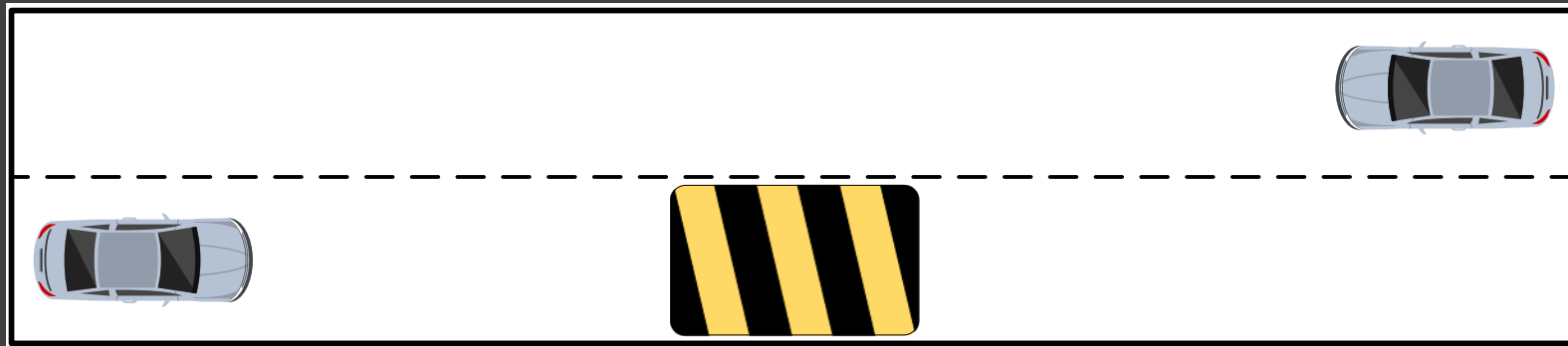


# Avoiding collision with pre-determined route planning

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# Motivation



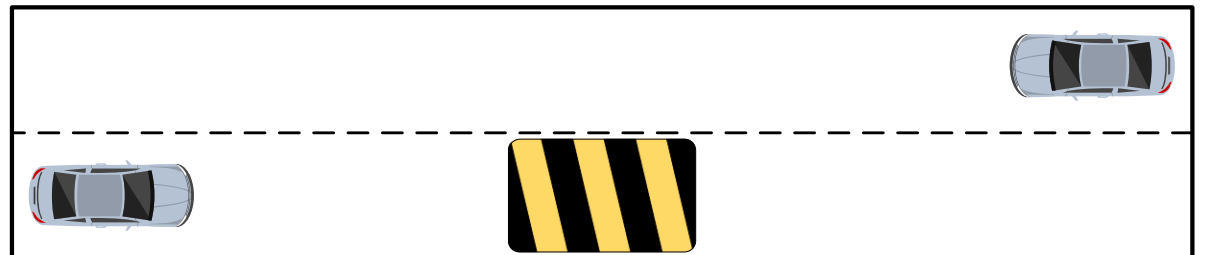
Autonomous cars



Route planning



The road sharing problem



# Outline



Optimal Control Theory  
and Tensor Decomposition



Simulations of  
different traffic situations

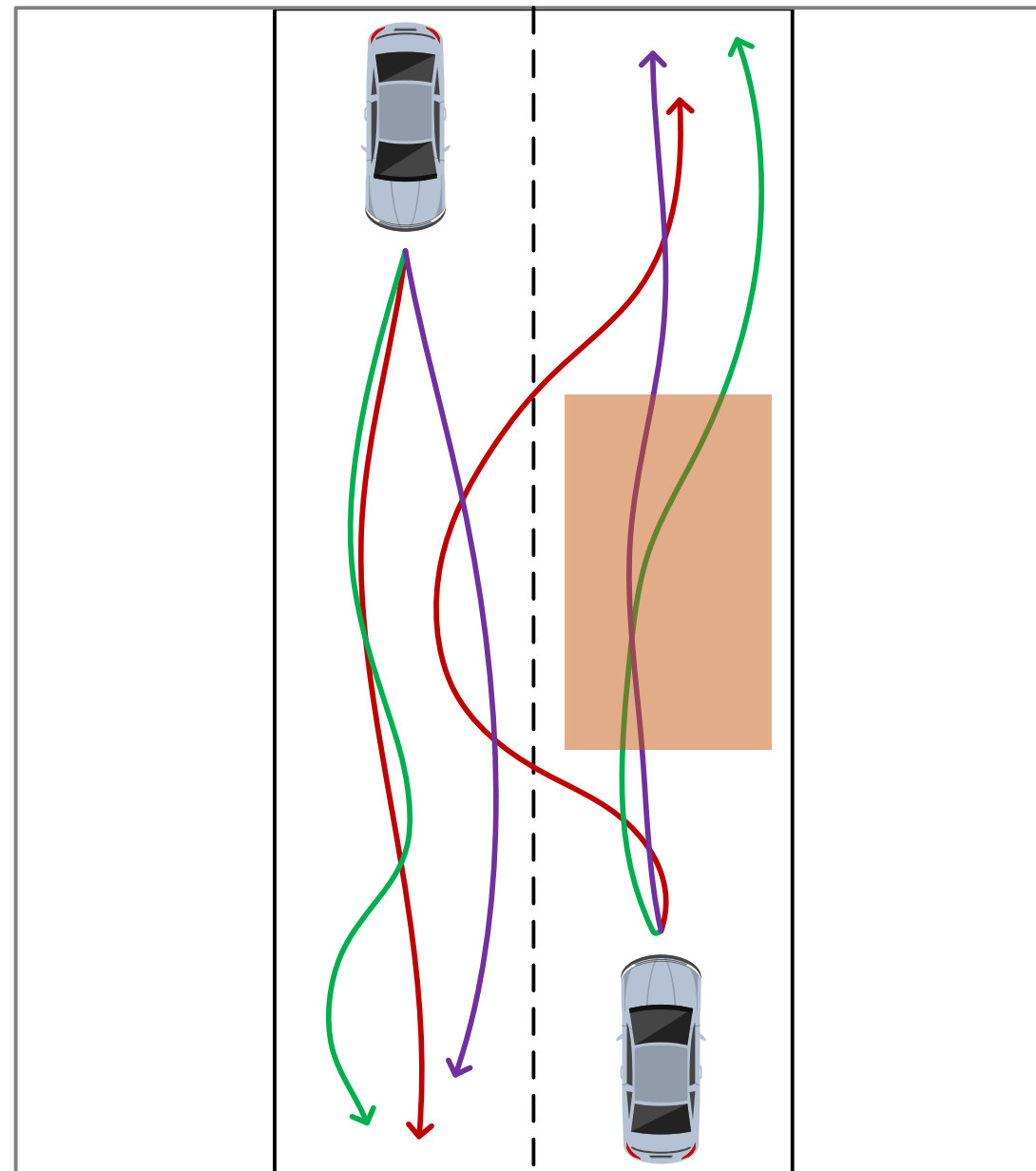


Conclusion with discussion

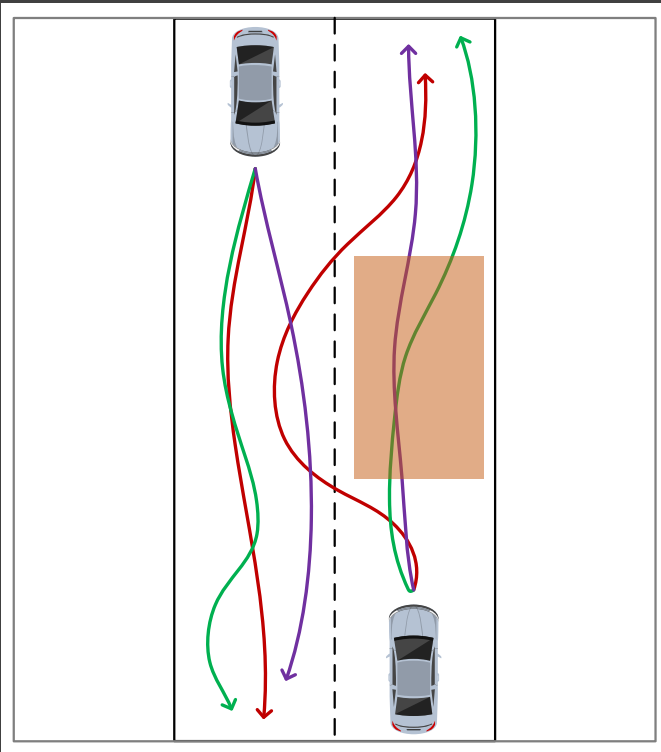
Theory



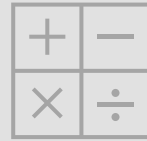
# Optimal Control Theory



# Dynamics



State dynamics:



$$\frac{dx}{dt} = f(t, x, u)$$



Steering:

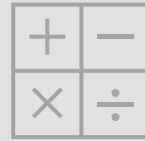
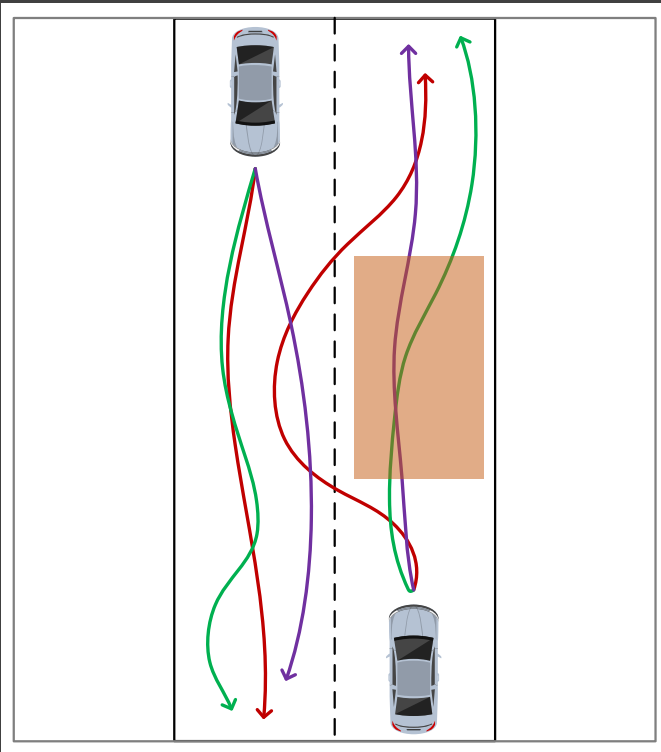
moves the car sideways



Gas: moves the car forward

Brake: stops the car

# Costs



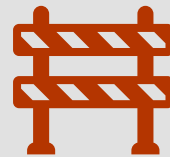
Cost-to-go function:

$$J(t, x, u) = \phi(x_f) + \int_t^{t_f} c(t, x, u) dt$$



By control:

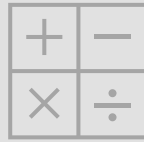
Fuel



By state:

Traffic rules, Roadblock, Destination

# Solving the optimal control problem



Hamilton-Jacobi-Bellman  
(HJB) Equation


$$0 = \min_u \left\{ c(x, u) + \frac{\partial}{\partial x} V(x)^T \cdot f(x, u) + \frac{1}{2} \text{Tr} \left( \frac{\partial^2}{\partial x^2} V(x) \cdot \sigma(x) \sigma(x)^T \right) \right\}$$

$$\Rightarrow AF = G$$

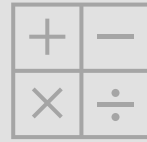
Problem:

*The curse of dimensionality*

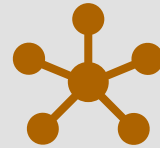




# Solving the optimal control problem




Hamilton-Jacobi-Bellman  
(HJB) Equation



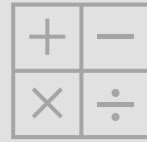
Discretization using  
tensor decomposition

What is a tensor?

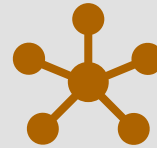
- Multi-dimensional array.
- Generalization of vectors and matrices.



# Solving the optimal control problem




Hamilton-Jacobi-Bellman  
(HJB) Equation



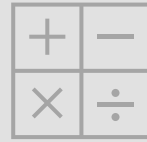
Discretization using  
tensor decomposition

Two alternatives:

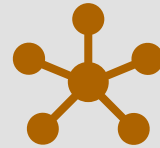
- Canonical tensor decomposition
- Tensor Train decomposition



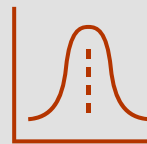
# Solving the optimal control problem




Hamilton-Jacobi-Bellman  
(HJB) Equation



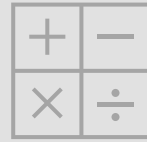
Tensor decomposition



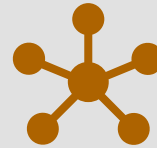
Numerical algorithms



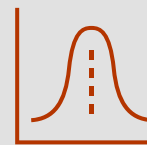
# Solving the optimal control problem




Hamilton-Jacobi-Bellman  
(HJB) Equation



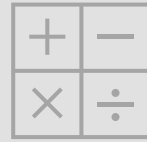
Tensor decomposition



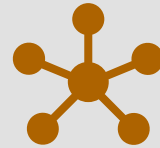
Chosen algorithm:  
Sequential Alternating Least Squares



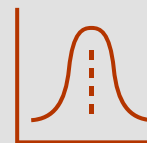
# Solving the optimal control problem



Hamilton-Jacobi-Bellman  
(HJB) Equation



Tensor decomposition



Numerical algorithms

# The road sharing problem

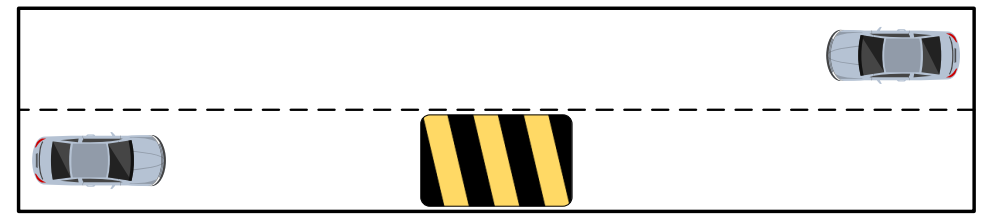
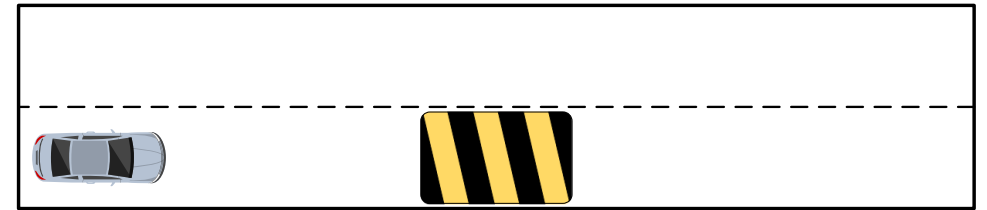
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# Goal:

Reach Destination and Avoid Collision

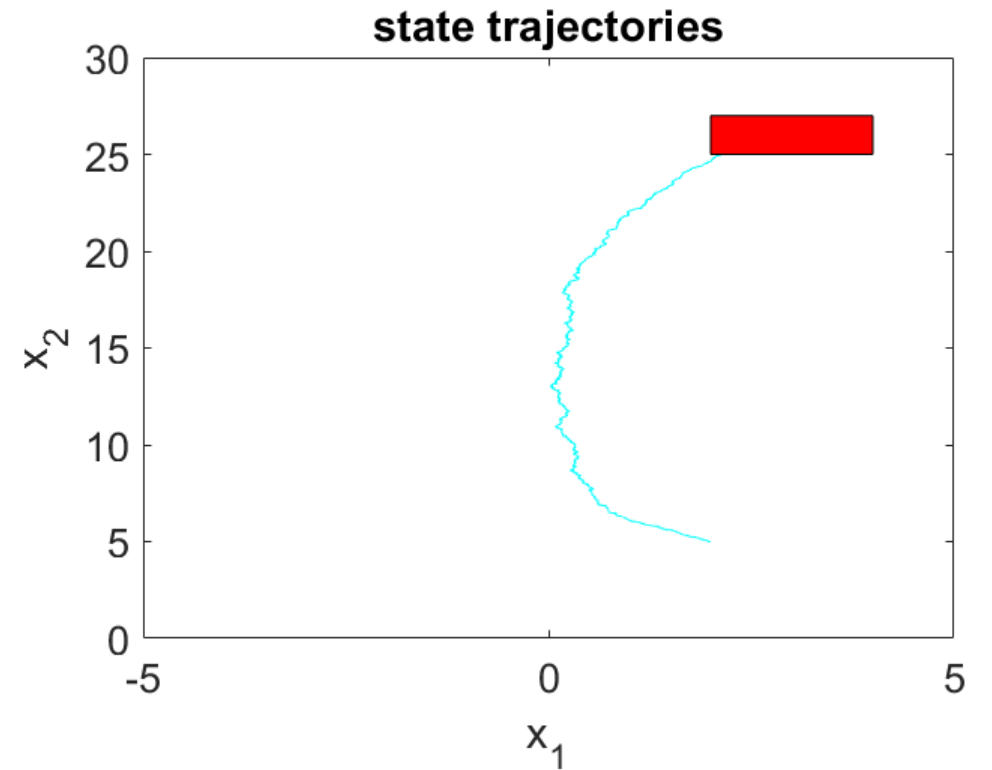
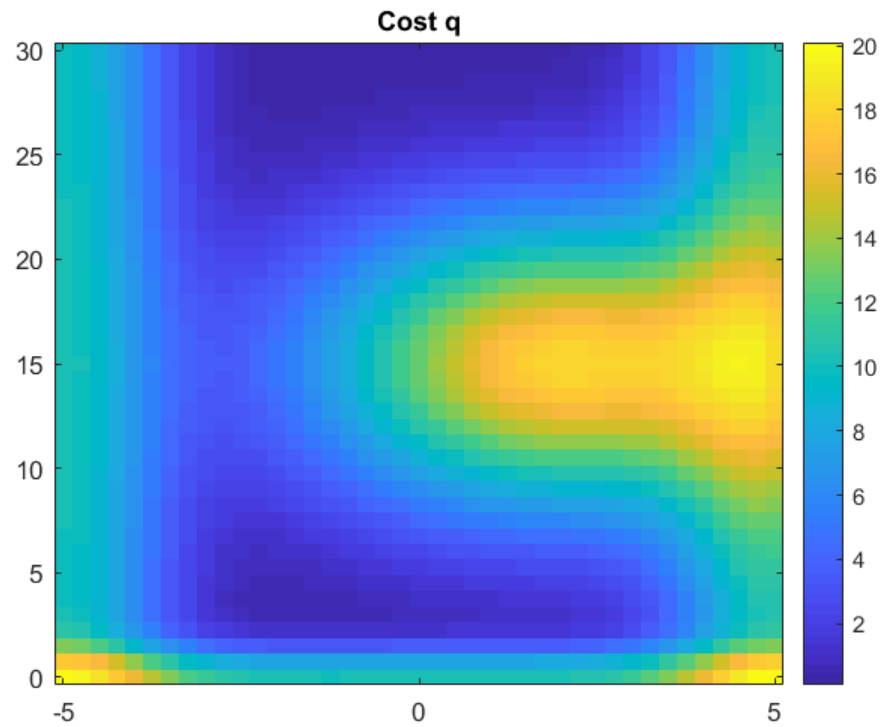
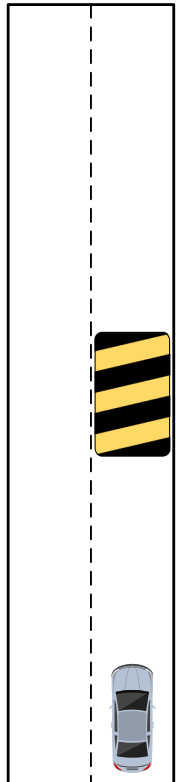
- A Single Autonomous Vehicle
- Multiple Autonomous Vehicles
- Dynamics of a vehicle



$$dx = \underbrace{\left( 0 \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} \right)}_{\text{No impact}} + \underbrace{\begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} u_1 \\ u_2 \end{bmatrix}}_{\text{Control}} dt + \underbrace{\sigma dw}_{\text{Noise}}$$

# A Single Autonomous vehicle

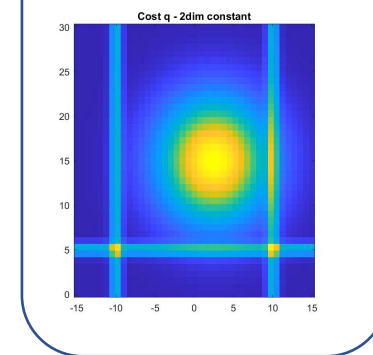
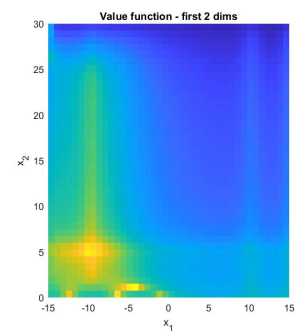
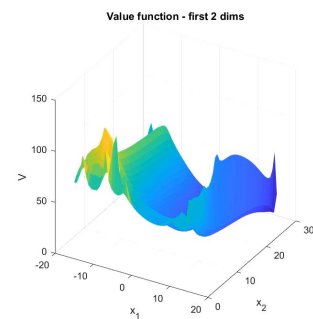
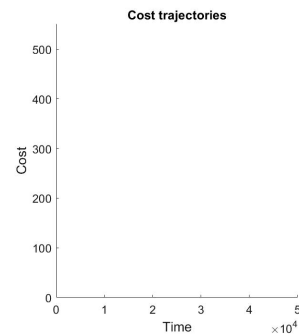
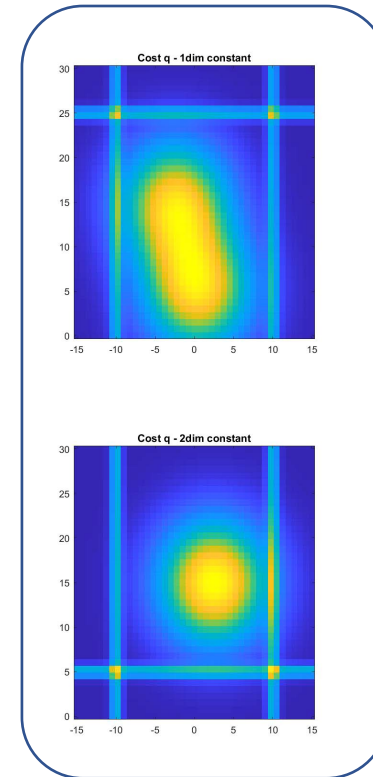
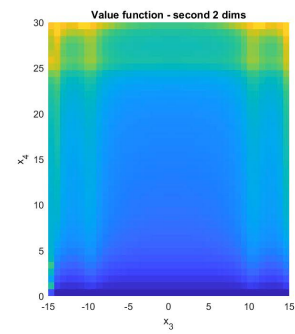
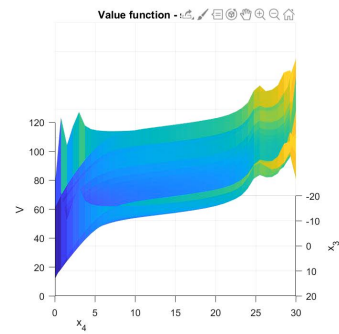
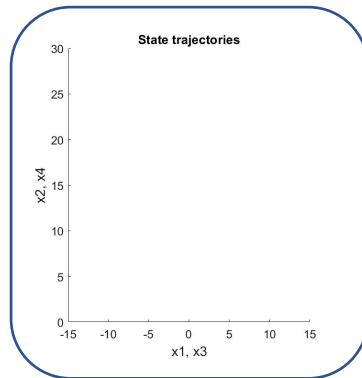
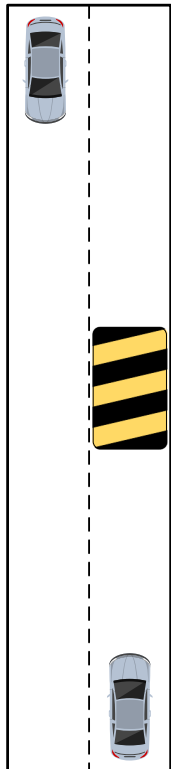
- Setting up the costs
- Reaching the destination





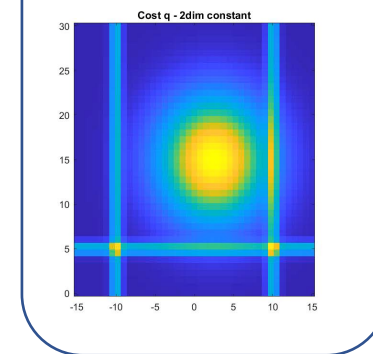
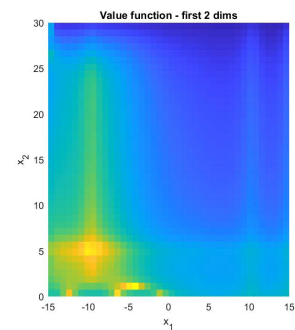
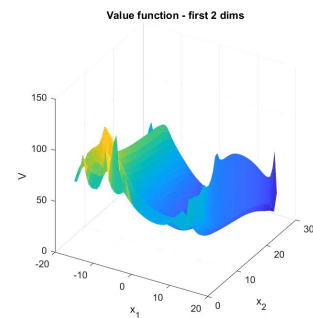
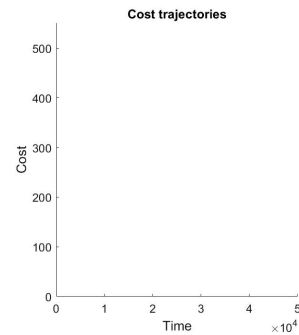
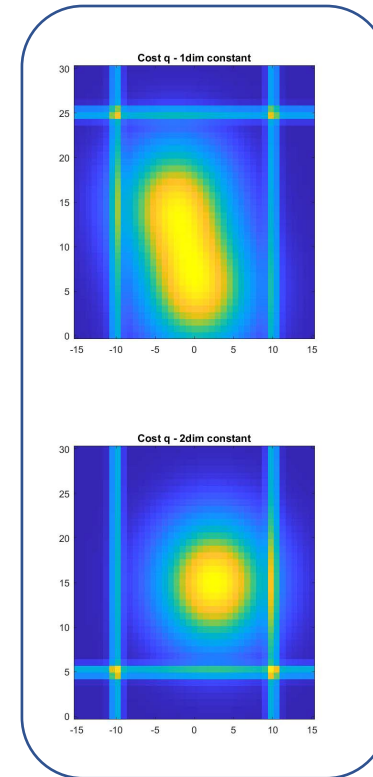
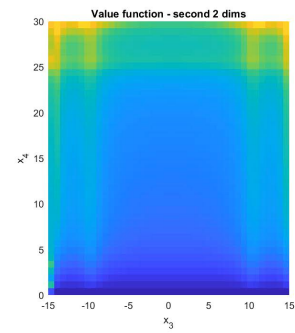
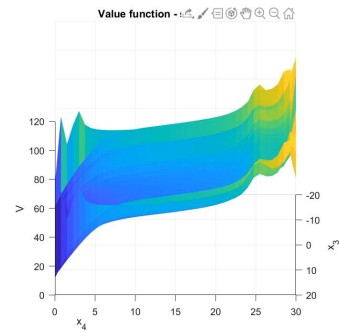
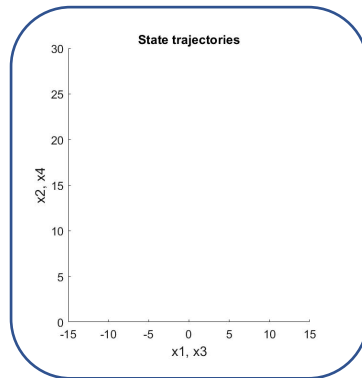
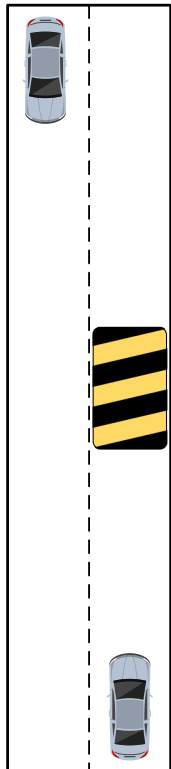
# Multiple Autonomous vehicles

- Setting up the costs
- Car-to-car collision avoidance
- Reaching the destination



# Multiple Autonomous vehicles

- Setting up the costs
- Car-to-car collision avoidance
- Reaching the destination





# Conclusion

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# Discussion



Difficult to setup parameters



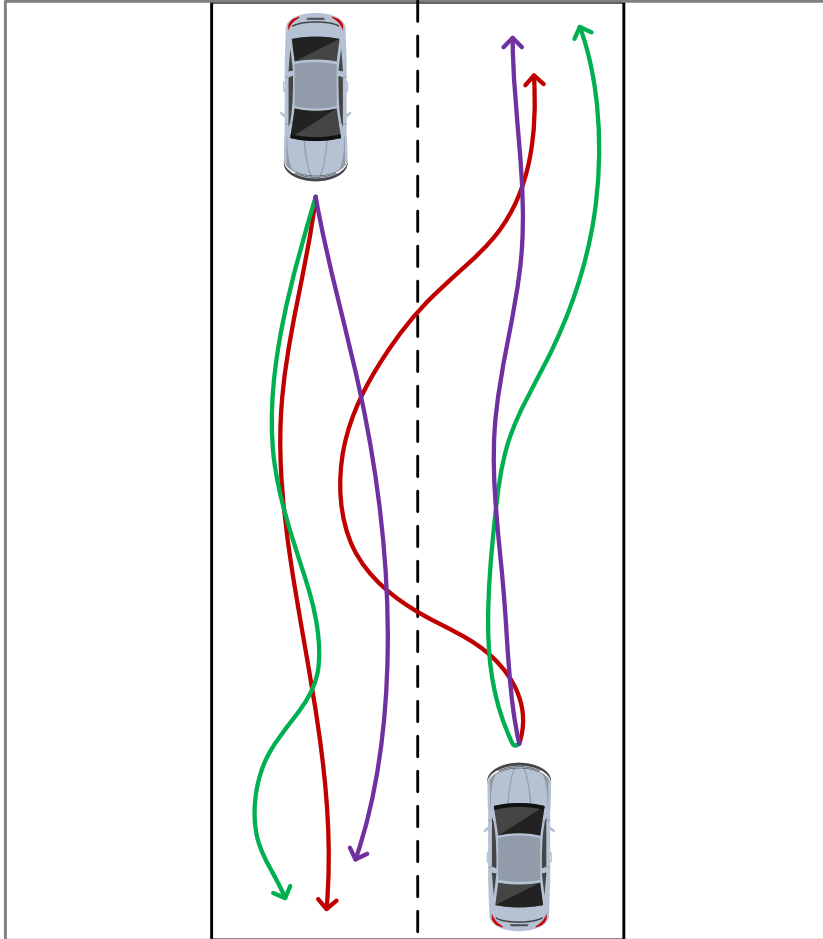
Numerical errors



Other algorithms could perform better



Once solved, you can reuse the solution



Thank you