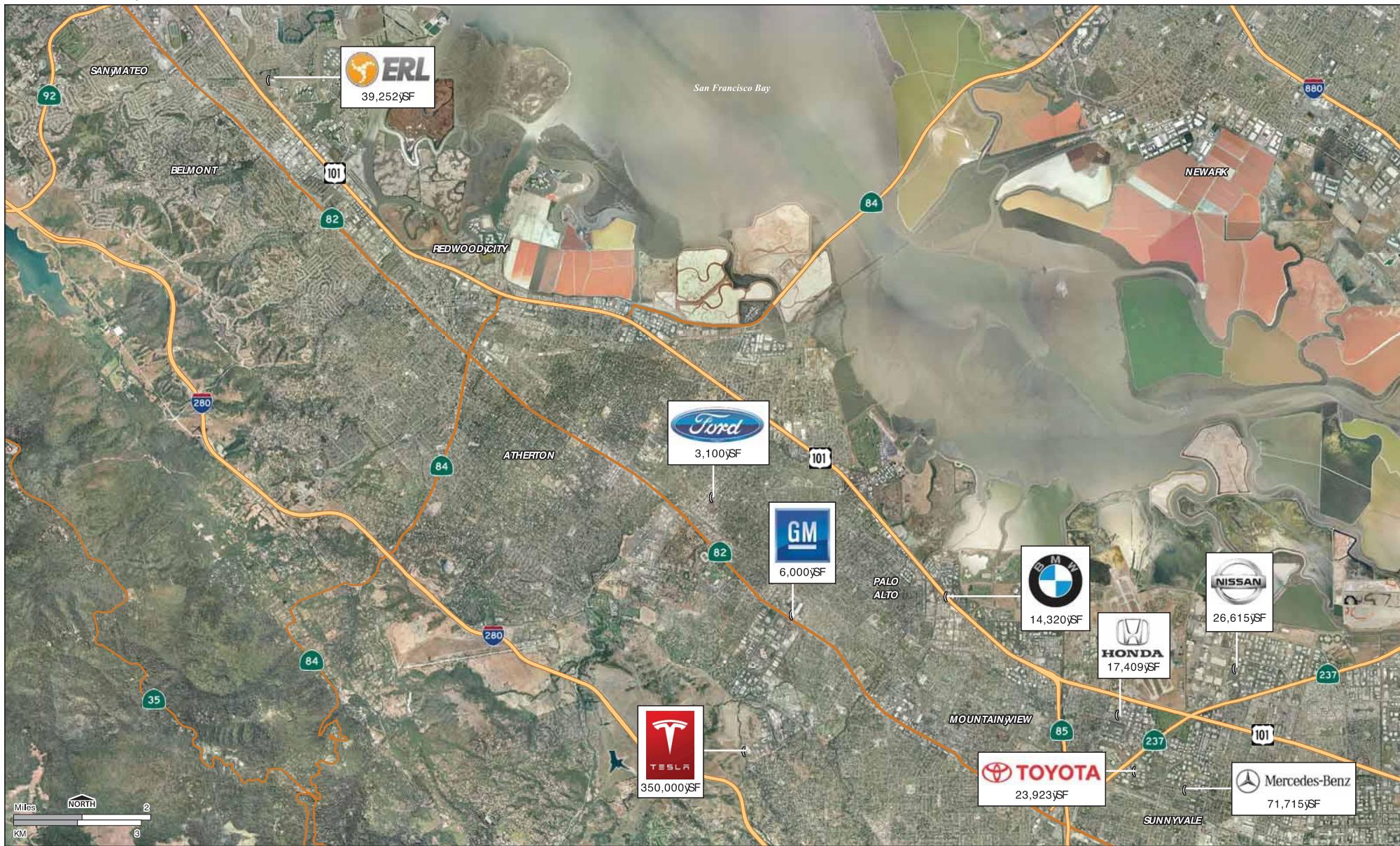
Astrobee - NASA



Zipline

February 2014

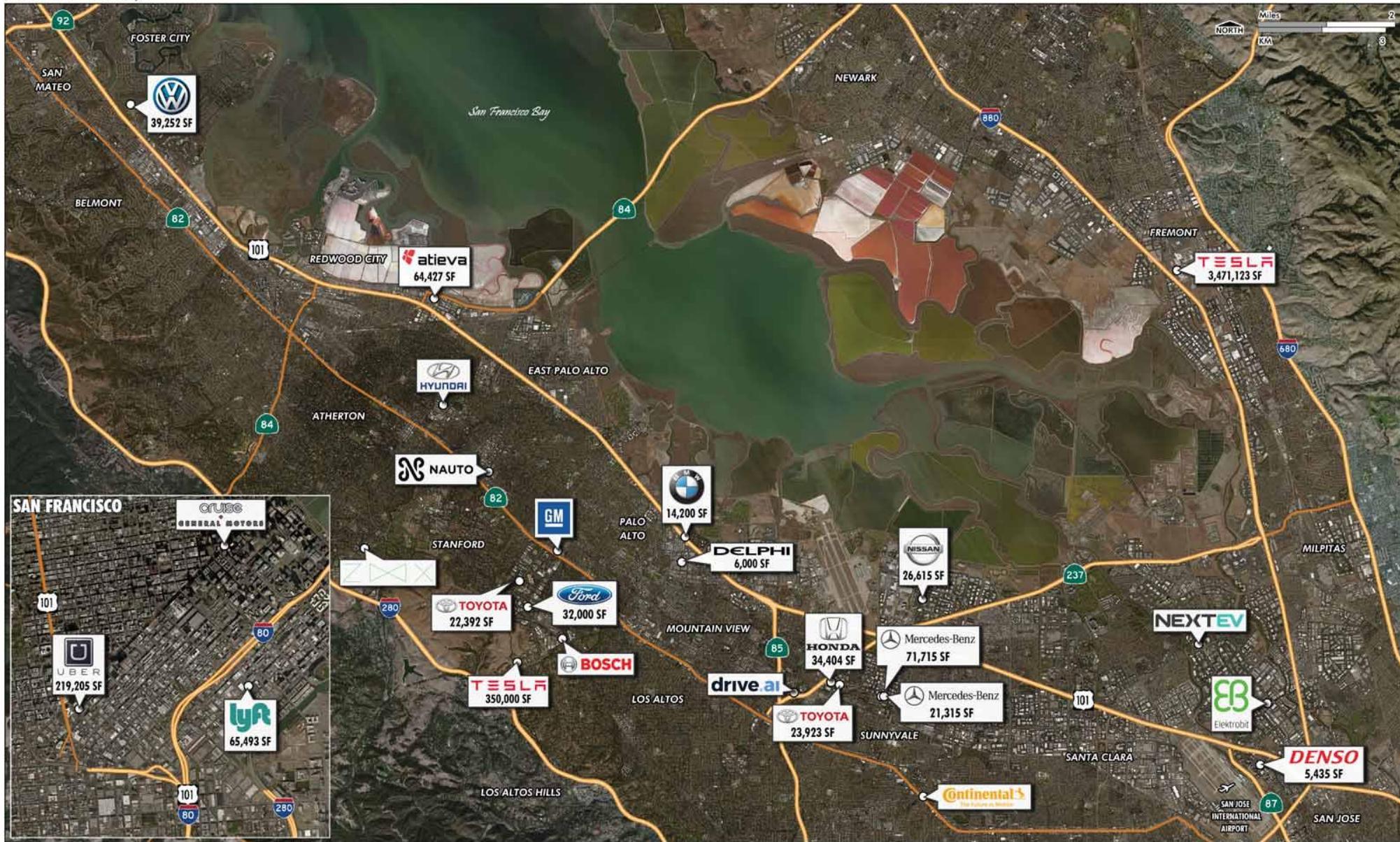
Silicon Valley



## Automotive R&D

April 2016

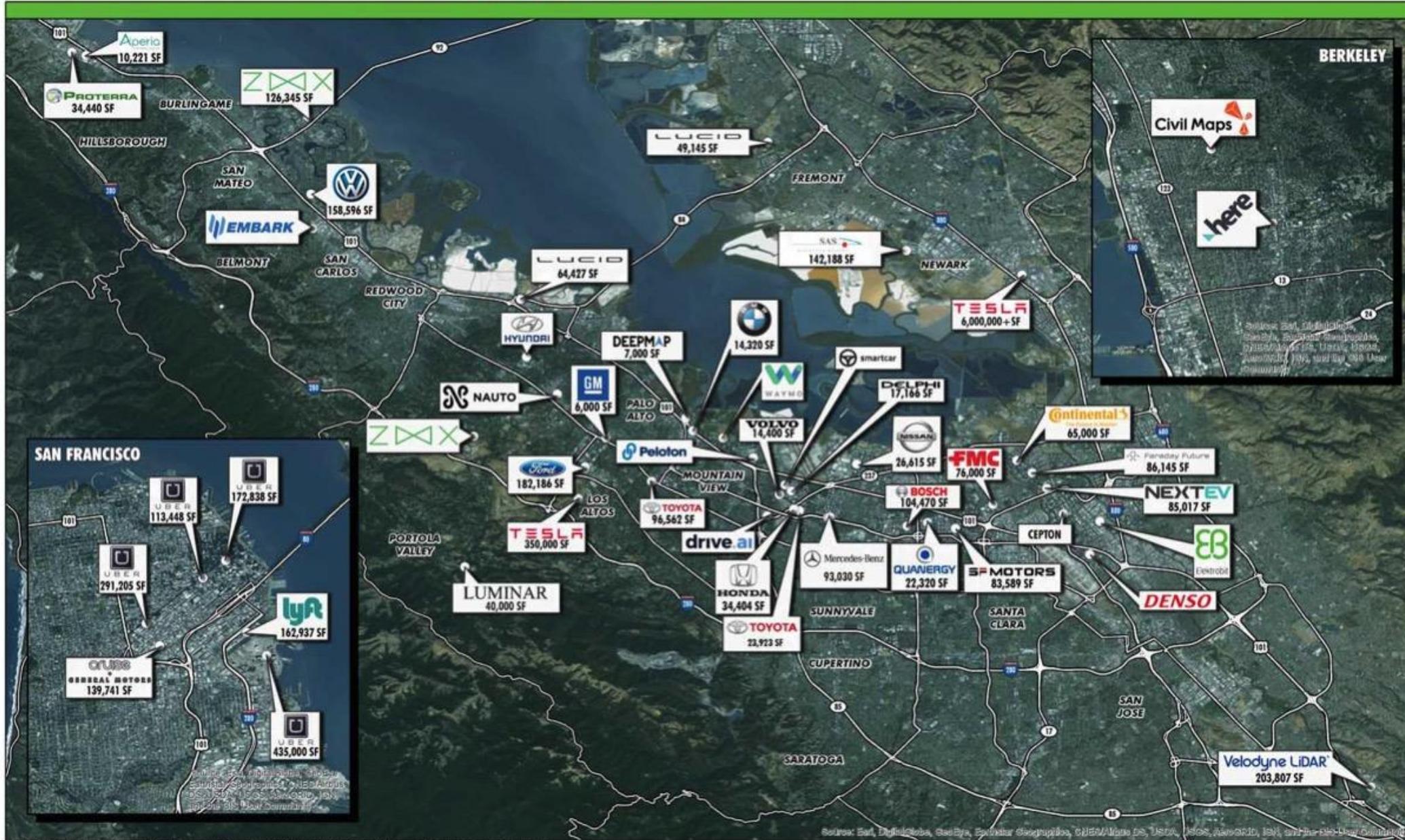
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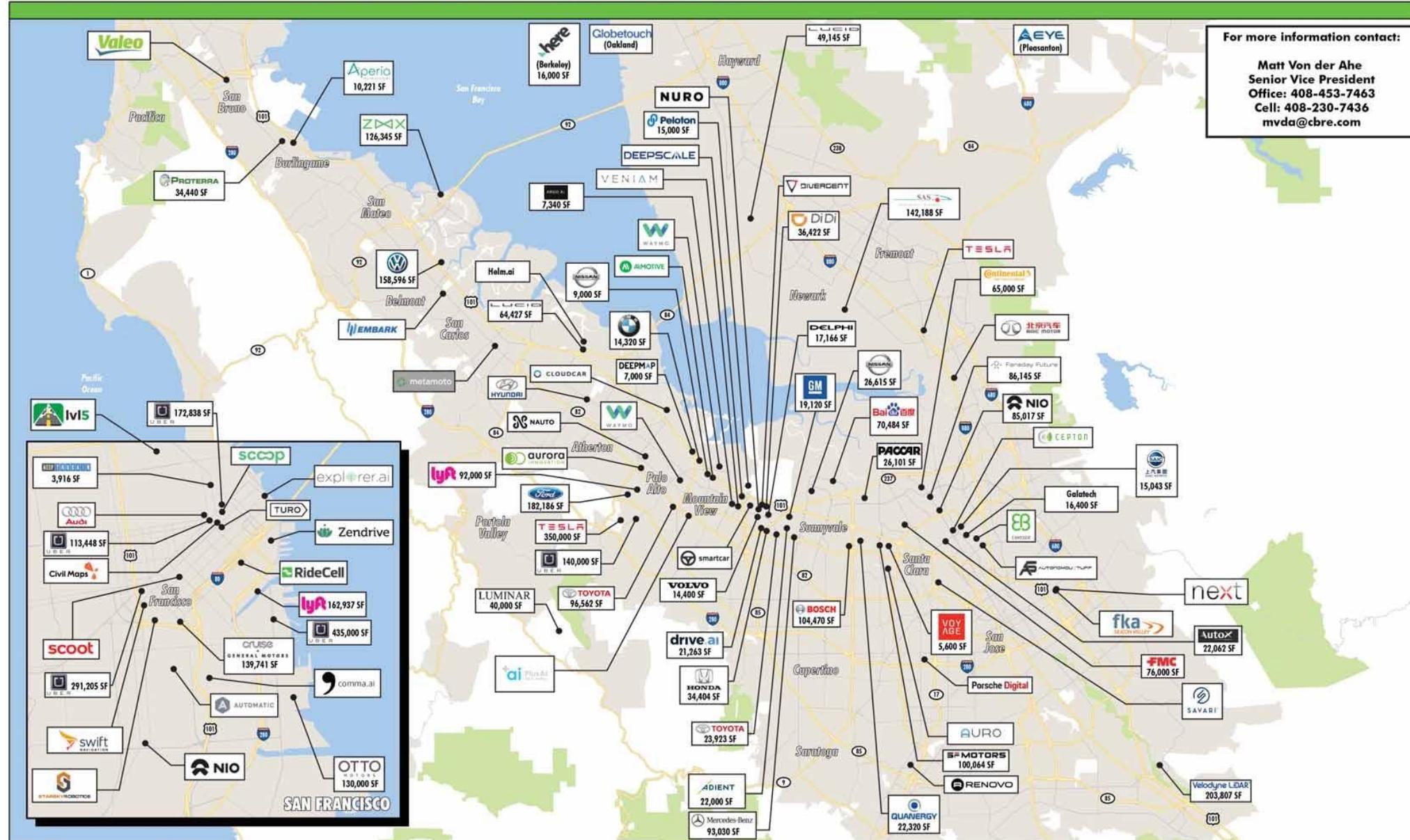
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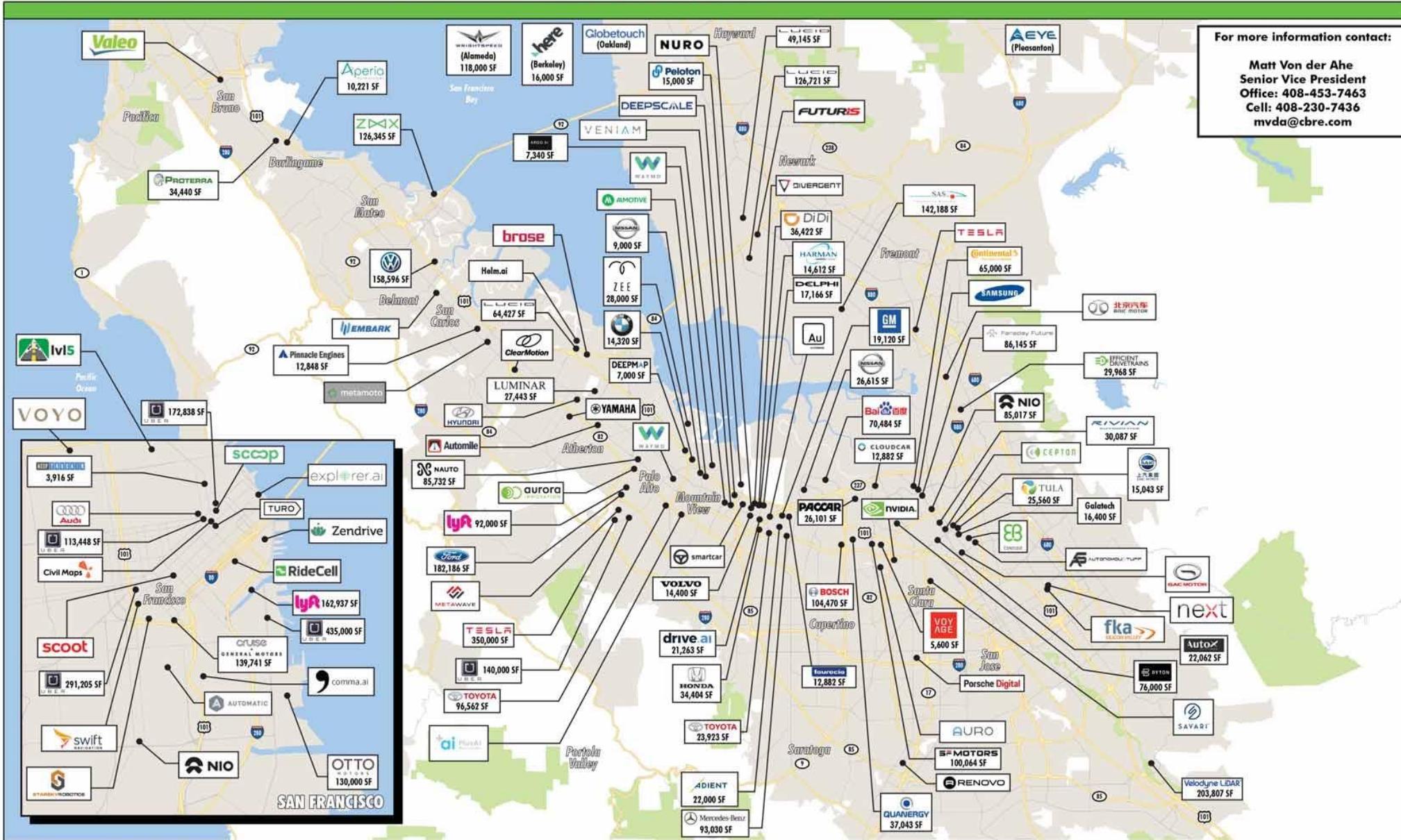
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# AUTO LAB MAP DECEMBER 2017 SILICON VALLEY



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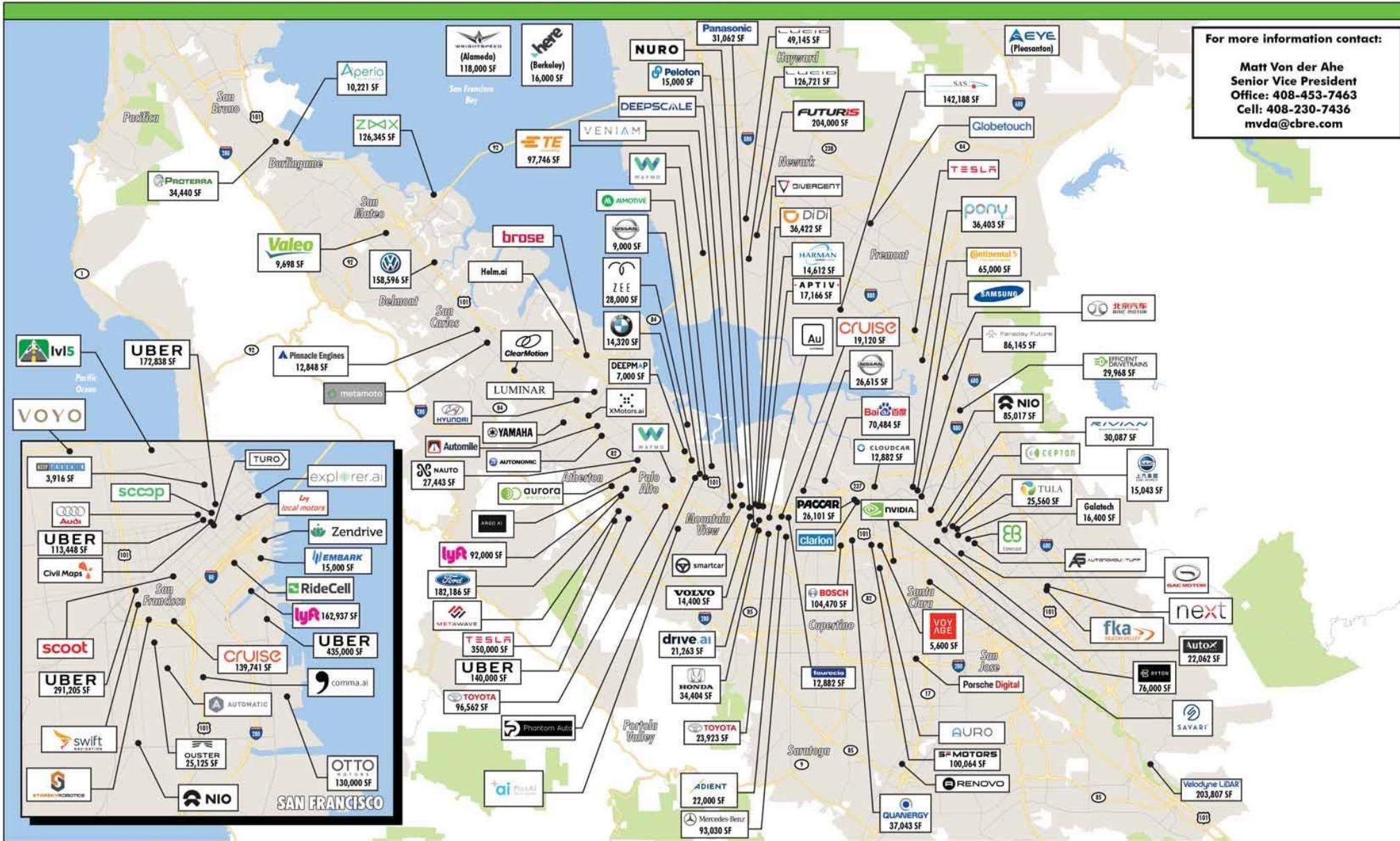
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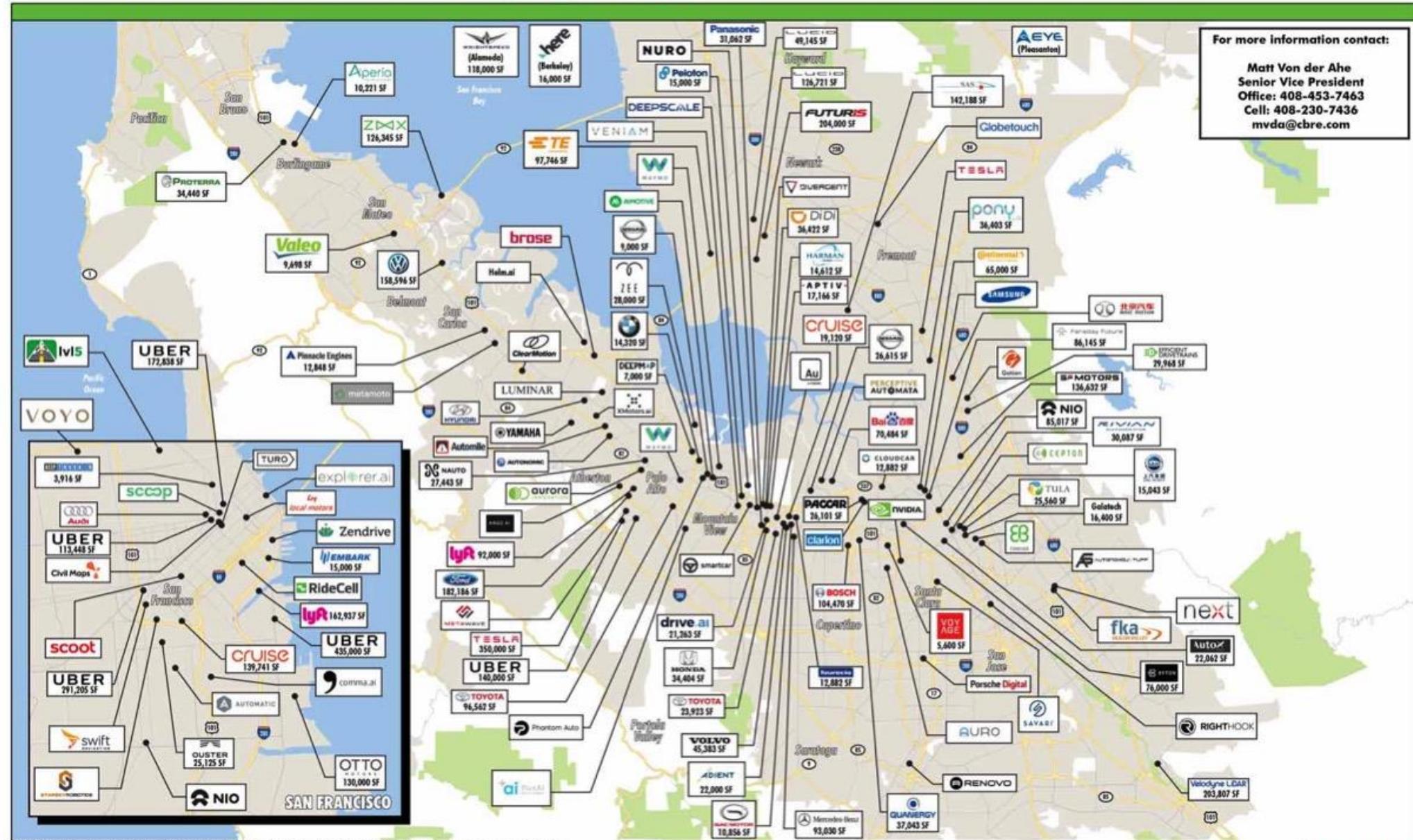
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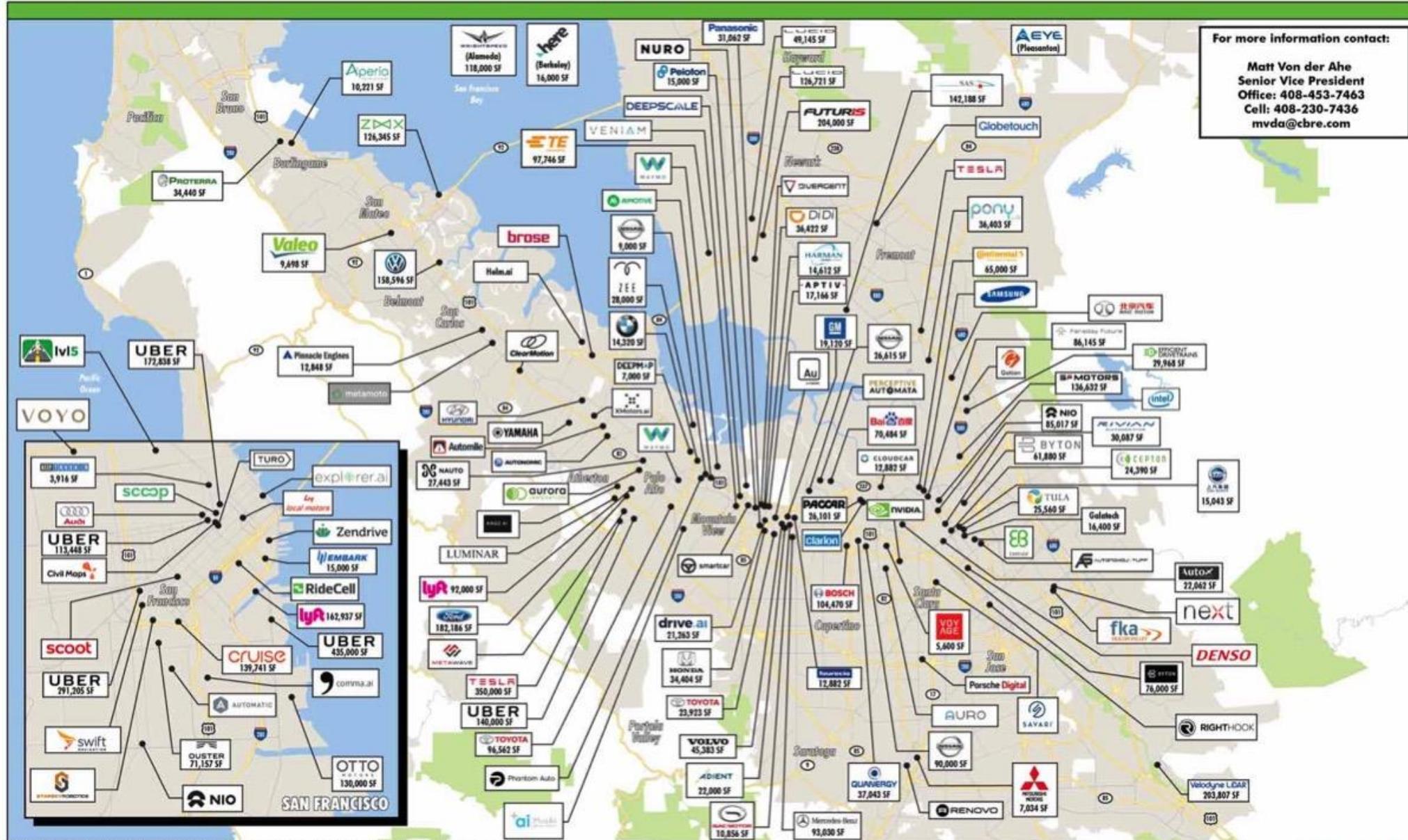
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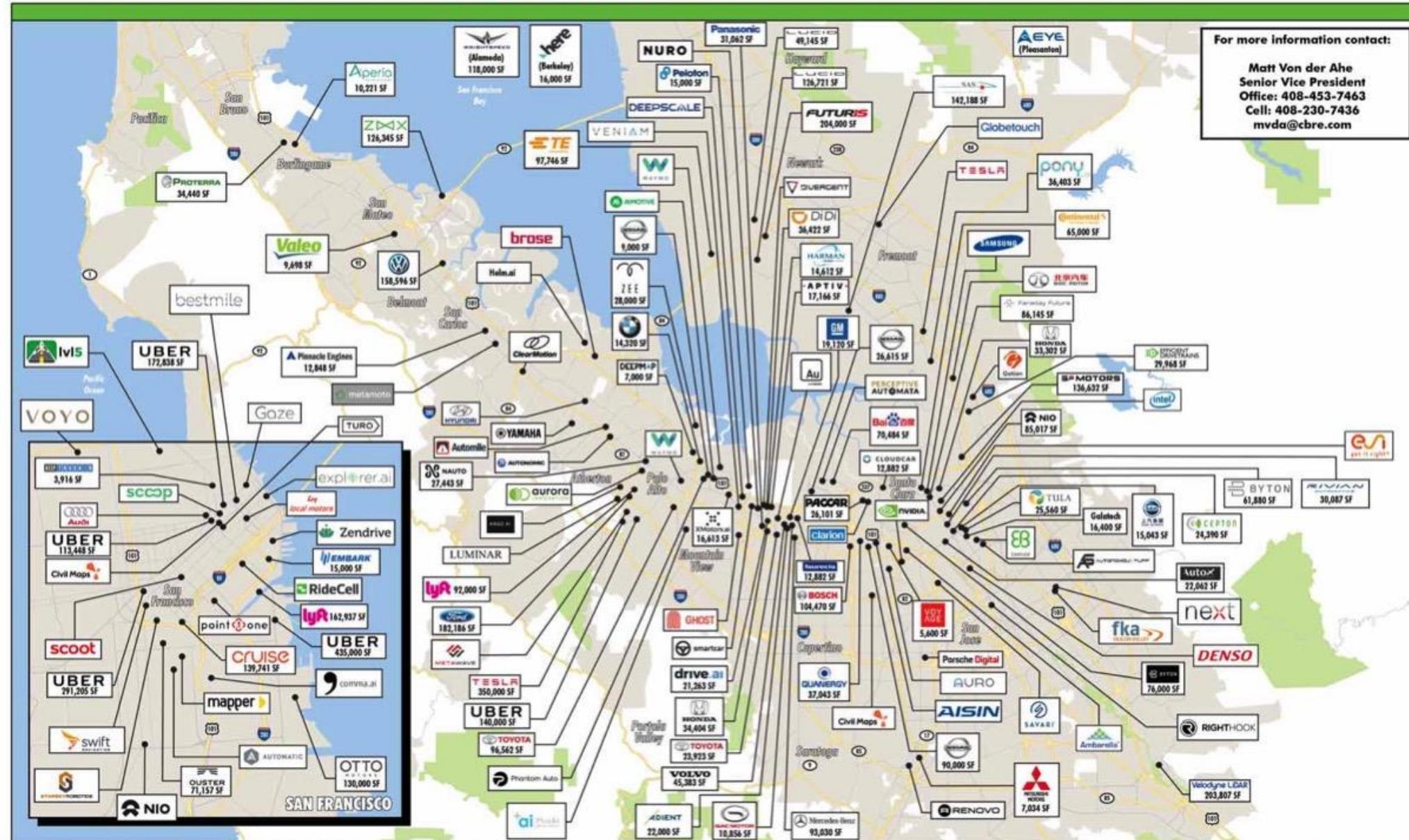
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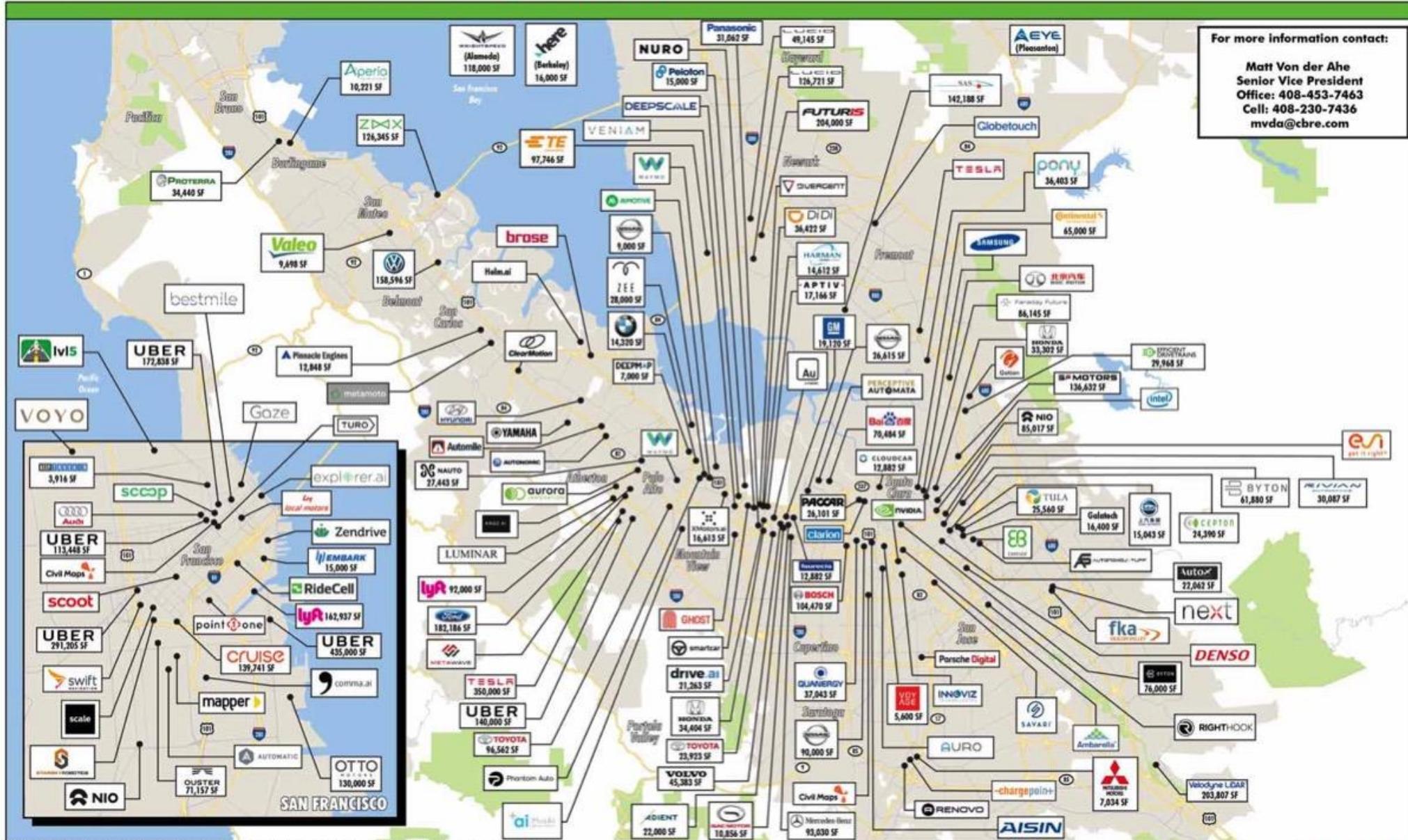
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A horizontal scale bar with numerical markings at 0, 1.5, 3, and 6.



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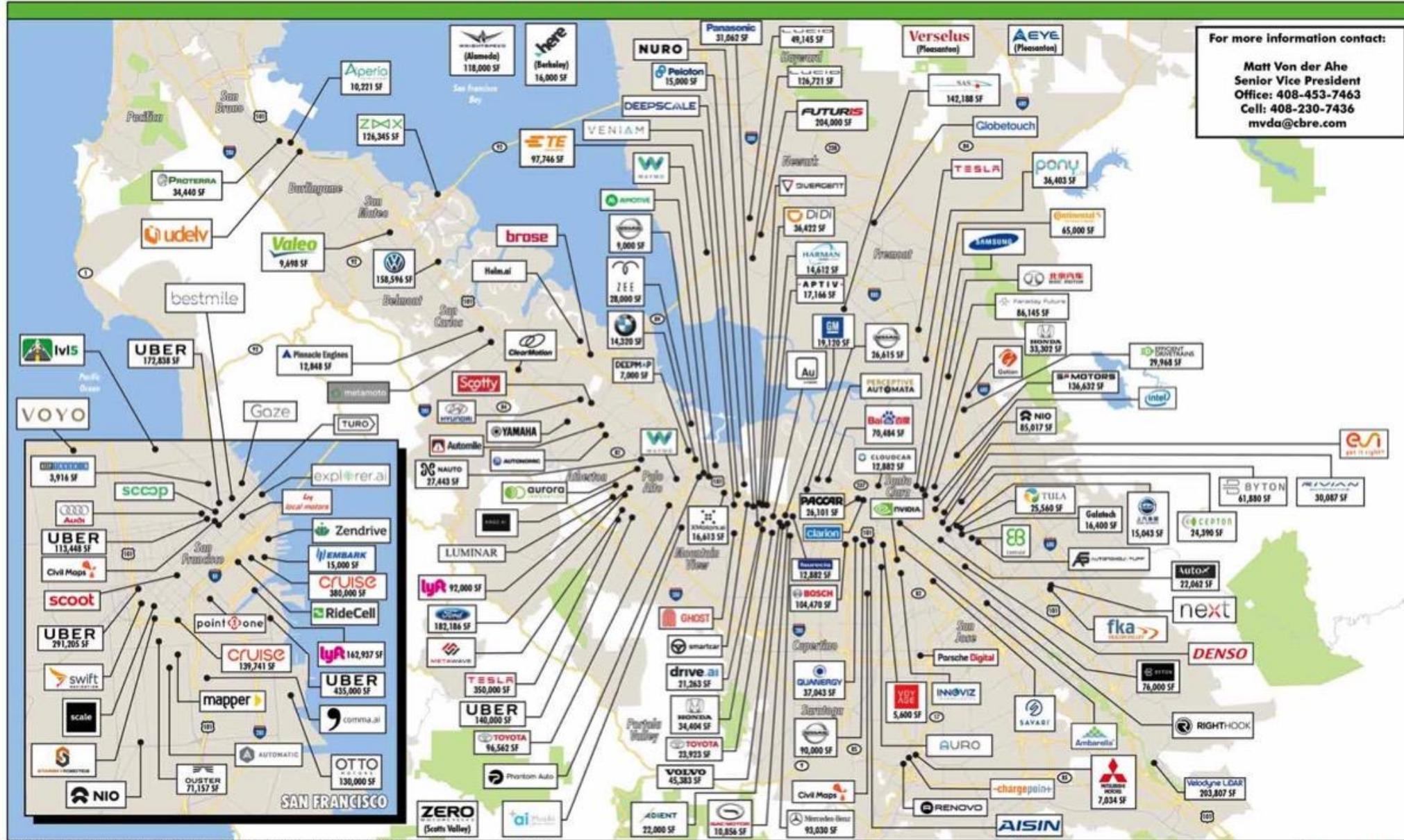
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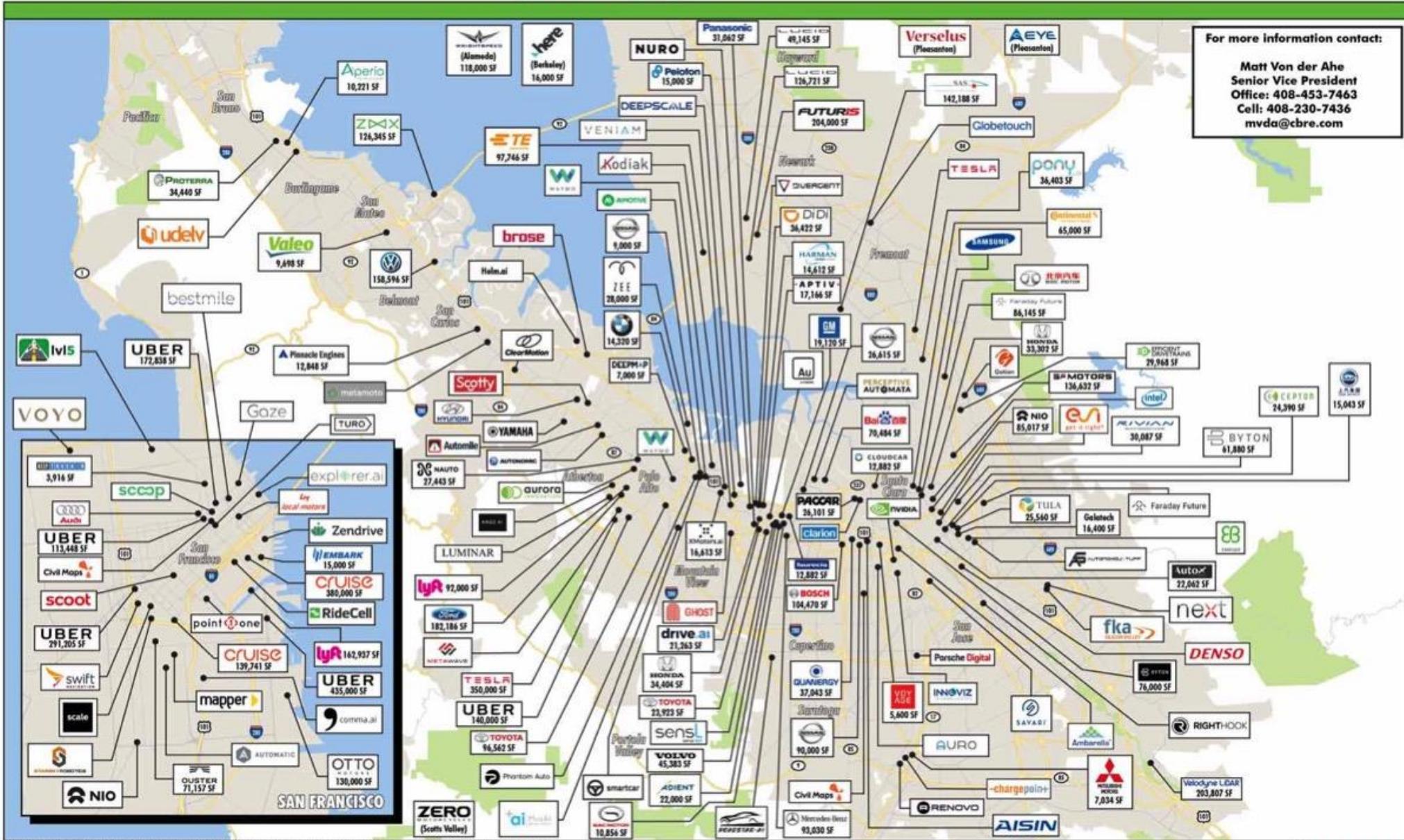
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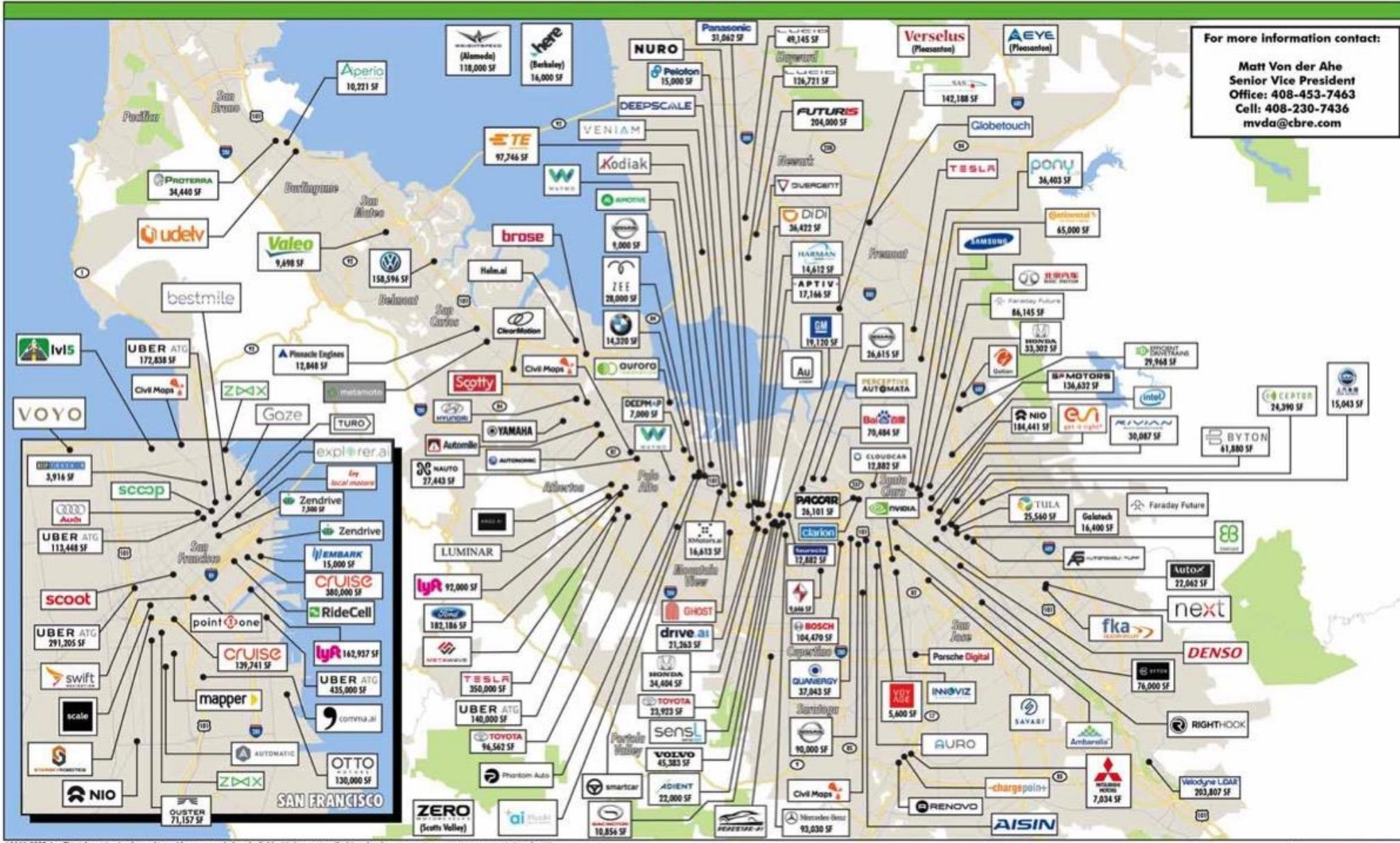
For more information contact:

Matt Von der Ahe  
Senior Vice President  
Office: 408-453-7463  
Cell: 408-230-7436  
mvda@cbre.com

**AUTO LAB MAP SEPTEMBER 2018** SILICON VALLEY

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[mvda@cbre.com](mailto:mvda@cbre.com)



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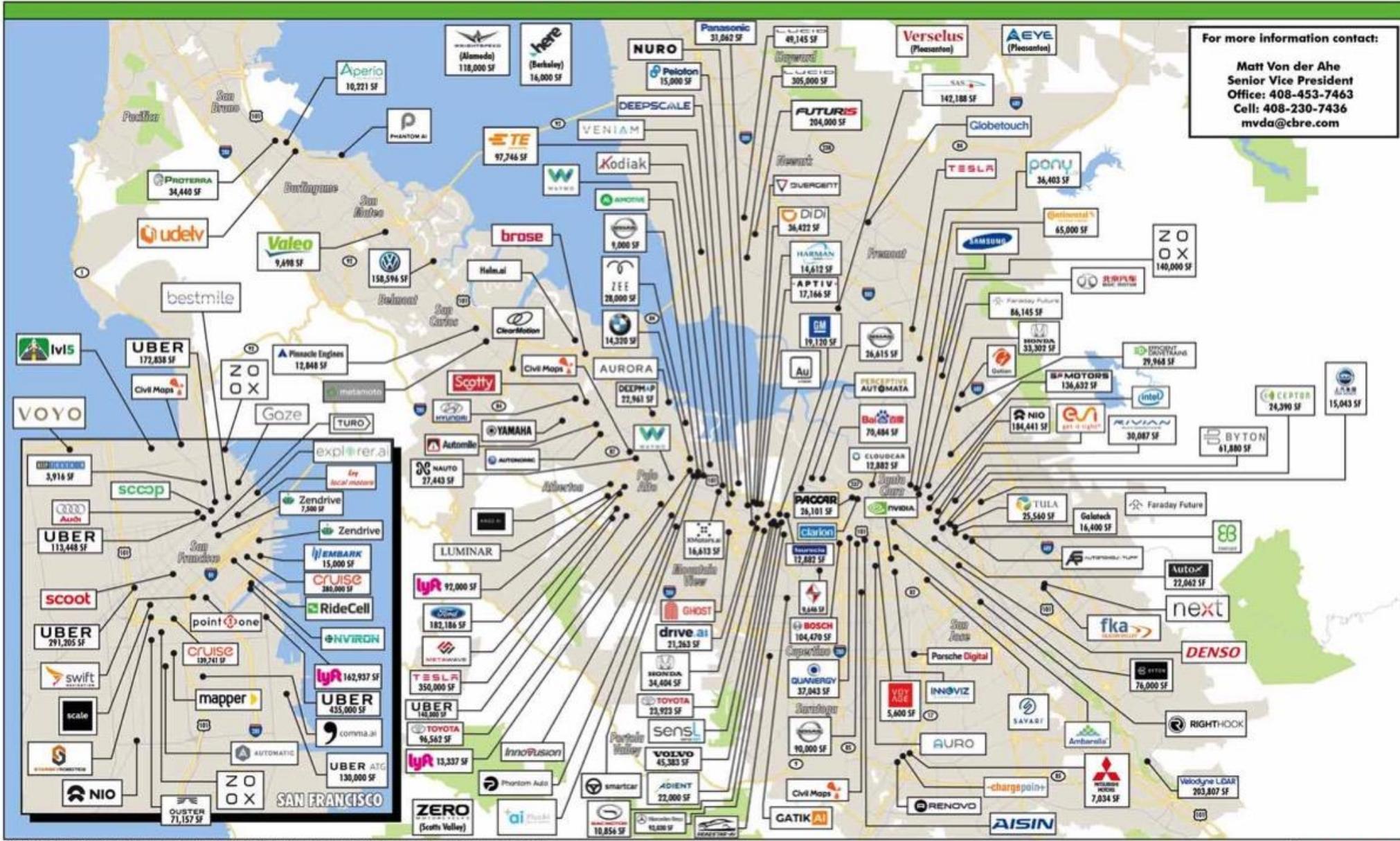
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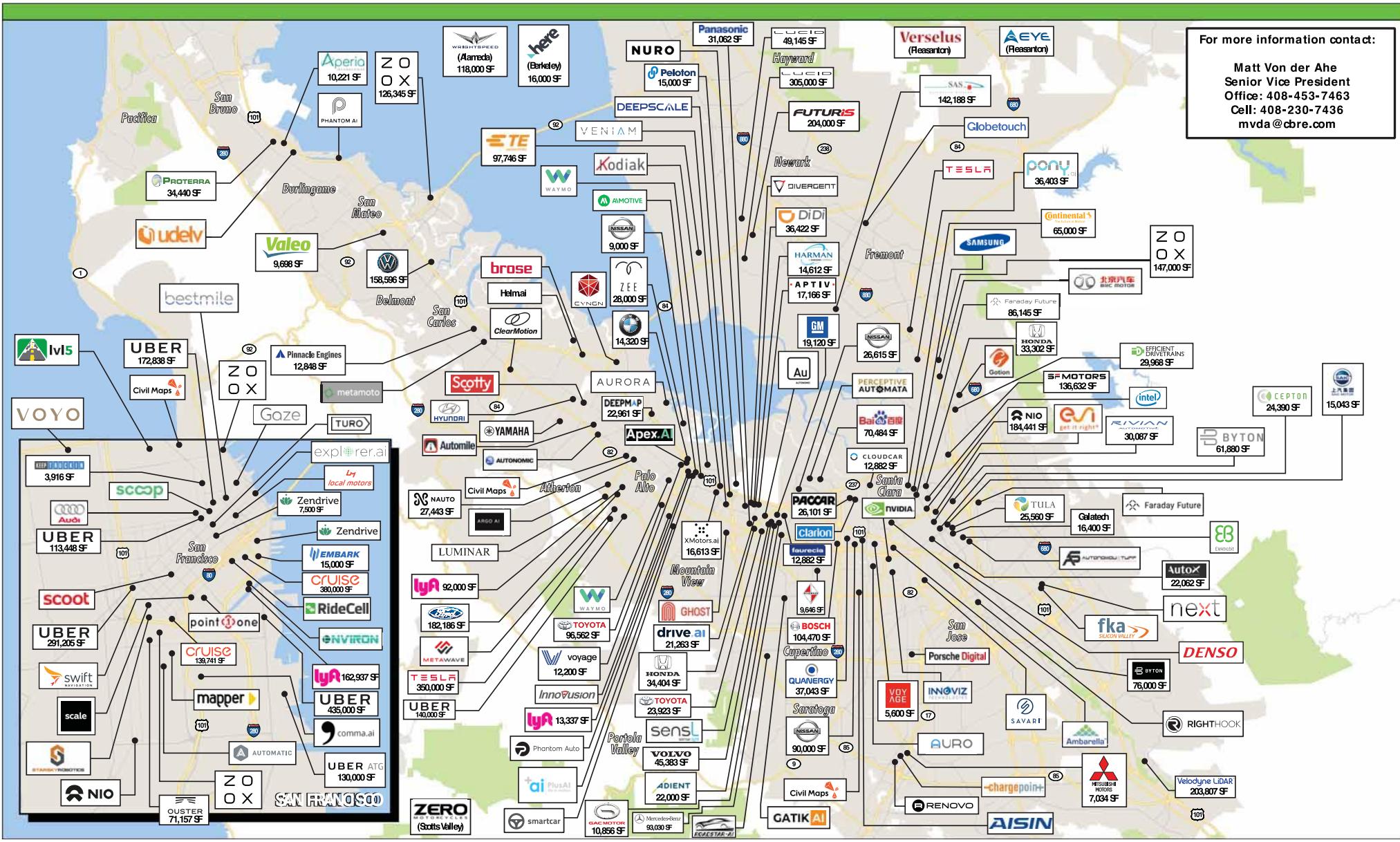
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AUTO LAB MAP NOVEMBER 2018 SILICON VALLEY



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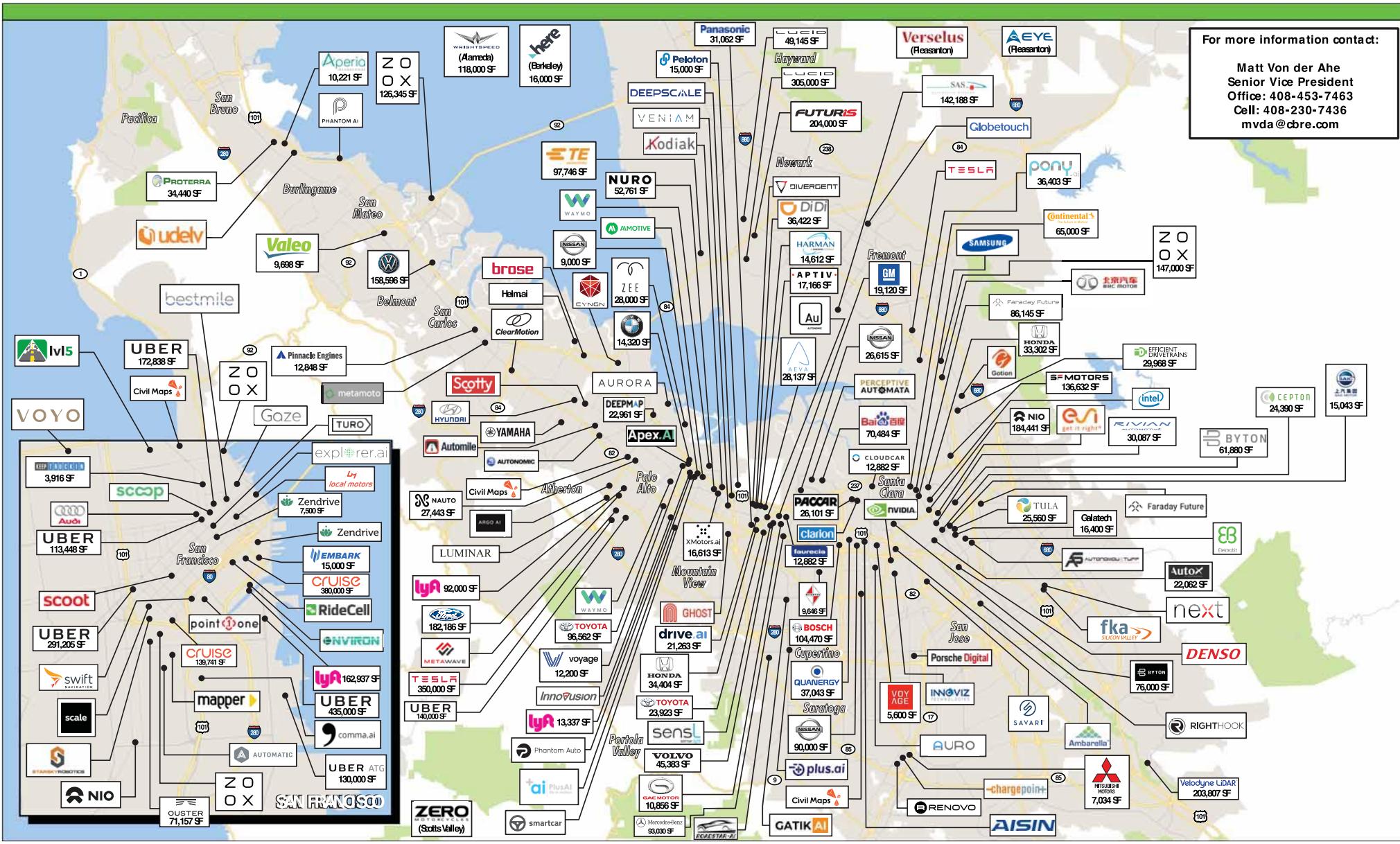
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**Cell: 408-230-7436**  
**[mvda@cbre.com](mailto:mvda@cbre.com)**



# AUTO LAB MAP DECEMBER 2018 SILICON VALLEY

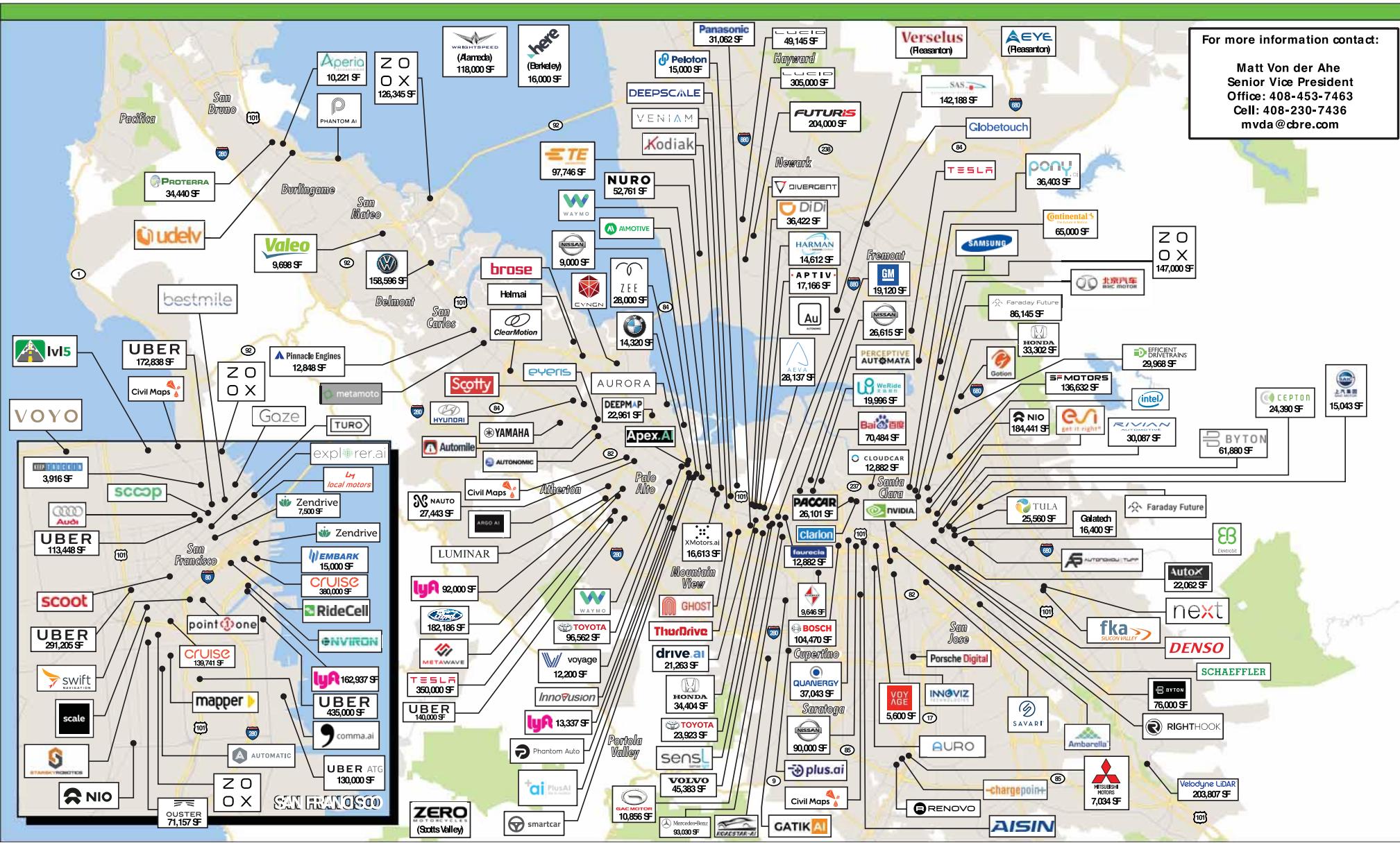


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AUTO LAB MAP JANUARY 2019 SILICON VALLEY



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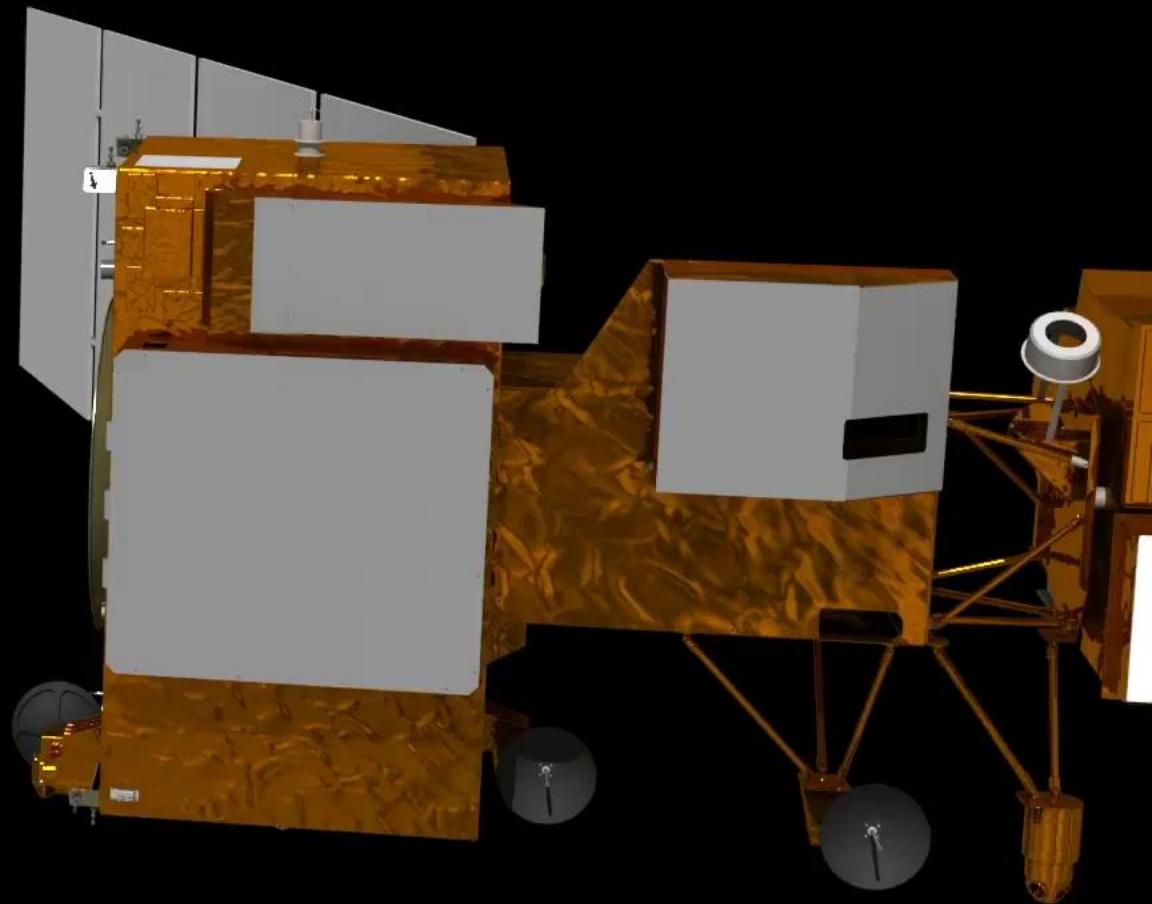
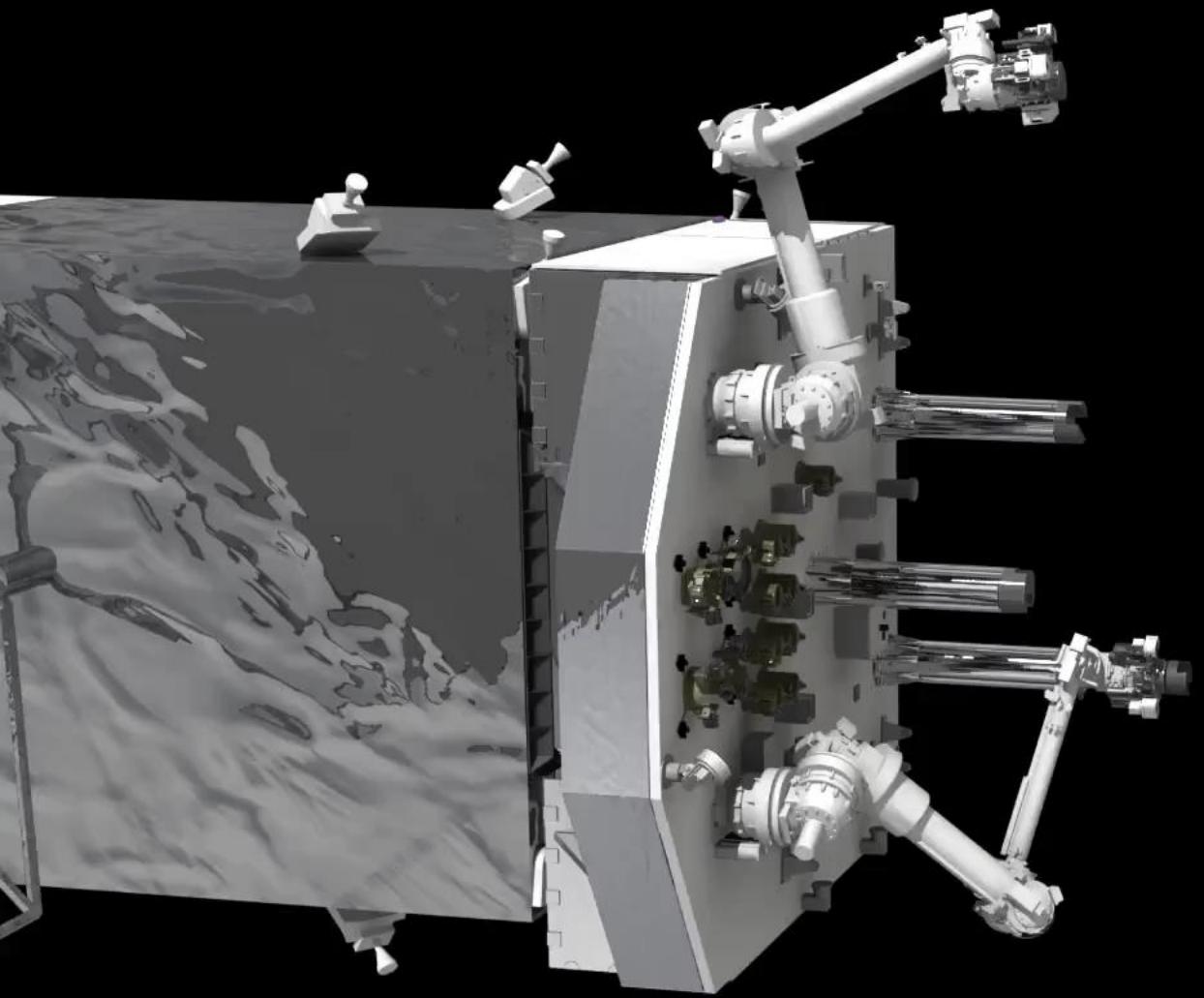
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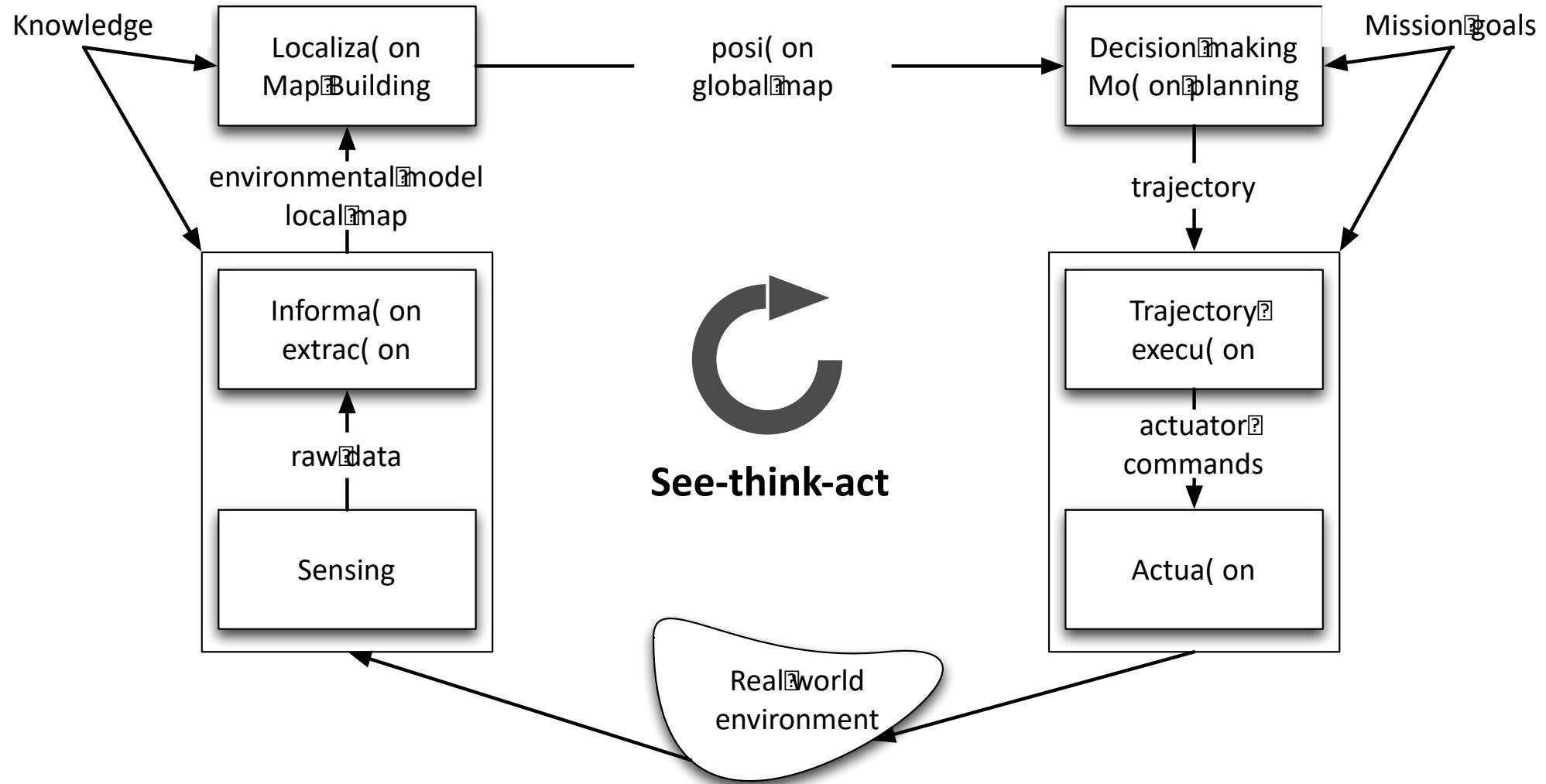
# The Drone Market Environment 2019



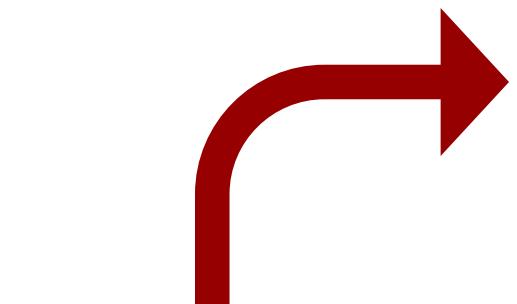
# Course goals

- To learn the *theoretical, algorithmic, and implementation* aspects of main techniques for robot autonomy. Specifically, the student will
  1. Gain a fundamental knowledge of the “autonomy stack”
  2. Be able to apply such knowledge in applications using ROS

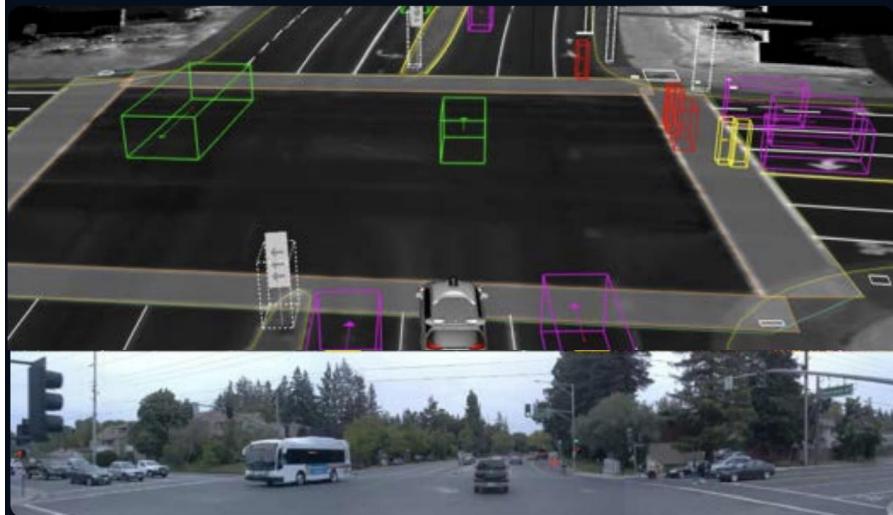
# The see-think-act cycle



# See-think-act cycle for AVs



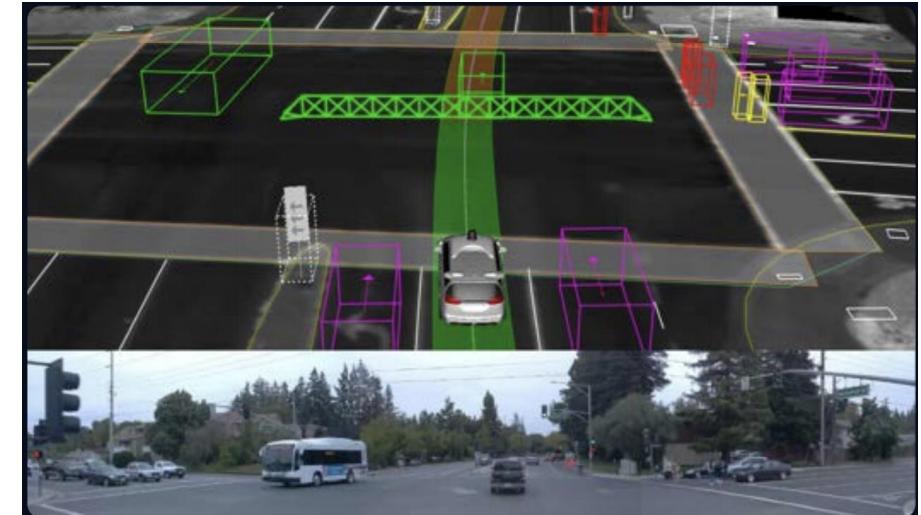
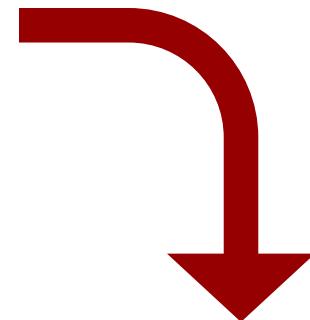
See



Think



Act



**Note:** other architectures are possible and subject of active R&D!

# Course structure

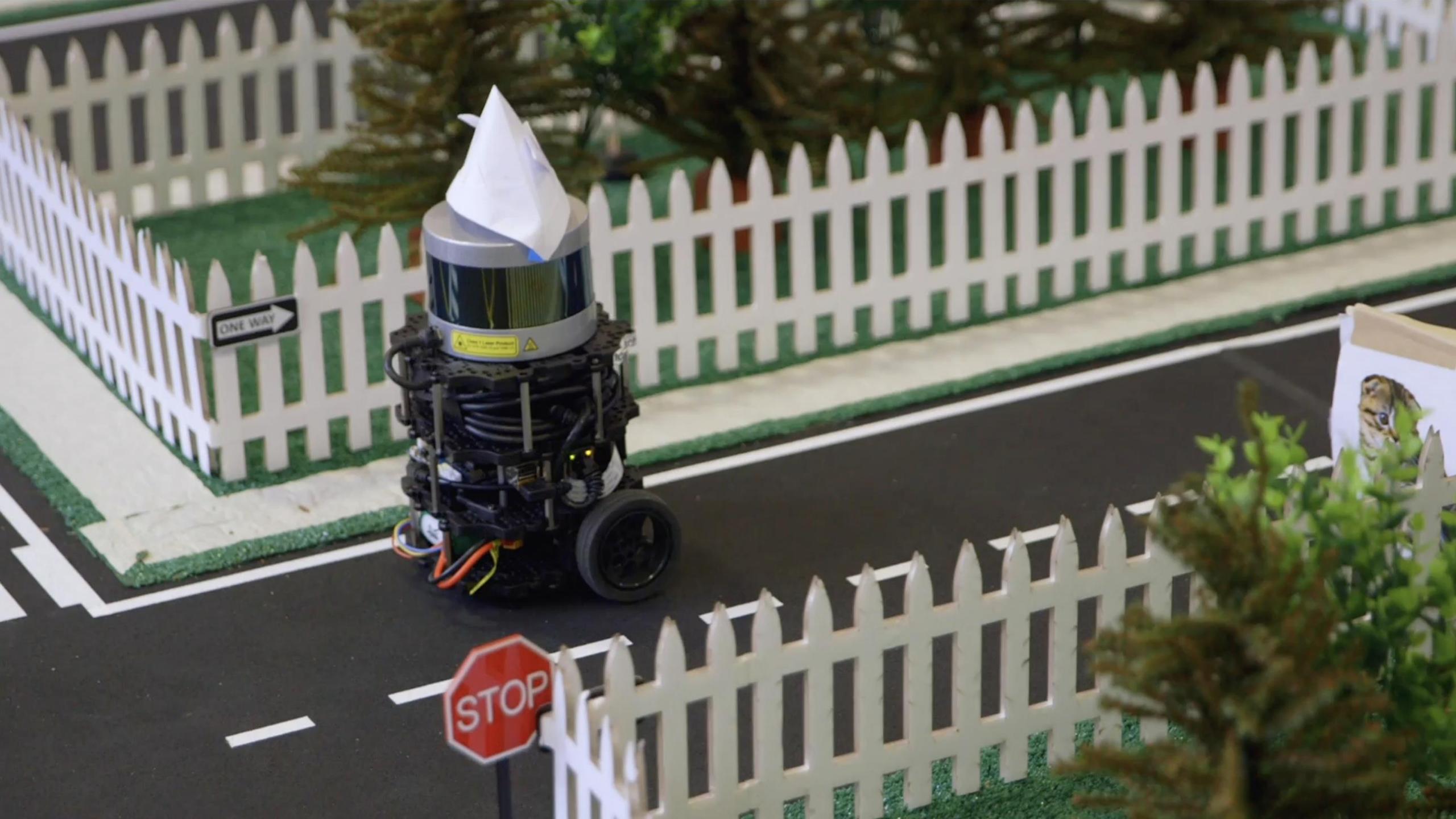
- Four main topics:
  1. Robot Operating System (week 1)
  2. Controls & Motion Planning (weeks 2-4) -- *act*
  3. Perception (weeks 5-8) -- *see*
  4. State Estimation, Localization & SLAM (weeks 8-11) -- *think*
- Extensive use of the Robot Operating System (ROS)
- Requirements
  - CS 106A or equivalent
  - CME 100 or equivalent (for calculus, linear algebra)
  - CME 102 or equivalent (for differential equations)
  - CME 106 or equivalent (for probability theory)
  - See also the [pre-knowledge quiz](#) on the course website

# Logistics

- Lectures:
  - Tuesdays and Thursdays, 10:30am – 11:50am (CODAB60)
- Sections
  - 2-hour, once-a-week on Fridays
  - Hands-on exercises that complement the lecture material, build familiarity with ROS, and develop skills necessary for working with hardware
  - [Link](#) to the section sign-up sheet

# Logistics

- Office hours:
  - Prof. Pavone: Tuesdays, 1:00 – 2:00pm (Durand 261), after class, and by appointment. Office hours will start during the week of Sep 29.
  - Course assistants: Wednesdays, 4:30 – 6:30pm (Durand 270), and Thursdays, 4:30 – 6:30pm (Durand 270)
- Course websites:
  - For course content: [https://stanfordasl.github.io/PoRA-I/aa174a\\_aut2526/](https://stanfordasl.github.io/PoRA-I/aa174a_aut2526/)
  - For course announcements: <https://canvas.stanford.edu/courses/214652/>
  - For course-related questions:  
<https://edstem.org/us/courses/87236/discussion/>
  - For homework submissions: <https://www.gradescope.com/courses/1137718>
  - To contact the AA174A staff: [aa174a-aut2526-staff@lists.stanford.edu](mailto:aa174a-aut2526-staff@lists.stanford.edu)



STOP

ONE WAY

# Team

## Instructor



Marco Pavone  
Associate Professor AA,  
and CS/EE (by courtesy)

## Collaborators

- Daniel Watzenig

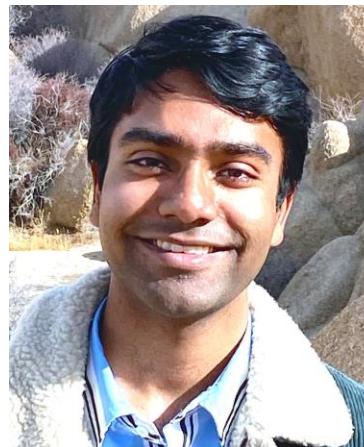
## Labs



Center for Automotive  
Research at Stanford

## CAs

## Milan Ganai



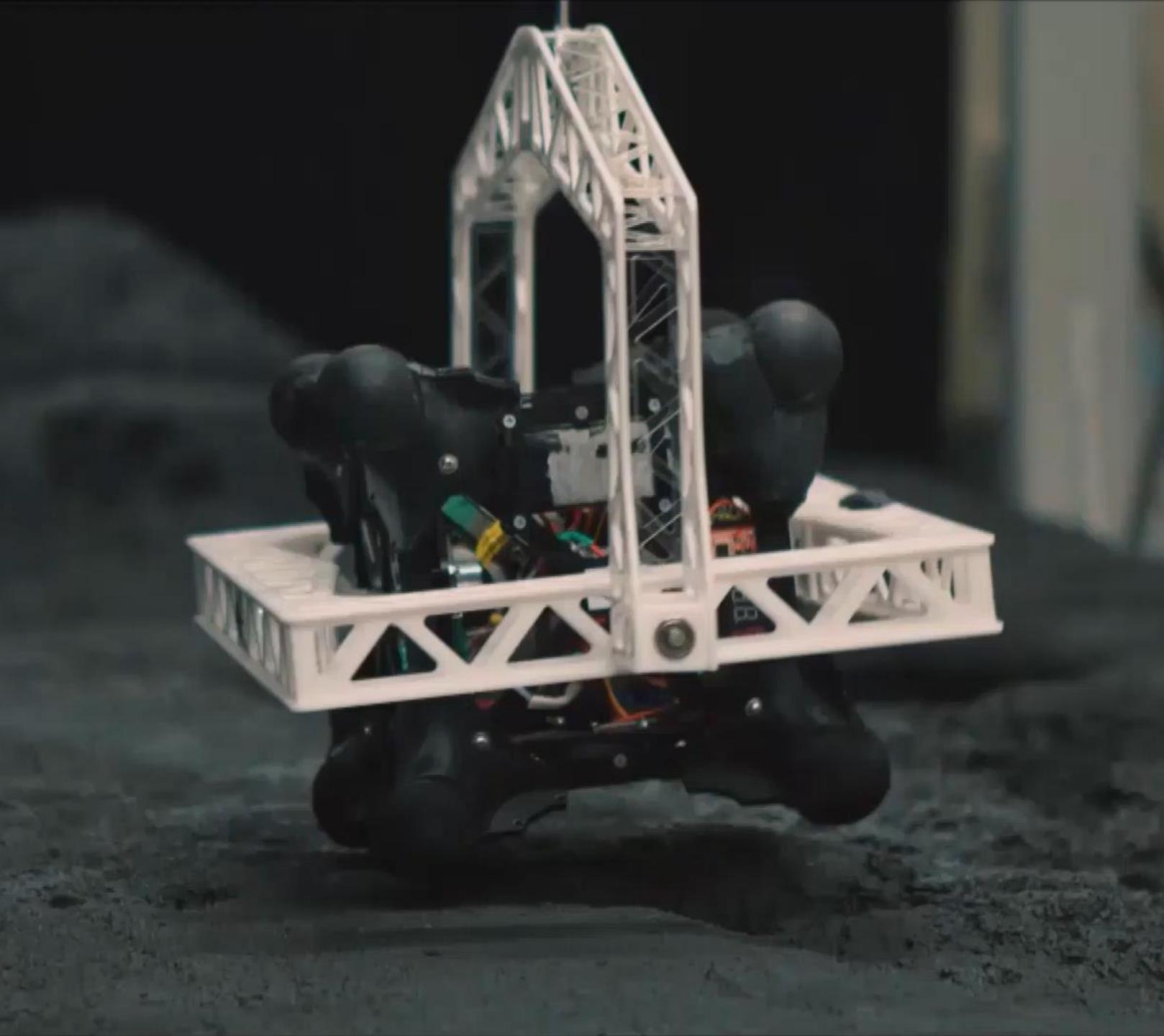
## Yujung Jenny Kim



Jacky Kwok

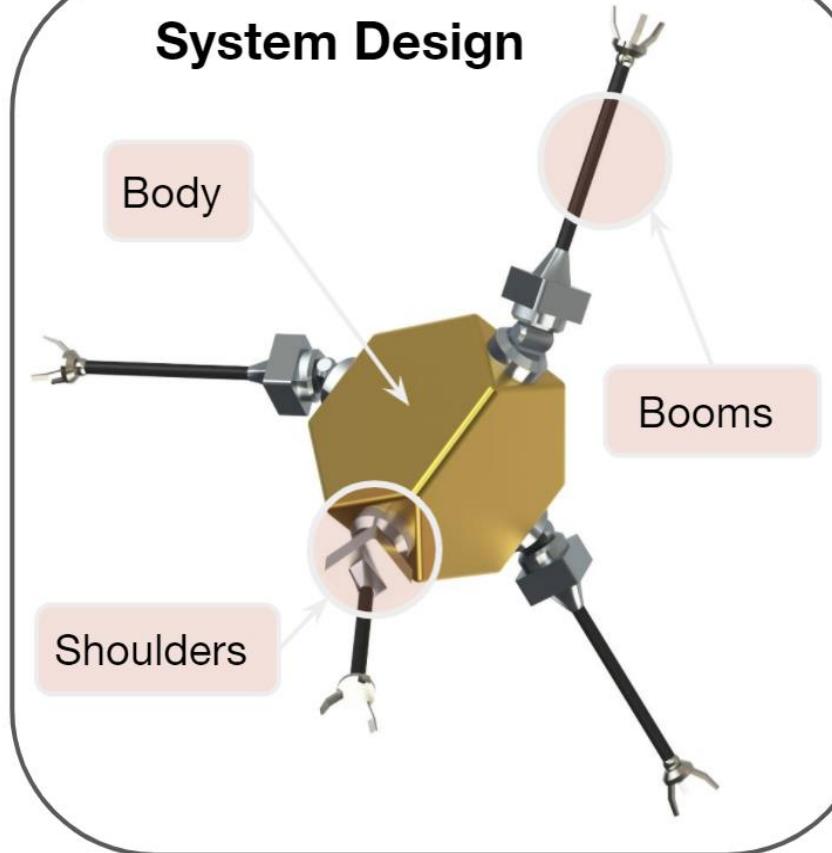


Courtesy of NASA JPL





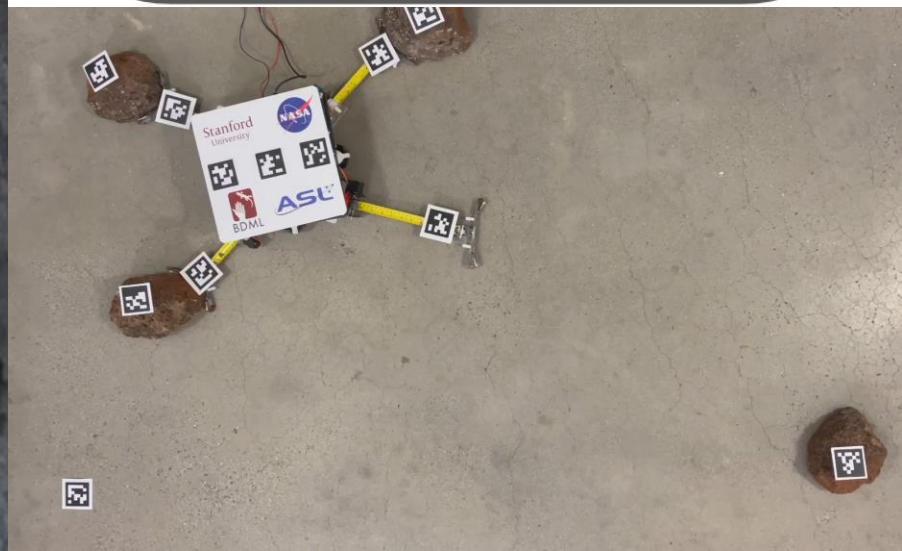
## System Design



Shoulders

Body

Booms





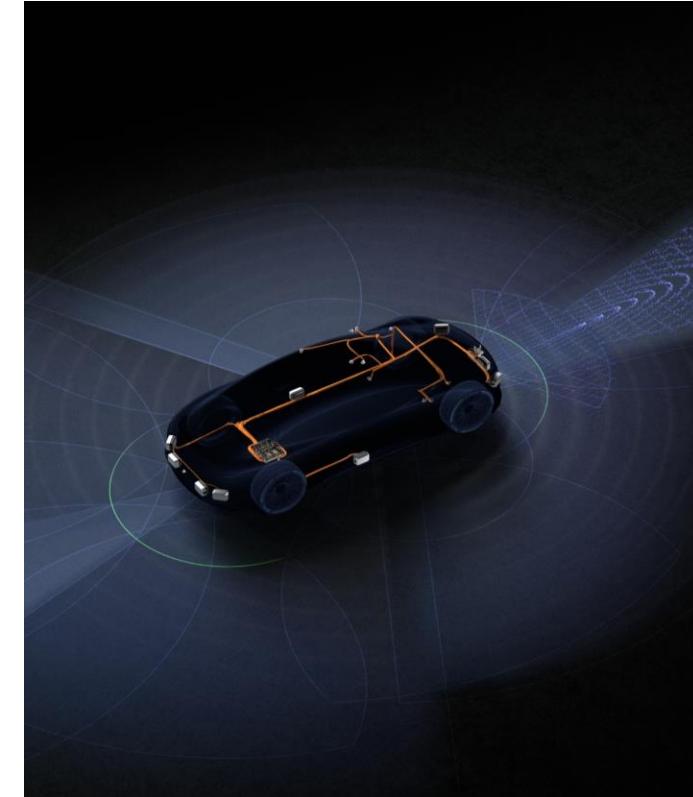


# Center for Automotive Research at Stanford



<https://cars.stanford.edu/>

# Autonomous Vehicle Research at NVIDIA

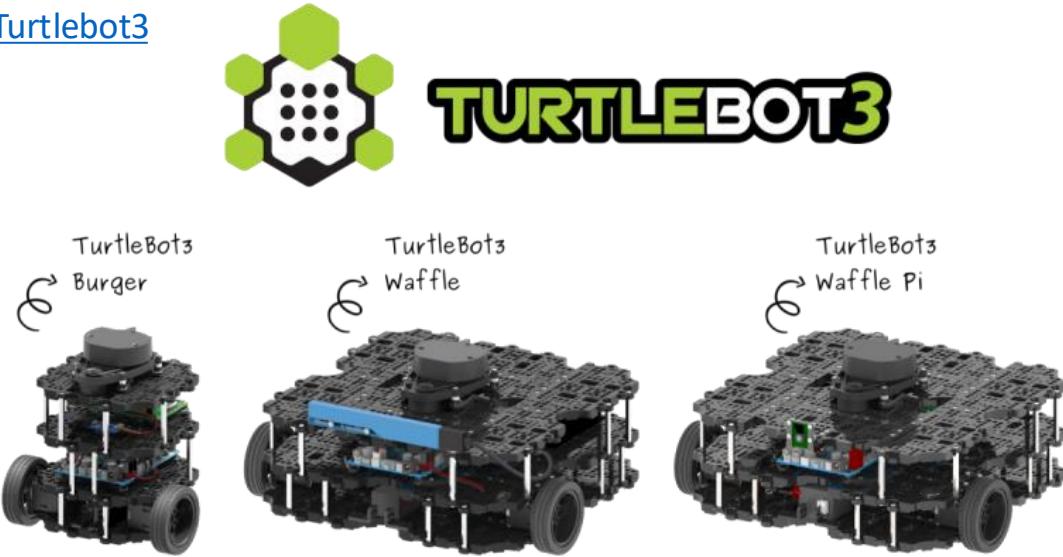


<https://research.nvidia.com/labs/avg>

# Schedule

Date	Topic	Assignments
09/23	Course overview, intro to robotic systems and ROS	
09/25	Fundamentals of ROS & vectorized computation in Python	
09/26	★ Section 1 – UNIX, Git, and Python	HW1 out
09/30	State space dynamics – definitions and modeling	
10/02	State space dynamics – computation and simulation	
10/03	★ Section 2 – ROS, workspaces, packages, nodes	
10/07	Trajectory optimization	HW2 out
10/09	Trajectory tracking	
10/10	★ Section 3 – Launch files & RVIZ	HW1 due
10/14	Motion planning I: graph search algorithms	
10/16	Motion planning II: sampling-based methods	
10/17	★ Section 4 – Controller gain tuning in hardware	HW2 due
10/21	Robotic sensors & introduction to computer vision	HW3 out
10/23	Camera models and camera calibration	
10/24	★ Section 5 – Running a point-to-point navigator	
10/28	Image processing, feature detection, & feature description	
10/30	Information extraction	
10/31	★ Section 5 cont. & Section 6 head start	HW3 due, HW4 (part 1) out
11/04	No Lecture – Democracy Day	
11/06	<i>In-class midterm</i>	
11/07	★ No Section	
11/11	Deep learning for computer vision	
11/13	Intro to state estimation & filtering theory	
11/14	★ Section 6 – Object detection	HW4 (part 2) out
11/18	Parametric filtering (KF and EKF)	HW4 (part 1) due
11/20	Markov localization and EKF-localization	
11/21	★ Section 7 – Frontier exploration	
11/25		
11/27	<i>Thanksgiving</i>	
11/28		
12/02	Multi-sensor perception & sensor fusion	HW4 (part 2) due
12/04	Simultaneous localization and mapping (SLAM)	
12/05	★ Section 7 cont.	

## [Turtlebot3](#)



- Imagine you have a robot with sensors, motors, and AI. [Velodyne LiDAR](#)
- How do you make all the pieces talk to each other - reliably, in real time, and in a way others can build on?
- That's where ROS comes in!

# Quadrotor



# Manipulation



# TurtleBot



# The Challenge of Building Robots

- Robots are complex systems
  - Hardware
    - Sensors (IMU, velocity, LiDAR, Camera, Microphone, ...)
    - Actuators (wheels, joints, grippers, valves, ...)
    - Structures (Links, frame, ...)
  - Software
    - Control
    - Trajectory planning
    - Object detection
    - Localization
    - ...

# What would we do without ROS?

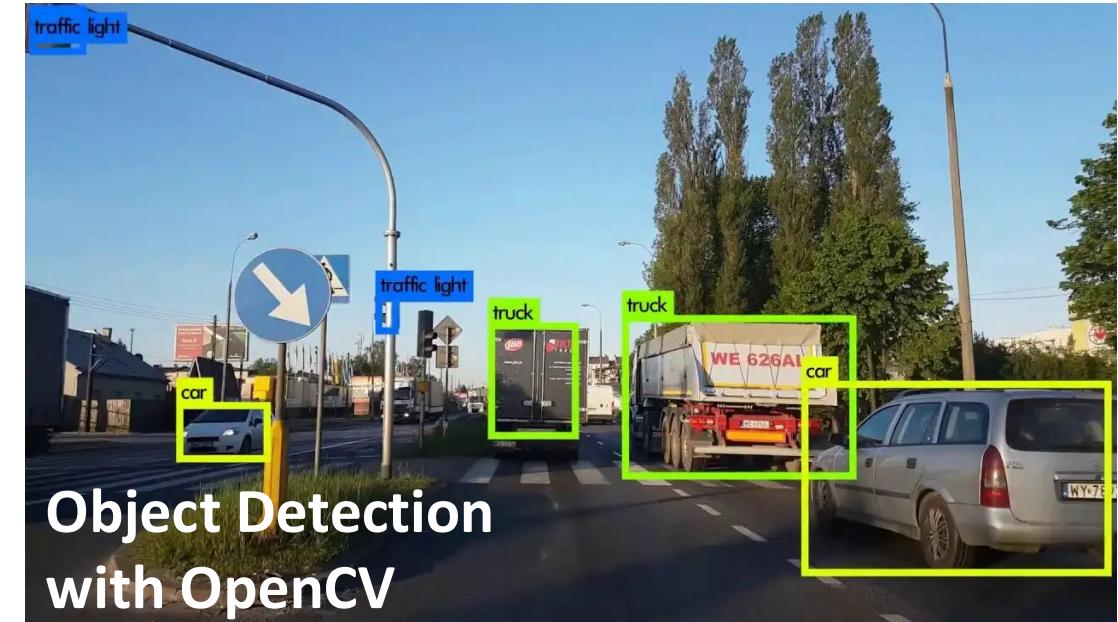
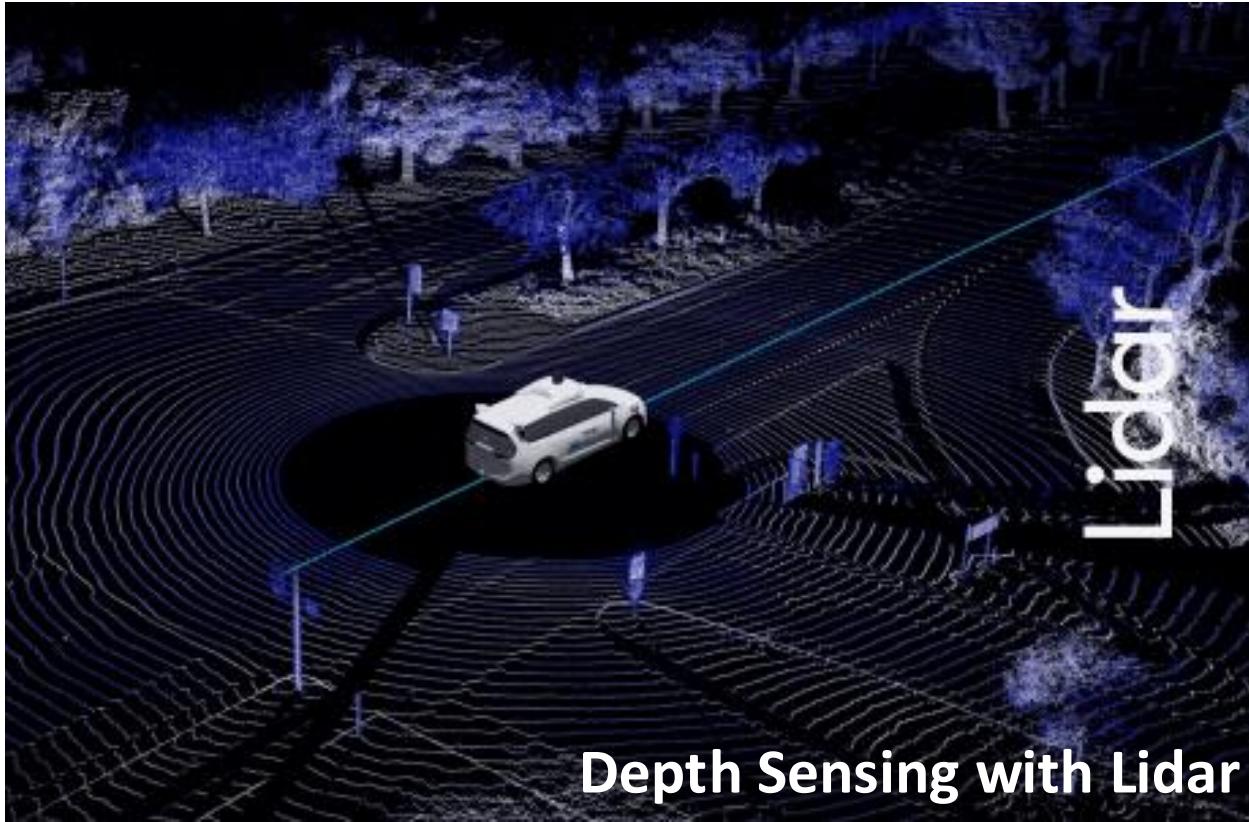
- Write custom code to connect sensors and actuators.
- Reinvent tools for visualization, debugging, and simulation.
- Struggle with versioning, testing, and sharing code.

# What is ROS?

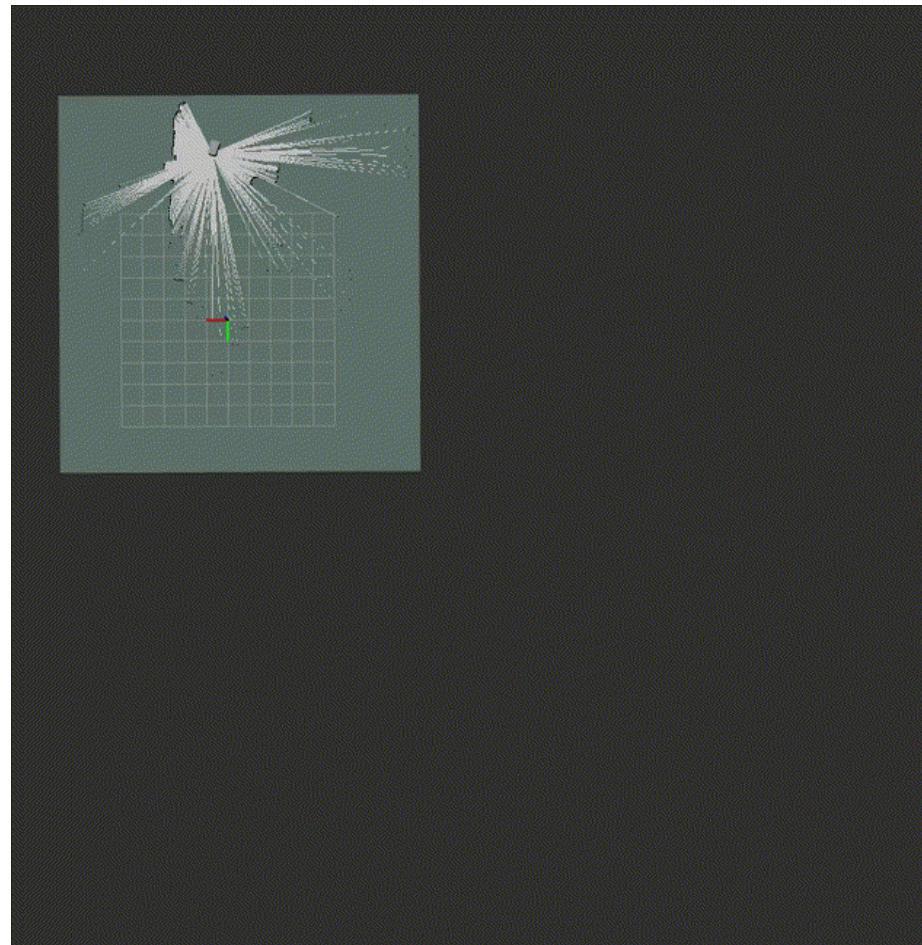


- Middleware (Not an operating system)
- ROS provides:
  - Launching different components
  - Communication between components → Publish/subscribe messaging system.
  - Reusable components → Packages for navigation, vision, motion planning
  - Tools for visualization & debugging → RViz, Gazebo, rqt.
  - Community & ecosystem → Thousands of open-source packages.

# Perception



# Localization and Mapping



# Navigation



# Manipulation

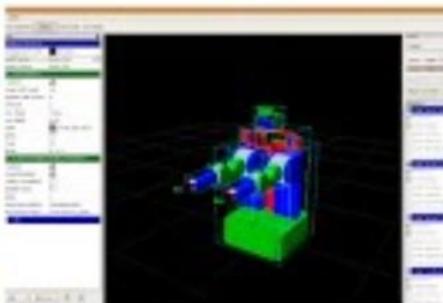


# Simulation and Visualization

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Gazebo



Rviz



RQT

---

**ROS2 Simulation and Visualization Tools**

# Multidisciplinary Collaboration

- All disciplines come together
  - Mechanical engineers: Design the robot body and actuators
  - Electrical engineers: Design actuators, sensors, and control
  - Computer scientists / AI researchers: Implement perception and planning
  - Design experts: Build human-robot interfaces via ROS APIs.

# Robot Operating System – History

ROS 1



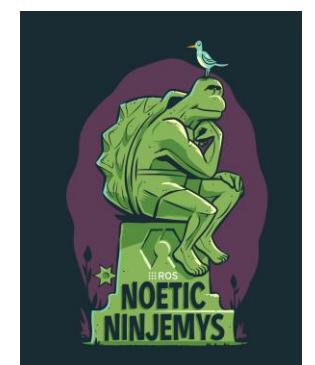
2014 - 2019



2016 - 2021



2018 - 2023



2020 - 2025

ROS 2



2019 - 2021



2020 - 2023



2022 - 2027



2017 - Present

# Key takeaways



- ROS is a **framework** that connects all parts of a robot.
- It saves time, encourages collaboration, and accelerates innovation.
- ROS brings robot autonomy to reality.
- The ROS ecosystem is vast and growing.
- Next lecture: *How ROS actually works* — topics, nodes, packages, ...



# Backup

# Robot Operating System – History

ROS 1



2014 - 2019



2016 - 2021

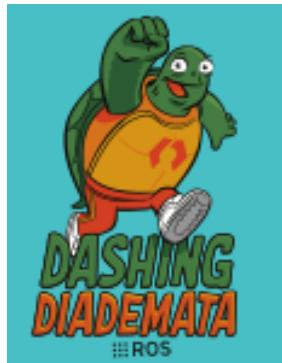


2018 - 2023



2020 - 2025

ROS 2



2019 - 2021



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2022 - 2027



2017 - Present

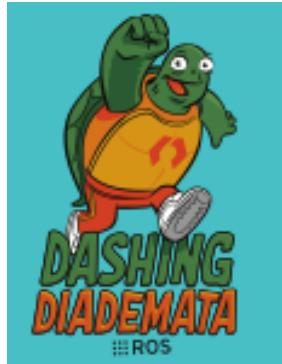
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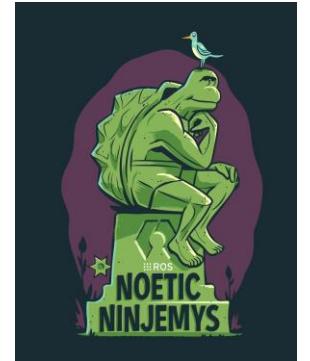
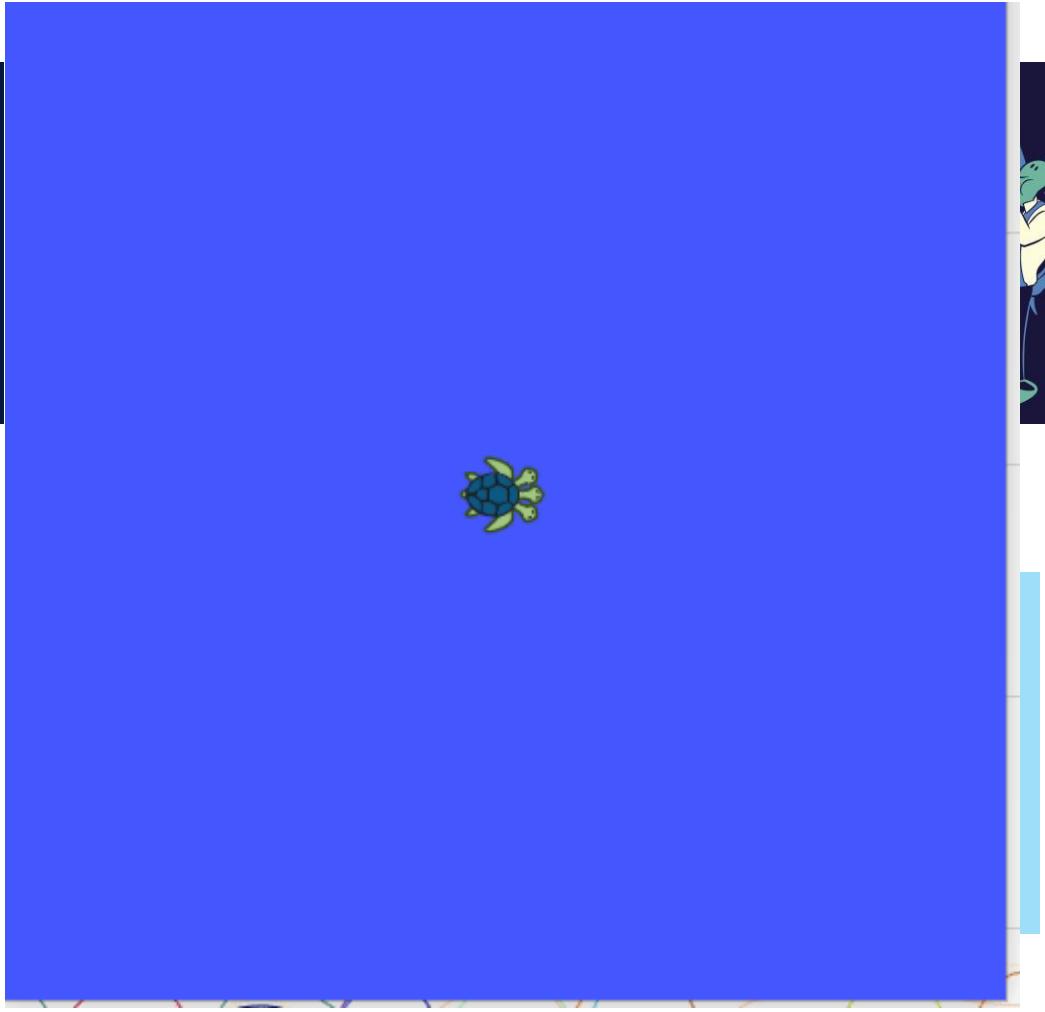


2014 - 2019

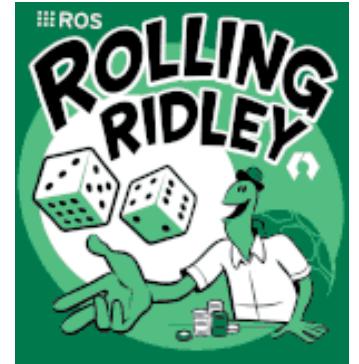
ROS 2



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ROS 1



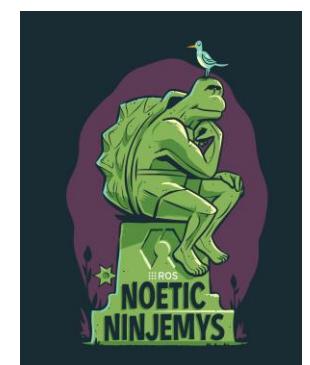
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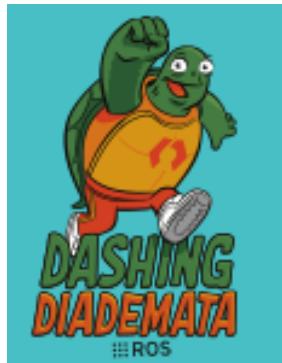


2018 - 2023



2020 - 2025

ROS 2



2019 - 2021



2020 - 2023



2022 - 2027



2017 - Present

# Why is ROS popular in academia?

- Not reinventing the wheel is generally good
- Robotics is hard! It's great to offload some of the work to smart people
- ROS is now 12 years old and still going strong



# Robot Operating System – Overview

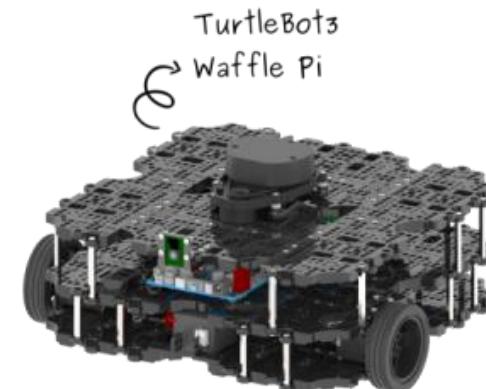
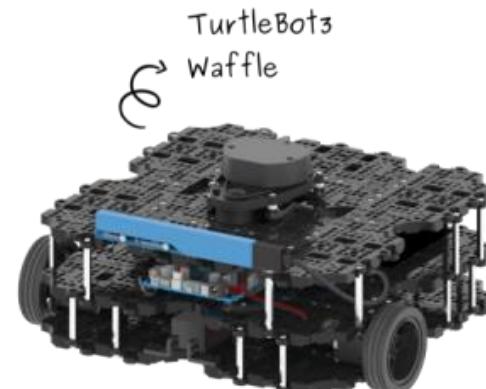
- Community & Ecosystem
  - Hardware Drivers
  - Software
- Tooling
  - Visualization
  - Debugging
- Asynchronous Programming Model

# Robot Operating System – ROS2

- Community & Ecosystem
  - Hardware Drivers
  - Software

# Robot Operating System – ROS2

- Community & Ecosystem
  - Hardware Drivers
  - Software



[Turtlebot3](#)



[Crazyflie](#)



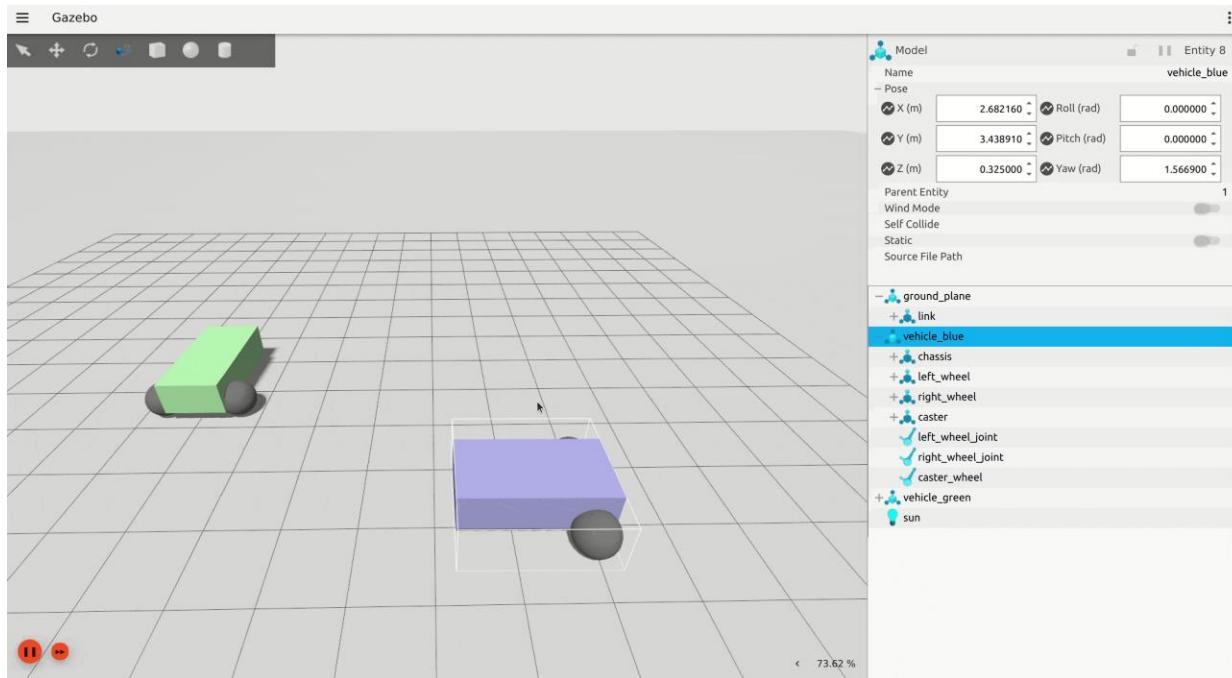
[Joysticks](#)



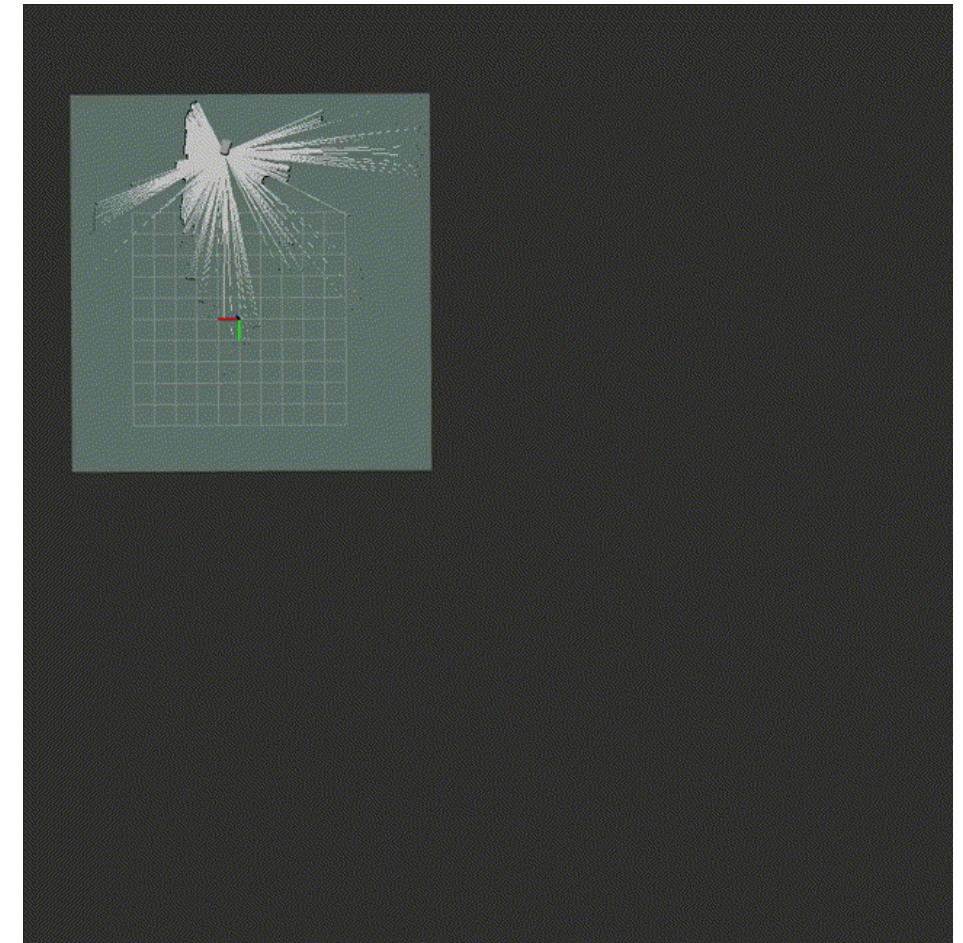
[Velodyne LiDAR](#)

# Robot Operating System – ROS2

- Community & Ecosystem
  - Hardware Drivers
  - Software



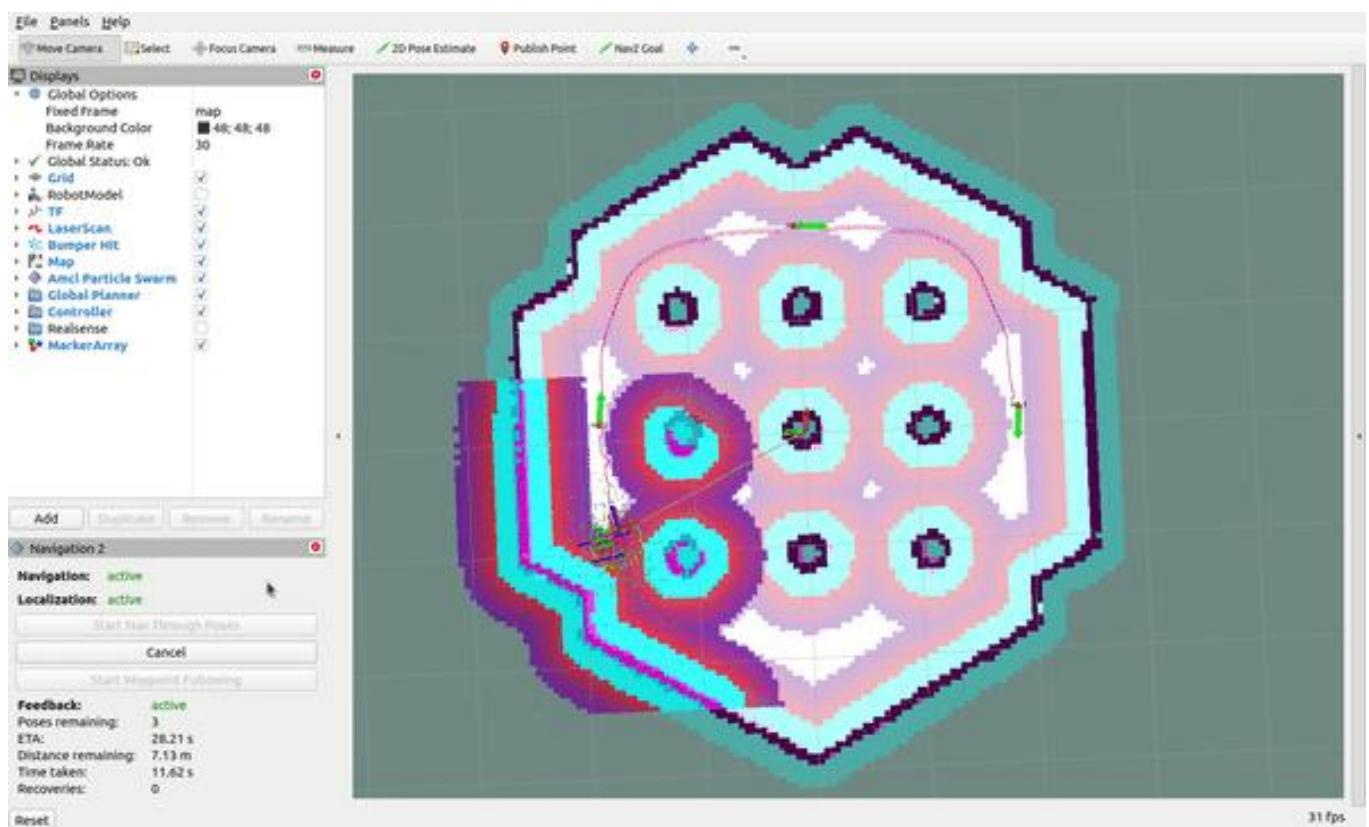
[Gazebo Sim](#)



[SLAM Toolbox](#)

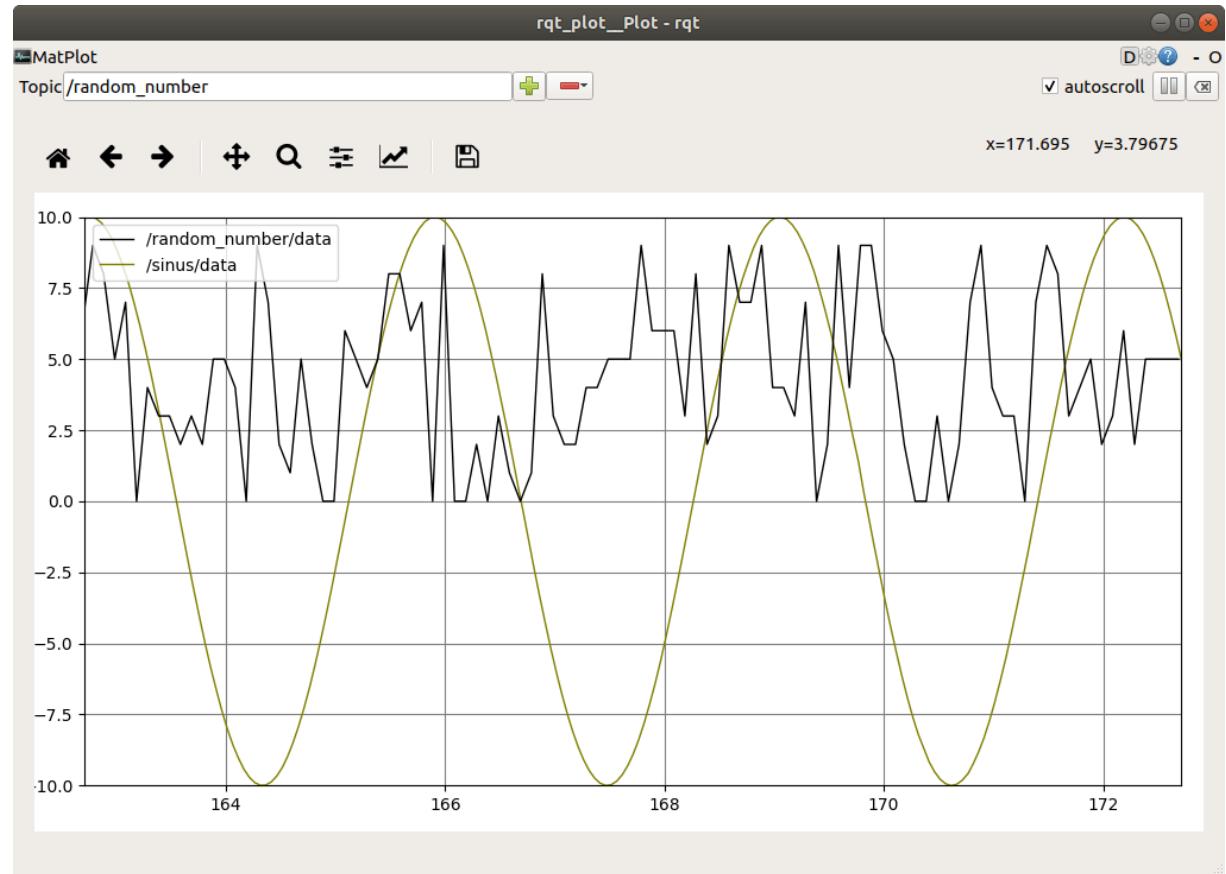
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# Robot Operating System – ROS2

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**See-think-act**

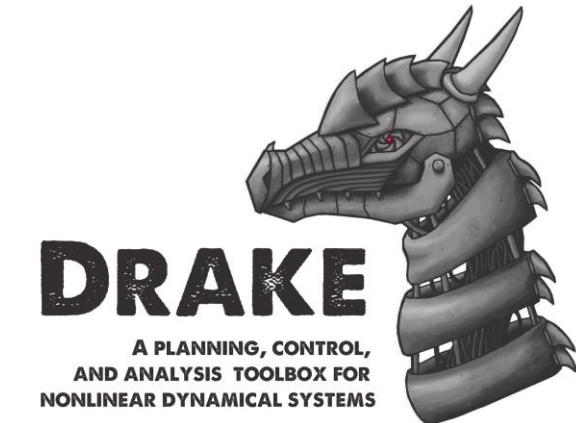
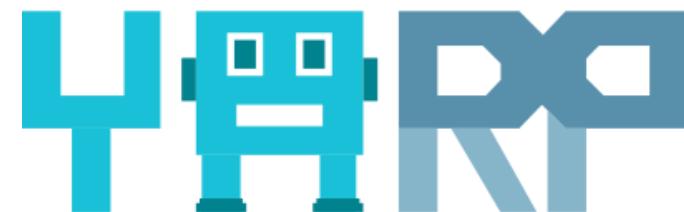
# Robot Operating System – ROS2

- Community & Ecosystem
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Let's write some code!

# Are there “Alternatives” to ROS?

- LCM
- Drake
- Player
- YARP
- Orocos
- MRPT
- And many others!



Next time: fundamentals of ROS



Robot Operating System