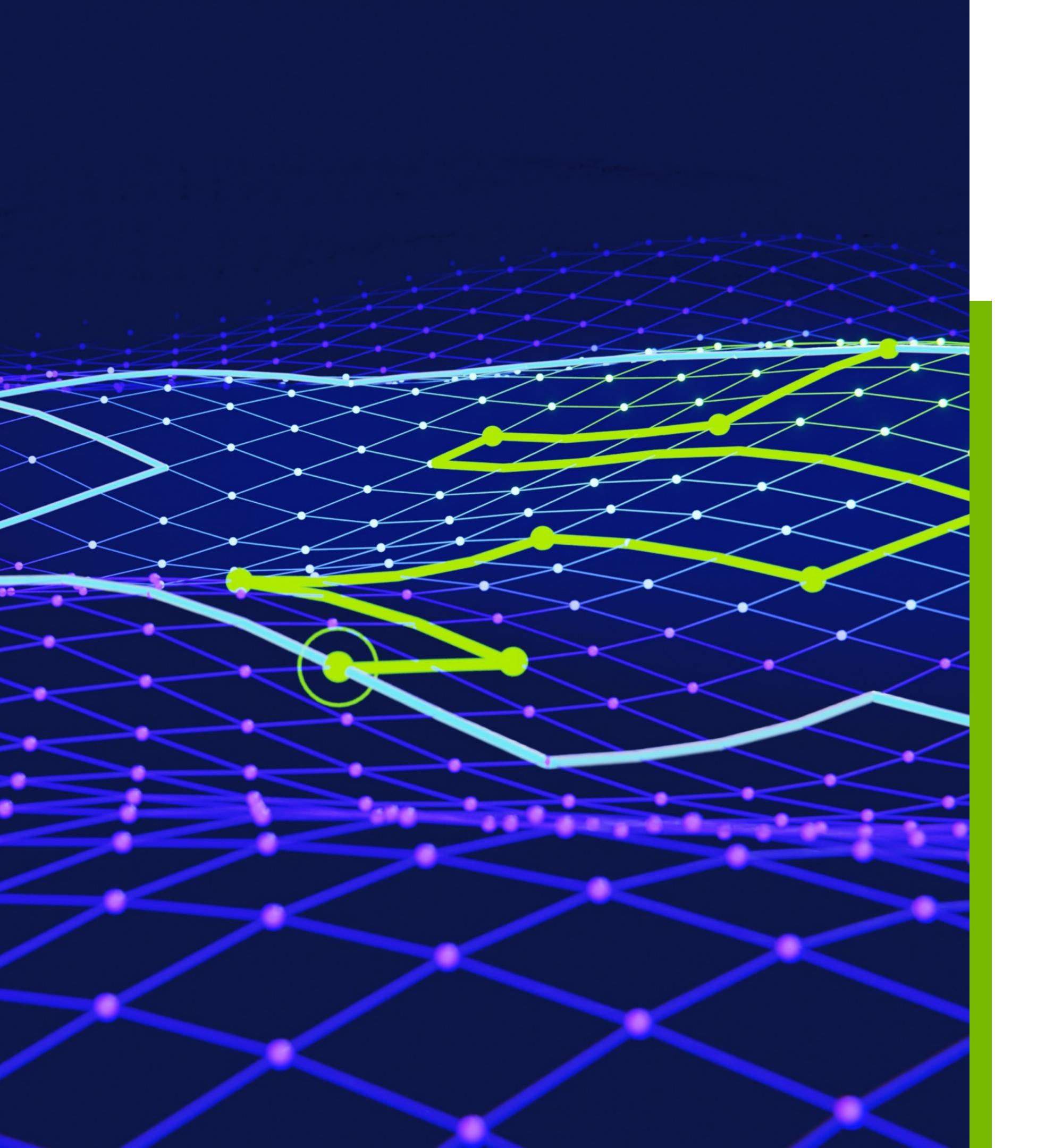


# S62495 - Advances in Optimization Al

### Alex Fender Ph.D. | GTC 2024





# Agenda

- cuOpt AI agent concept



Latest on cuOpt Vehicle Routing

Accelerating Mathematical Optimization



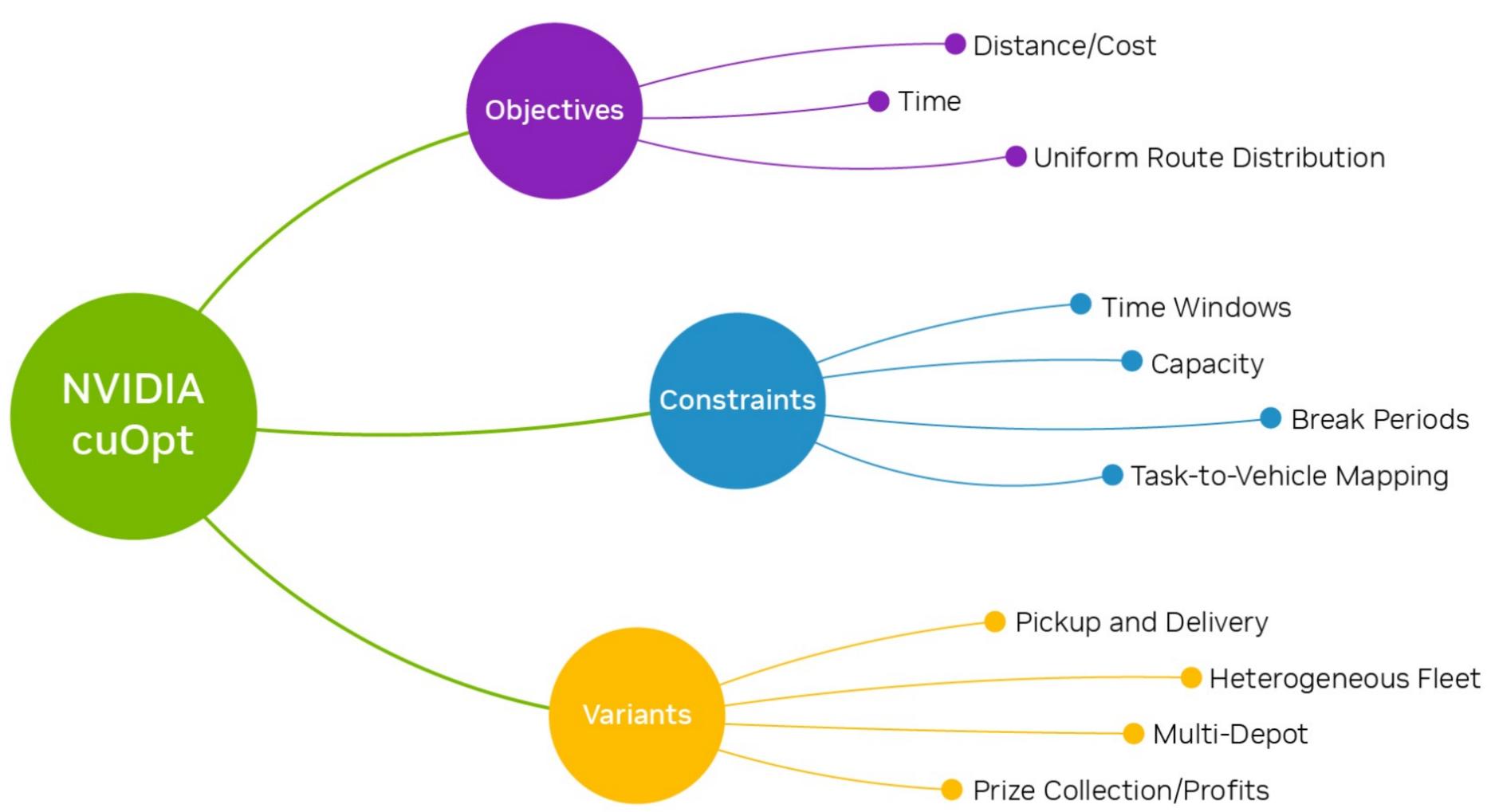
### Vehicle routing optimization with world's best planning

Dynamic re-planning in near real time

Supports the largest problems with GPU acceleration (>15k tasks at once)

Multi constraint, multi objective Hundreds of problem variants

## NVIDIA cuOpt **Accelerated Optimization Engine**





### C++ solver

Outperforms CPU solvers on public benchmarks



**Python SDK** Early Access with 300 companies Optimized for last mile deliveries

NVIDIA CONFIDENTIAL. DO NOT DISTRIBUTE.

# The cuOpt journey

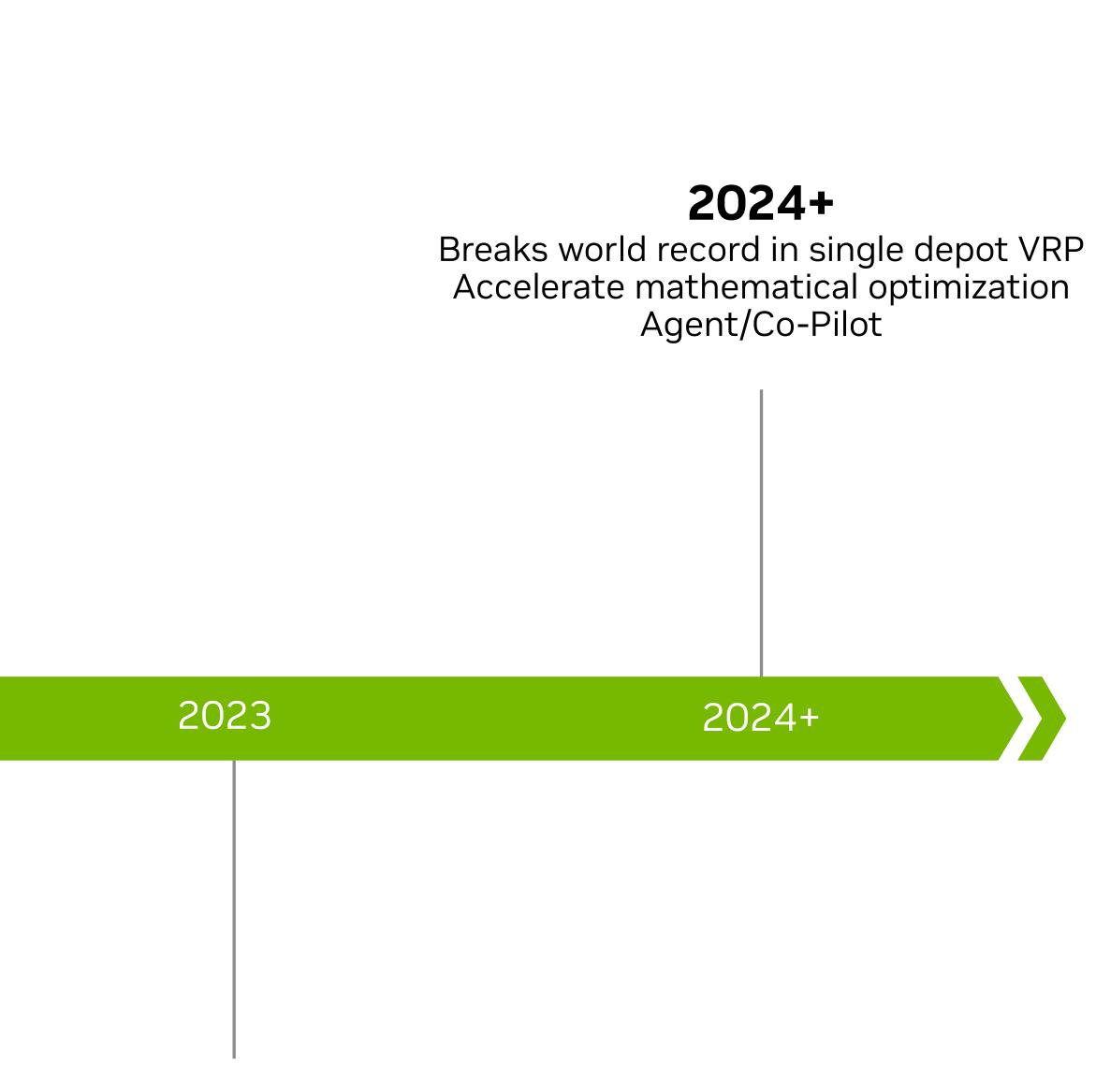
### Microservice

Breaks world records in Pick-up and Delivery Isaac and Omniverse connection Intralogistics use cases

### H2 2021

2022

Managed and Self-hosted Service EA with 10 customers Field force dispatch use cases



### **Cloud API**





### Customer Routing App

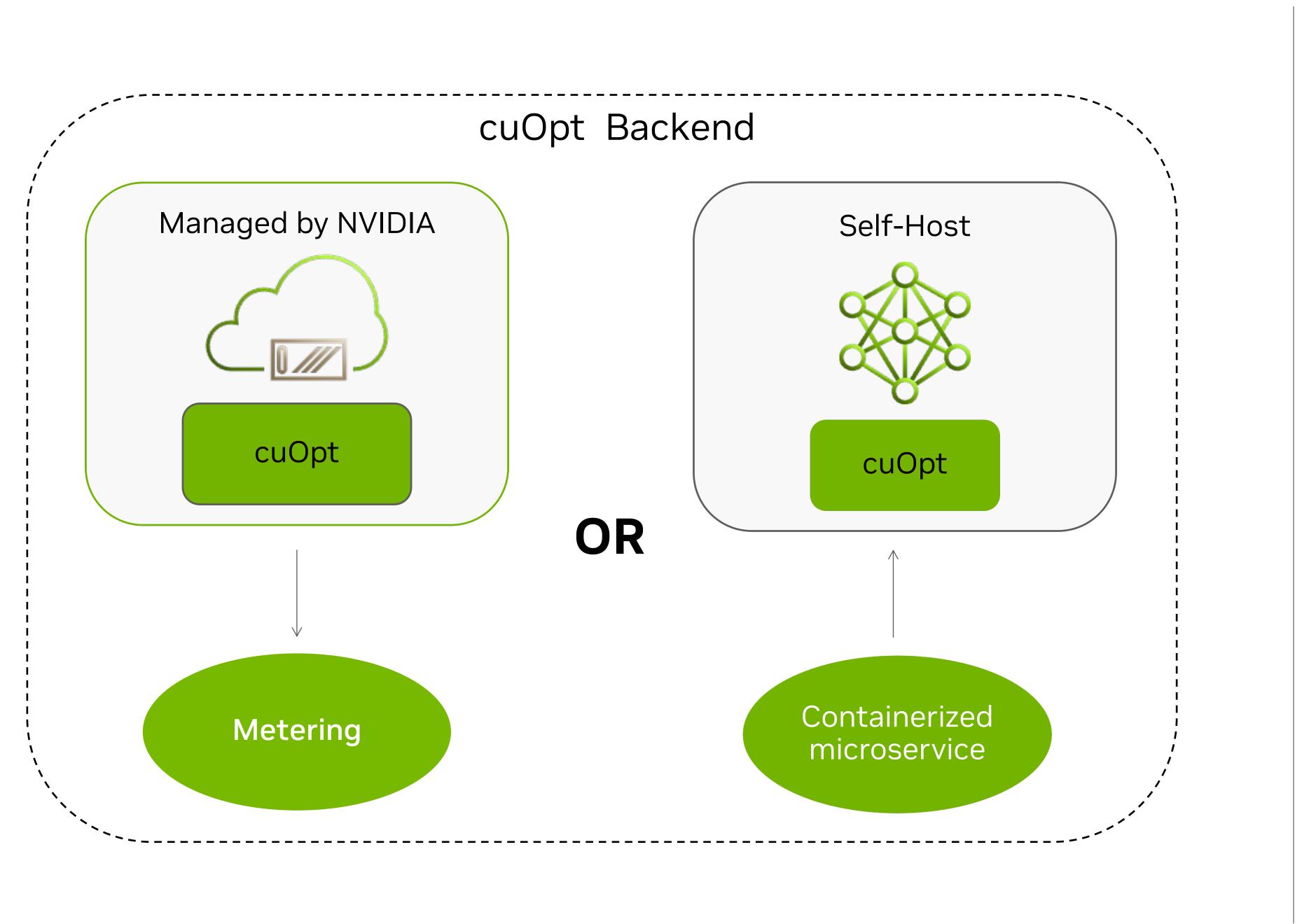
cuOpt Reference client

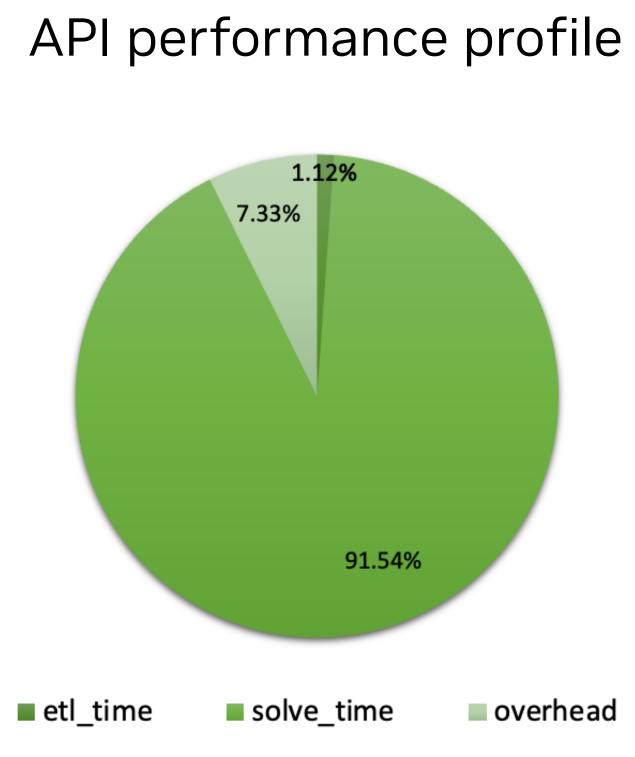




# Now available as an API

Managed or Self-hosted





# Performance

Optimize in seconds

- Comparing to the World's Best Known Solutions (BKS)
- Hierarchical objective, minimize:
  - number of vehicles: BKS found in seconds
  - total distance: displayed for various problem sizes

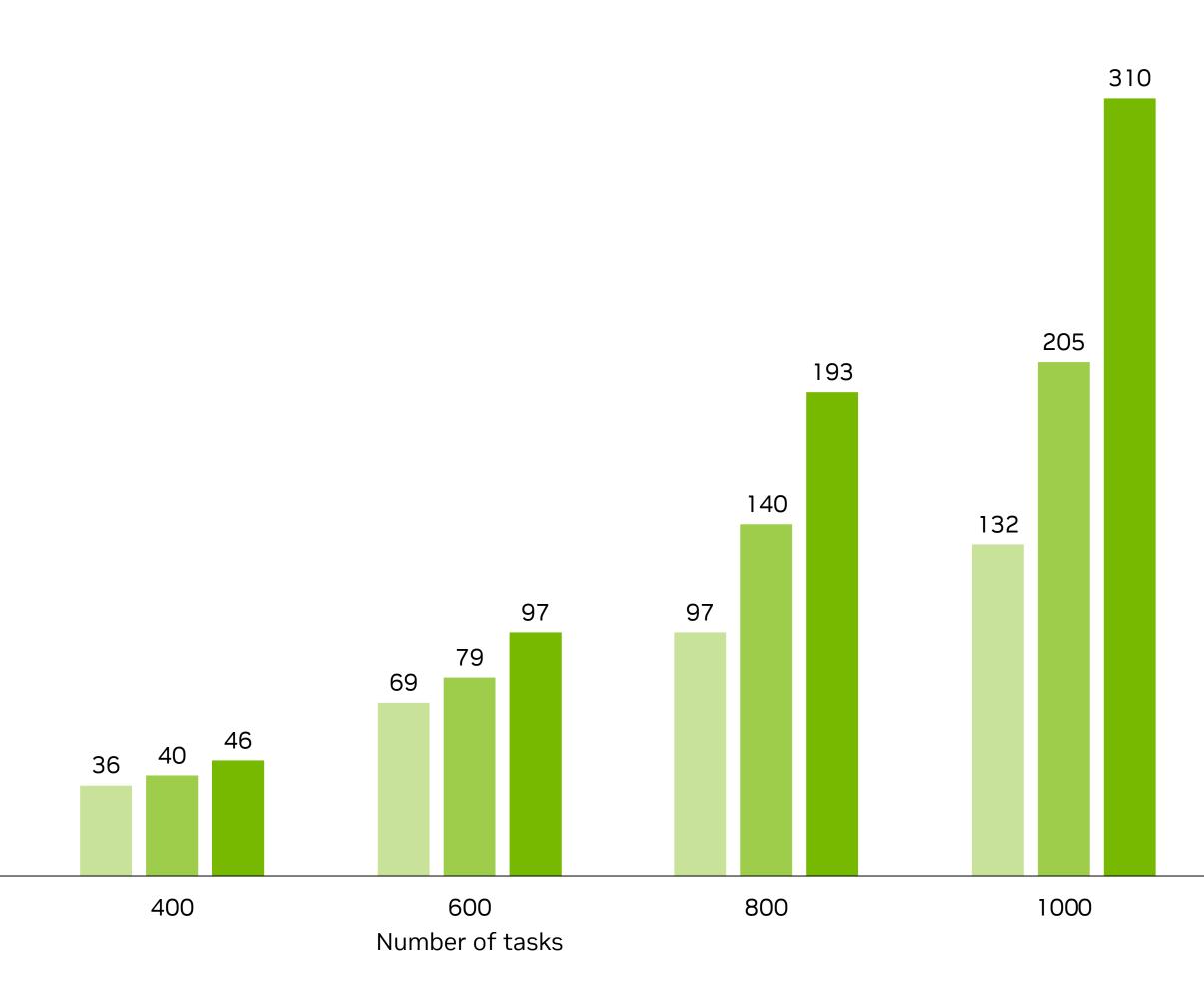
cuOpt finds the **best number of vehicle in all cases** 

cuOpt times include finding the world's best number of vehicles

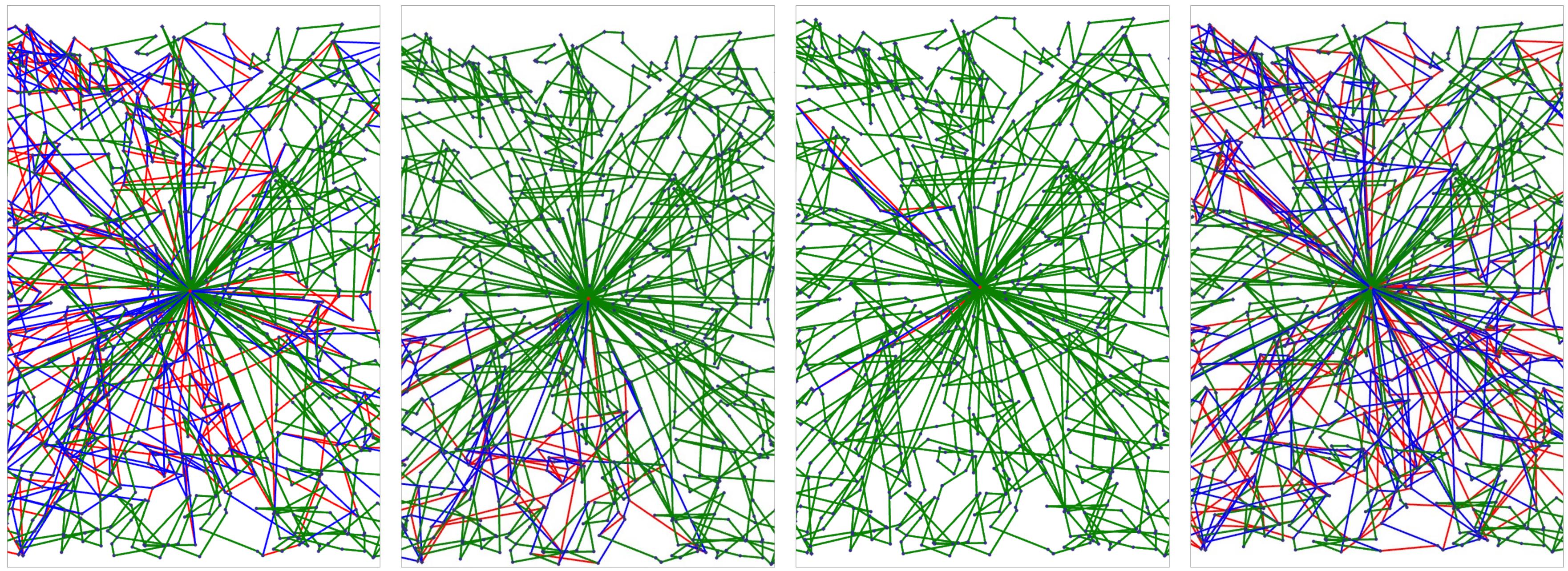


#### An Solutions (BKS) 350 5% from BKS 300 2% from BKS 300 1% from BKS 1% from B

### Time to gradually approach the BKS distance on Li&Lim



### Ir1\_10\_6 : 4 world record claimed YoY, +.85% compounded improvement



442 days, +.22% NVIDIA 03/2023

both solutions only in previous solution only in new solution

# World's best routes

### 23 world records on Gehring&Homberger and Li&Lim

71 days, + .01% Veeroute 05/2023

4 days, +0.30% Otimo 05/2023

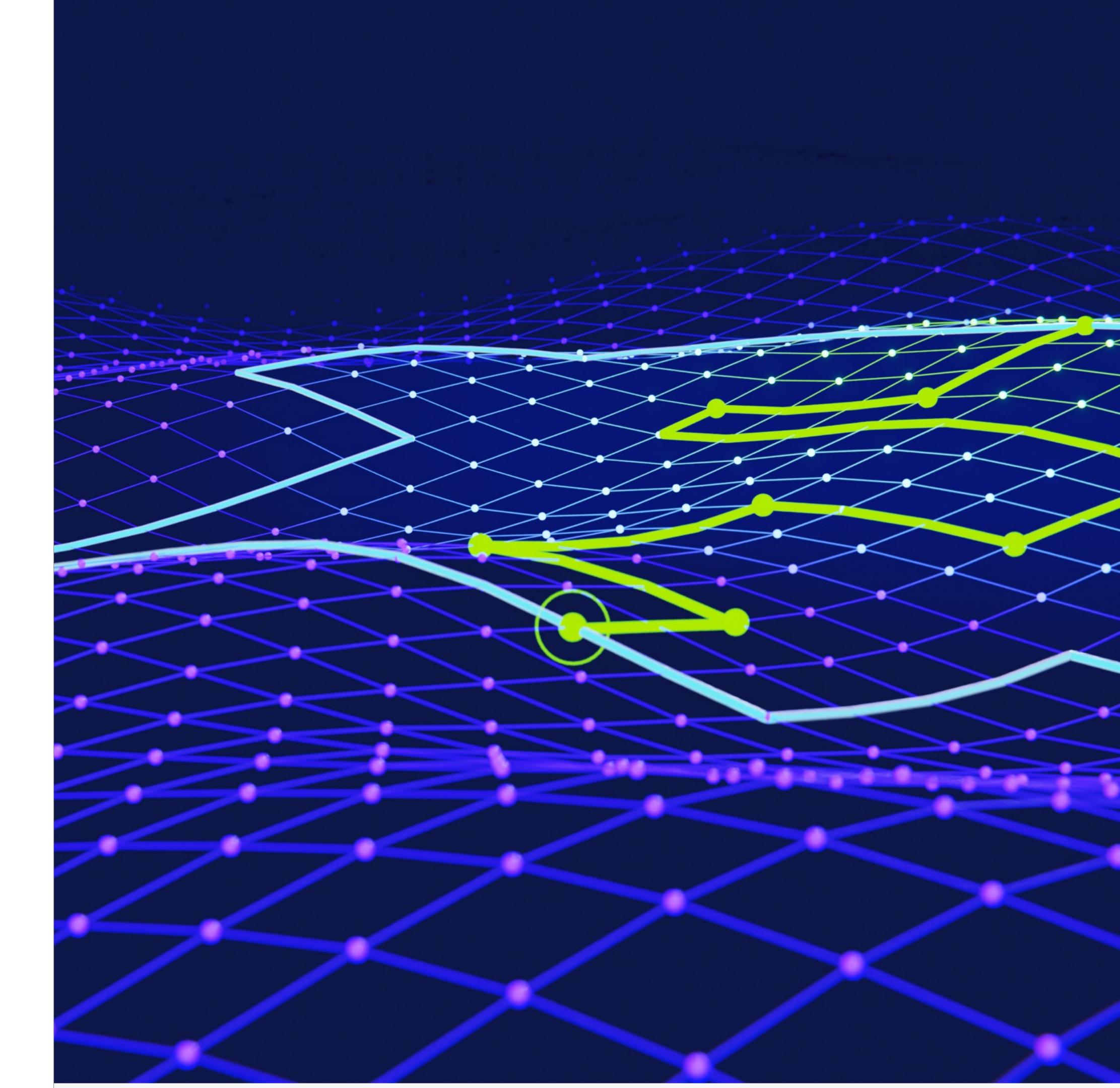
256 days, **+0.31%** NVIDIA 02/2024

Best solutions and datasets available on SINTEF *Viz credit: combopt.org* 



## **Mathematical Optimization** GPU acceleration





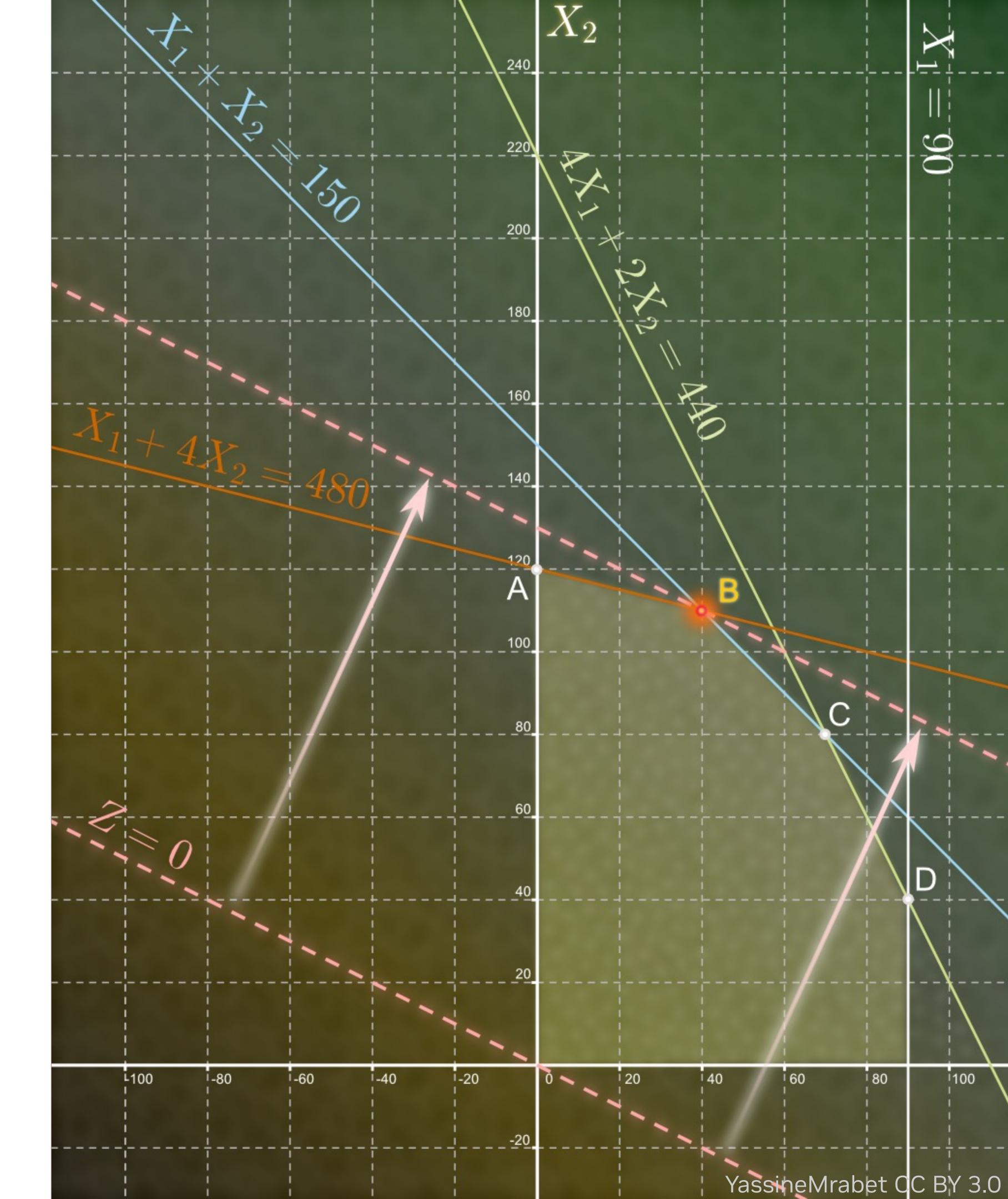
# Mathematical Optimization

Linear Programming

- Optimize an objective function subject to constraints
- Decision Variables (X1, X2, ...): Quantities to determine (e.g., production levels).
- Objective Function (Z): The function to optimize (e.g., maximize profit).
- Constraints (Ax  $\leq$  b): Linear inequalities that limit the decisions (e.g., resource availability).

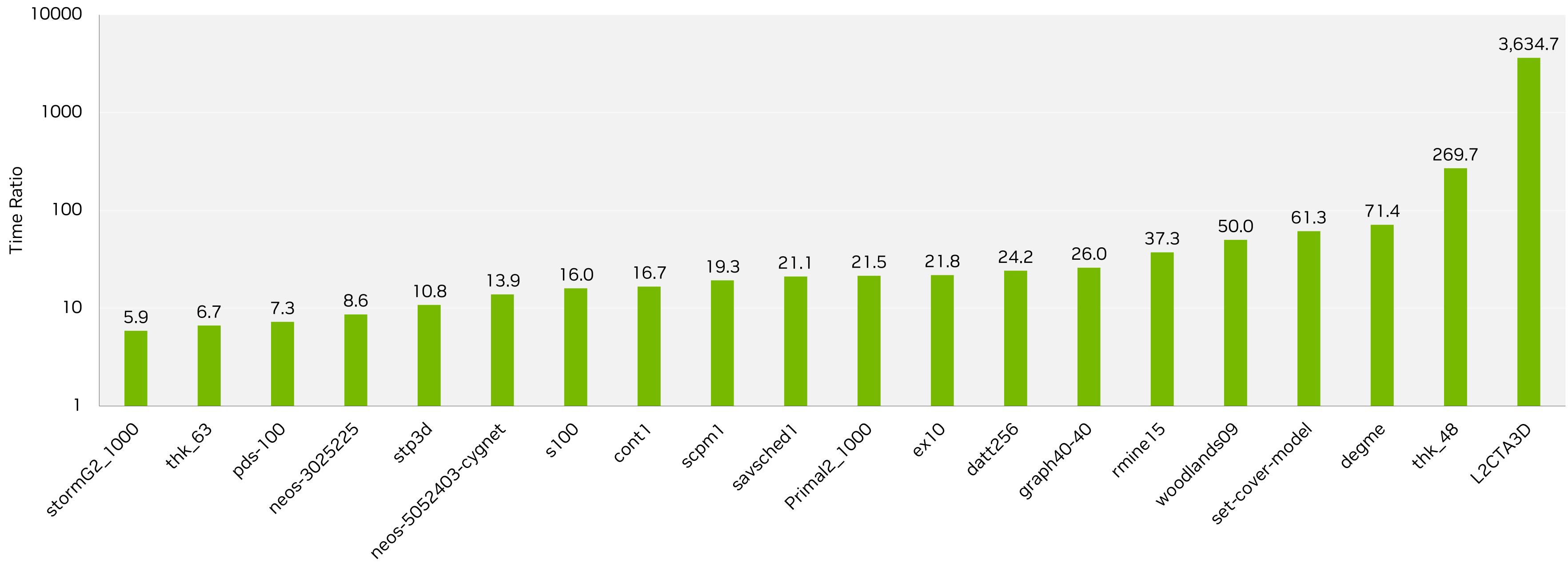
 GPU can accelerate LP, enabling more efficient and faster optimization at scale





## **GPU acceleration of Linear Programming** Comparison against Commercial LP on selected instances of Mittleman's Benchmark

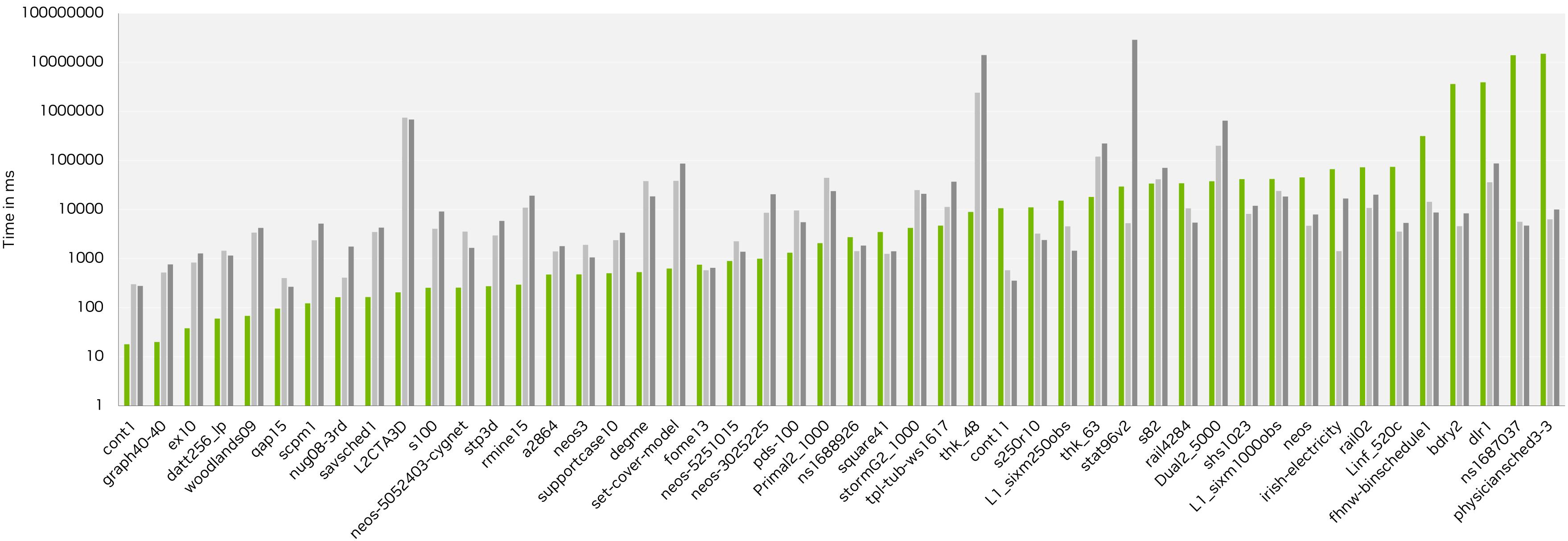
cuOpt acceleration compared to state-of the-art CPU LP (higher is better)



GPU: NVIDIA H100-HBM3 CPU: AMD EPYC 7313P - 16 Cores @ 3.0GHz Tolerance : 1e-3



## **NVIDIA cuOpt Linear Programming Solver** Comparison against Commercial LP solvers on Mittleman's Benchmark



GPU: NVIDIA H100-HBM3 CPU: AMD EPYC 7313P - 16 Cores @ 3.0GHz Tolerance : 1e-3

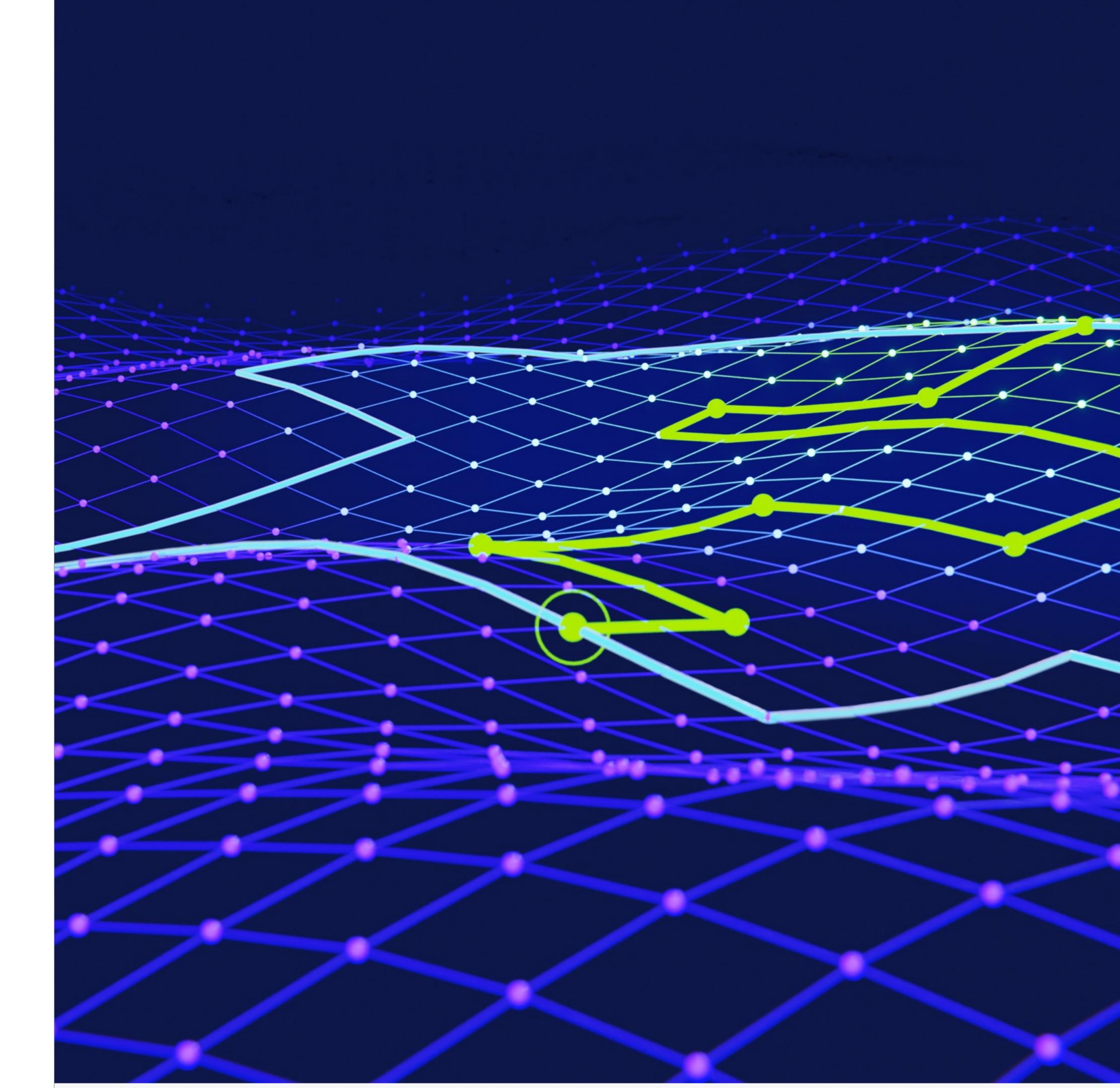
Time Comparison, cuOpt with state-of the-art solvers (lower is better)

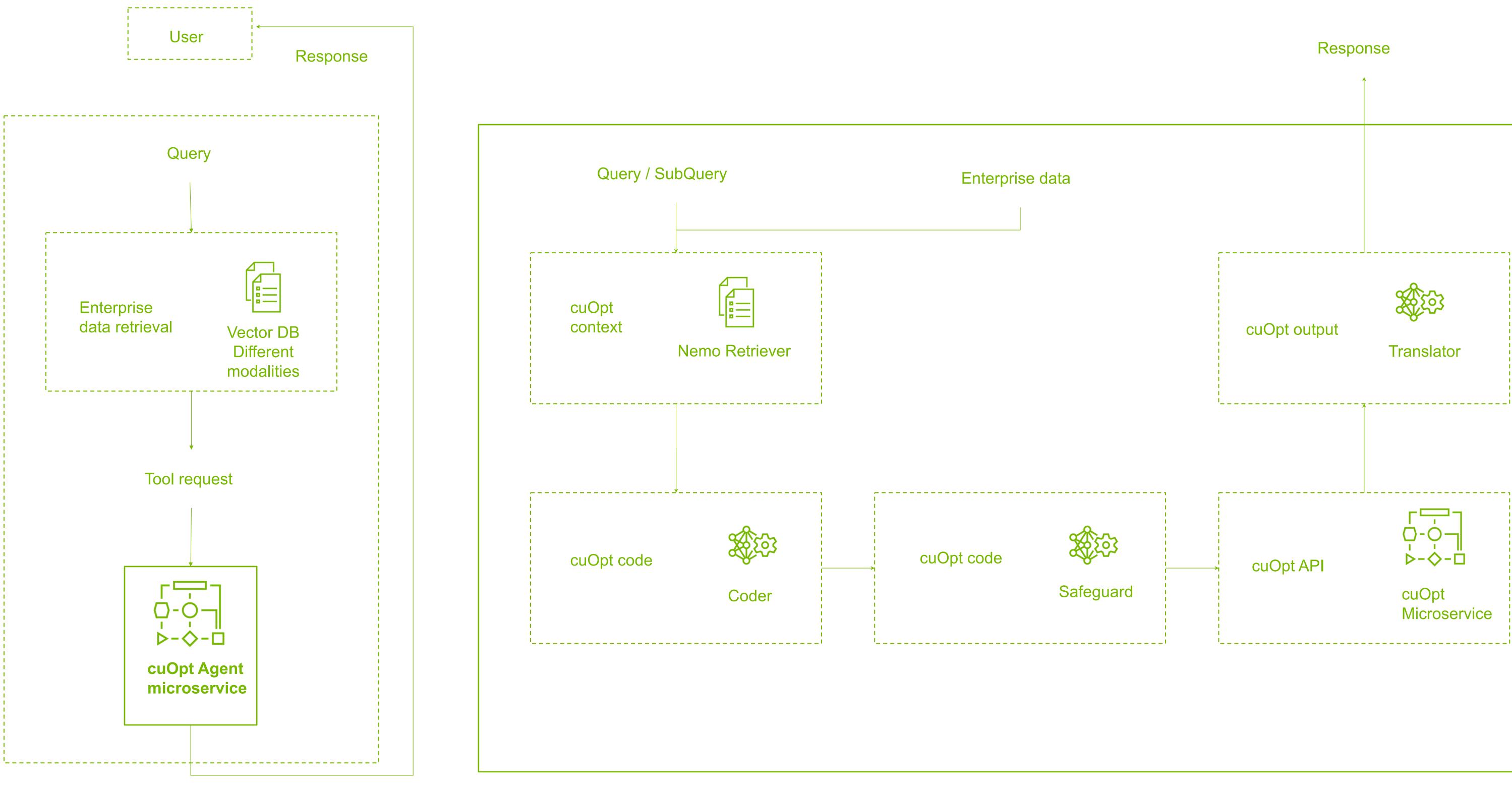
Commercial LP cuOpt LP Freeware LP



## cuOpt Al Agent Concept







### Legend



LLM Model based fine tunable Microservice



**Execution Engine** Microservice



Data Microservice (DB/VectorDB)

Nemo Retriever Zoom

# cuOpt agent concept

### LLM-based framework

### cuOpt Agent microservice



## 

#### User

The following NVIDIA GPUs can only be produced in batches of 500 units. One batch of RTX 4090 yields a \$90,000 profit, require a production time of 150 hours, and there is a demand for 10,000 units. One batch of RTX 4080 yields a \$60,000 profit, require 125 hours to make, and the demand is 18,000 units. There can be only one batch in the prodution line at a time, and the maximum time window is 200 days. How can we maximize profit?

#### LLM

To maximize profit, produce 20 batches of RTX 4090 and 0 batches of RTX 4080. This yields a total profit of \$1,800,000. 🚀 💧

#### User

What if we could produce one batch of RTX 4080 in 20% less time.

#### LLM

If we could produce one batch of RTX 4080 in 20% less time, the optimal production strategy would be to manufacture 20 batches of RTX 4090 and 0 batches of RTX 4080. This configuration would yield a total profit of \$1,800,000. 🚀 💧

#### User

Would it now be profitable to lower the price of the 4080 by 5% which would increase the demand by 2,000 units?

#### LLM

Yes, it would be profitable to make a 5% discount on the RTX 4080, resulting in an increased demand of 2,000 units. The new profit would be \$1,140,000. 🚀 💩

# cuOpt agent concept

### LP modeling example conversation

Submit

#### User

The following NVIDIA GPUs can only be produced in batches of 500 units. One batch of RTX 4090 yields a \$90,000 profit, require a production time of 150 hours, and there is a demand for 10,000 units. One batch of RTX 4080 yields a \$60,000 profit, require 125 hours to make, and the demand is 18,000 units. There can be only one batch in the prodution line at a time, and the maximum time window is 200 days. How can we maximize profit?

#### cuOpt Agent

To maximize the profit, the optimal solution will be to produce 20 batches of RTX 4090 and 14 batches of RTX 4080. This will yield a total profit of approximately \$2,640,000.

User

What if we could produce one batch of RTX 4080 in 20% less time.

#### cuOpt Agent

Now, it would be better to produce approximately 14 batches of RTX 4090 and 27 batches of RTX 4080. This would yield a total profit of approximately \$2,880,000. This approach would increase the profit by \$240,000.

#### User

Would it now be profitable to lower the price of the 4080 by 5% which would increase the demand by 2,000 units?

#### cuOpt Agent

The optimal solution would be to produce 20 batches of RTX 4090 and 18 batches of RTX 4080. This would yield a total profit of approximately \$2,826,000, which is \$54,000 lower. Hence, applying a 5% discount on RTX 4080 is not a profitable decision in this case.

### 



Submit

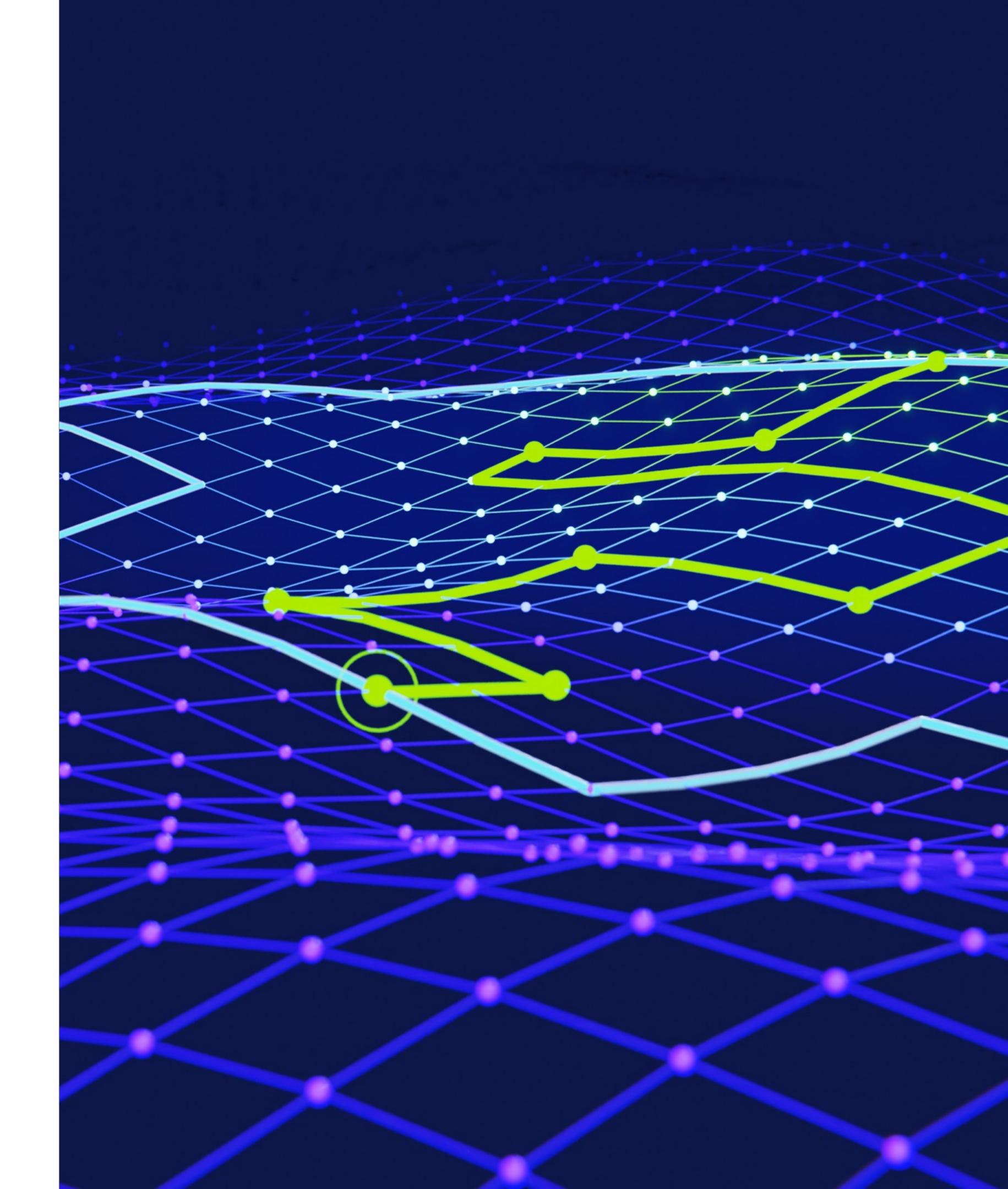


# Try cuOpt today!

Free option, enterprise version, managed or selfhosted

- cuOpt combines world's best accuracy, speed, and scale for multi constrained routing problems
- Early signs that GPUs accelerate mathematical optimization
- LLMs help model operations and facilitate optimization software adoption
- Play with the cuOpt service API on <u>API catalog</u> for free
- cuOpt is in NVIDIA AI Enterprise, deploy it as a managed service or self host







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