Democratizing manufacturing Digital Twins

A Proof-of-concept demonstrating the integration of Siemens simulation environments and shopfloor pose estimation into Omniverse



Table of contentsSummary zoom







Technology is our passion – and Simulation & Digital Twin as one of our core technologies will definitely shape the future. The value of Digital Twins will be increasingly boosted with an integrated combination of open systems for simulation, collaboration and Al.

Peter Koerte, Chief Technology & Strategy Officer at Siemens



The Digital Enterprise





Digital Enterprise

Combining the real and the digital worlds with the comprehensive Digital Twin

Real world

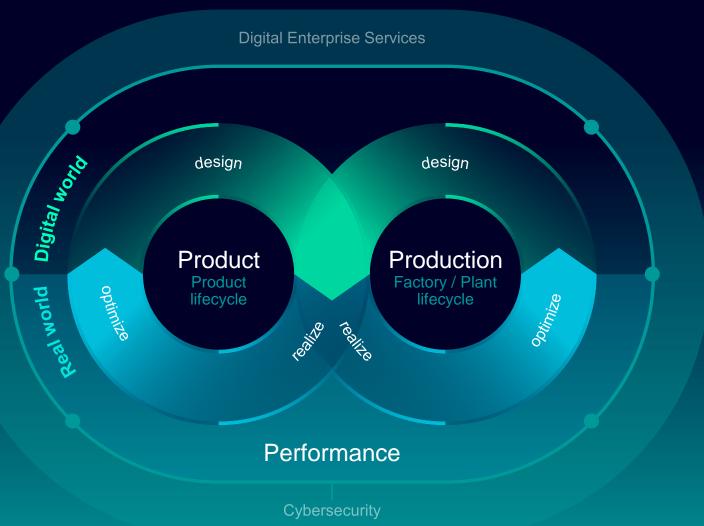


Digital world



Digital Enterprise The comprehensive Digital Twin approach

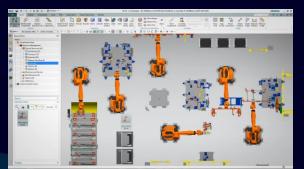
Continuous improvement of product and production in a data-driven industry

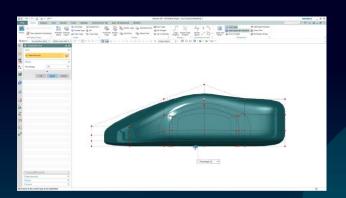




Digital Enterprise The comprehensive **Digital Twin approach**



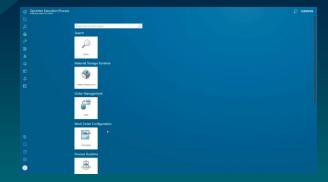




Digital Twin Product

Performance Digital world

Real Production



Real Product

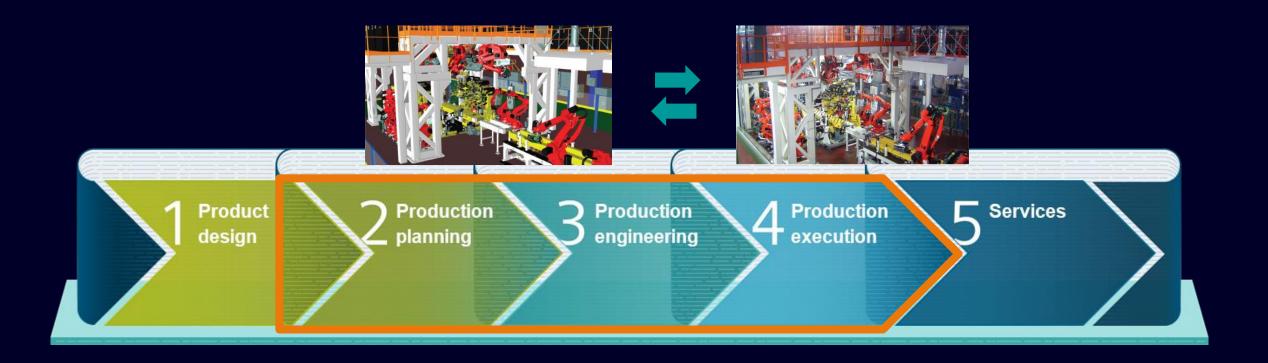
The Digital Twin approach allows the realistic simulation and validation of products, machines, lines and complete plants is the foundation for flexible and efficient manufacturing.



Simulations for manufacturing plants



Manufacturing - a critical part of the Digitalization value stream





Evaluation of plant performance when (re-)planning the production Tecnomatix Plant Simulation

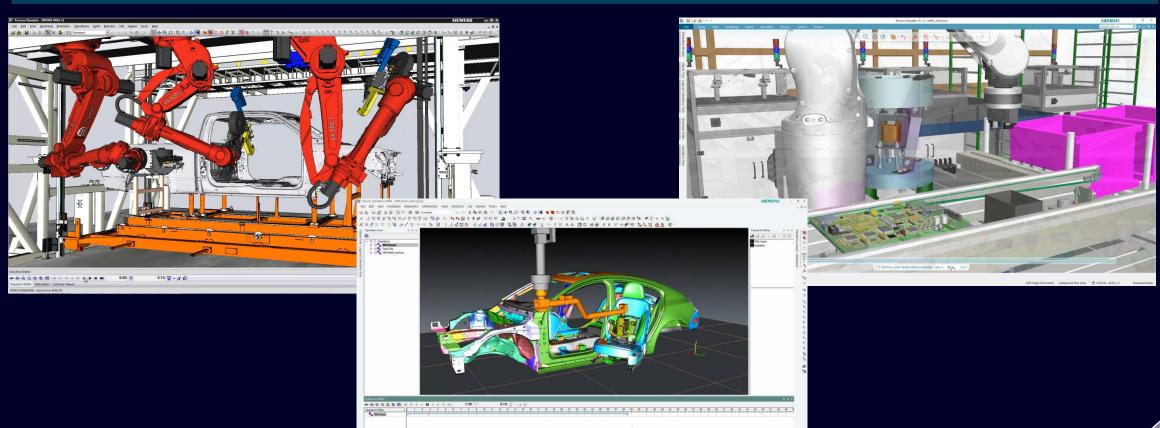


Validation of the shopfloor automation during engineering and commissioning **Tecnomatix Process Simulate**

- Robotic Programming
- **Process Definition**

- Mechanical Sequencing
- Material Flow

- Automation Control
- Virtual Commissioning

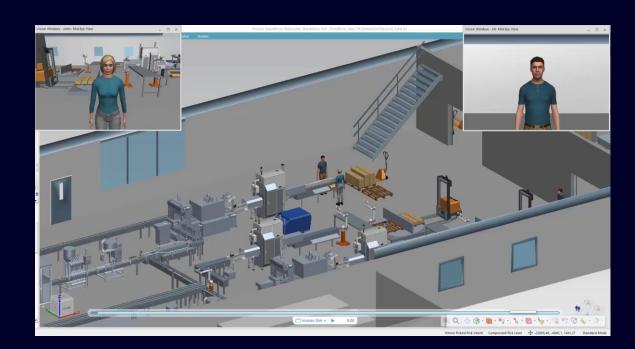


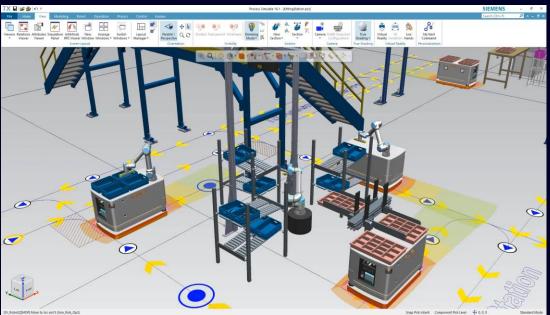
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Digital Twins in the operation



Major categories of Digital Twin applications in operation and service

Use this application when you want to... **DT Category Virtual Testing &** ... prepare for how your asset or system would Commissioning interact with other assets, systems, or people. ...measure something in your asset or system, **Virtual Sensing** but it isn't feasible to put a sensor there. **Diagnosis &** ...know why your asset or system is behaving Identification the way it is. **Performance** ...know how your asset or system might behave in future operation. **Prediction Performance** ...inform actions on how to control the asset or system (with or without a Human-in-the-Loop). **Optimization**

PoC Omniverse@Siemens



We join forces to boost Digital Twins to the next level

SIEMENS

World-class industry-grade Digital Twins



Augmentation of industrial systems with disruptive technologies





DisruptiveAI, RTX &
VR/AR Collaboration





The Omniverse@Siemens project investigates how Digital Plant Twins can be held up-to-date – everywhere, always, in real-time and with minimum effort

Facts



- "The market for Digital Twins (DTs) will rise at a yearly growth rate of 40-60%." 1
- Industrial plants get smarter, more modular and flexible





- How to enable real-time collaboration of all plant engineering stakeholders in a multi-vendor-software landscape?
- How to ensure "as-built" DTs in a frequently changing plant configuration?
- How to update all running DTs at once?

Project goals



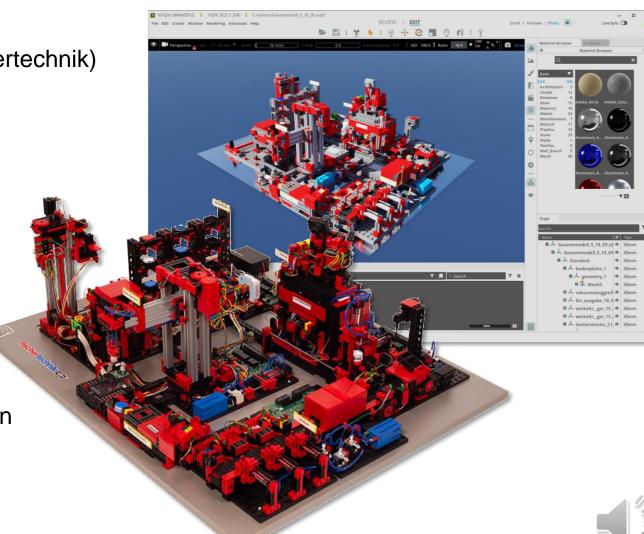
- Connect simulation experts & DTs to Omniverse for live collaboration
- Update DTs by feeding current shopfloor layout to Omniverse
- Enable more realistic DTs by co-simulations with the physics engine PhysX

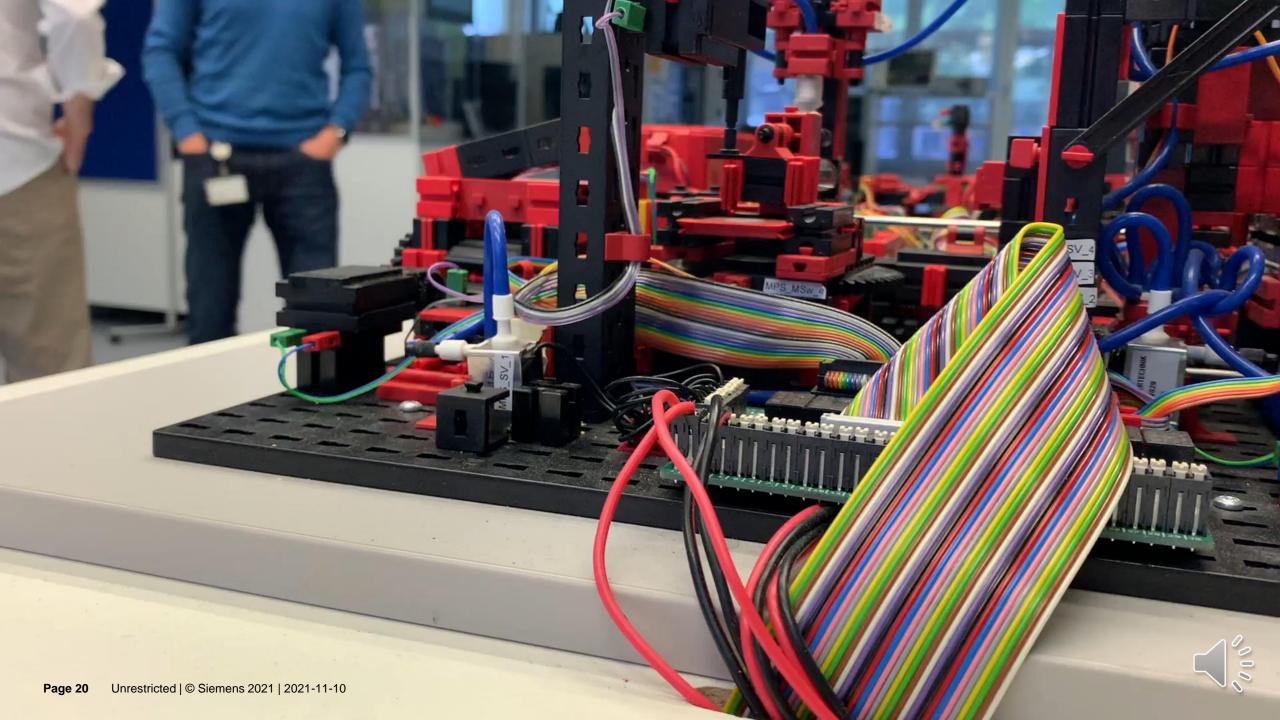


PoC "Omniverse@Siemens"

R&D Lab complete "mini" shopfloor setup (Fischertechnik)

- > HMI
- > PLC
- cameras
- conveyor belt
- Sensors
- Use cases
 - Keep simulation consistent with shop floor
 - As-planned vs as-build change tracking
 - Assist classical sensors with AI pose detection





Live Collaboration

Preparation of a Digital Twin

- Design and Engineering
- Simulation
- Converters
 - Convert JT and NX file formats to USD
- Connectors
 - Tecnomatix Process Simulate
 - Tecnomatix Plant Simulation (new)















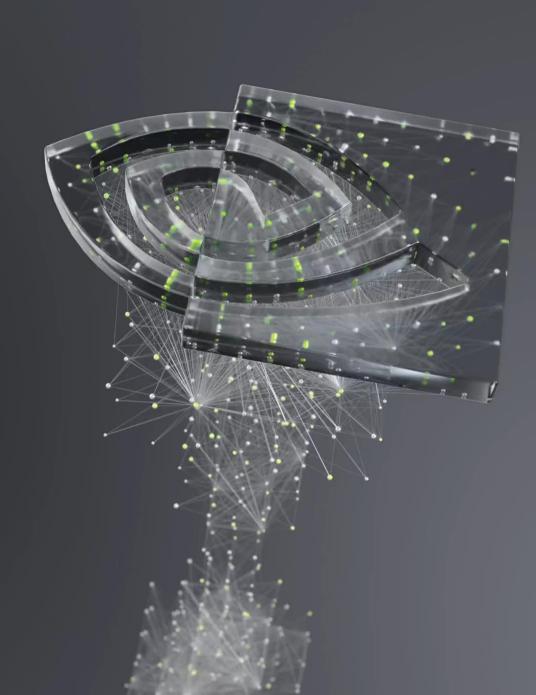








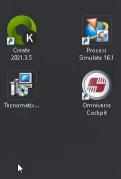


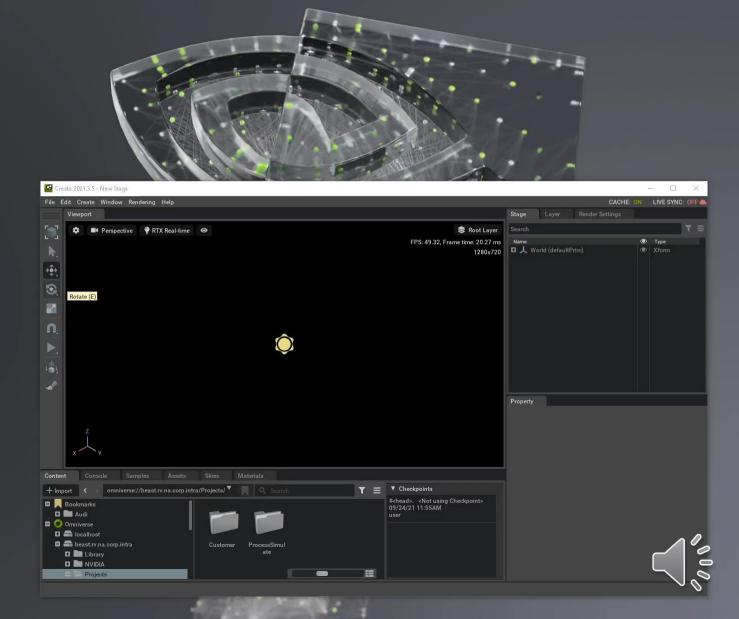






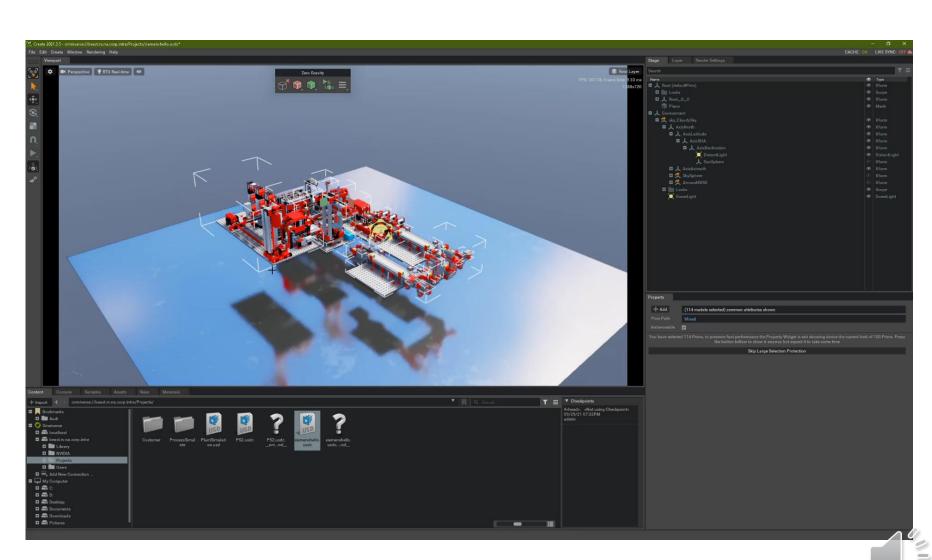






Augmented Features

- PhysX 5.1
- Collaboration
- Raytracing RTX
- CloudXR
- **-** . . .



Pose Estimation



Al based 6DoF pose estimation

- Detect and classify specific target objects in a shop floor environment
- Estimate their full 6 DoF pose
- Feed data into a digital twin of the shop floor







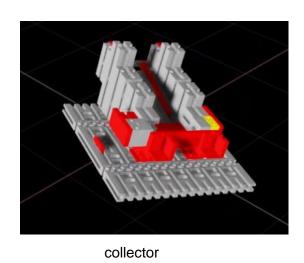
Setup

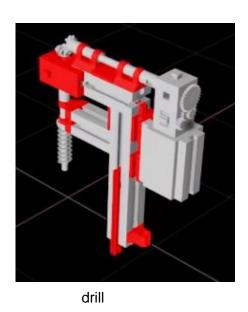
- Isaac Sim for synthetic data generation and domain randomization
- Azure T4 instance
 - > 32GB RAM
 - Dual-Core 4 virt. Threads
 - > Tesla T4 GPU
- Migration to local workstation
 - > 128GB RAM
 - > Intel i9-9940X CPU
 - Dual NVIDIA A6000



Approach

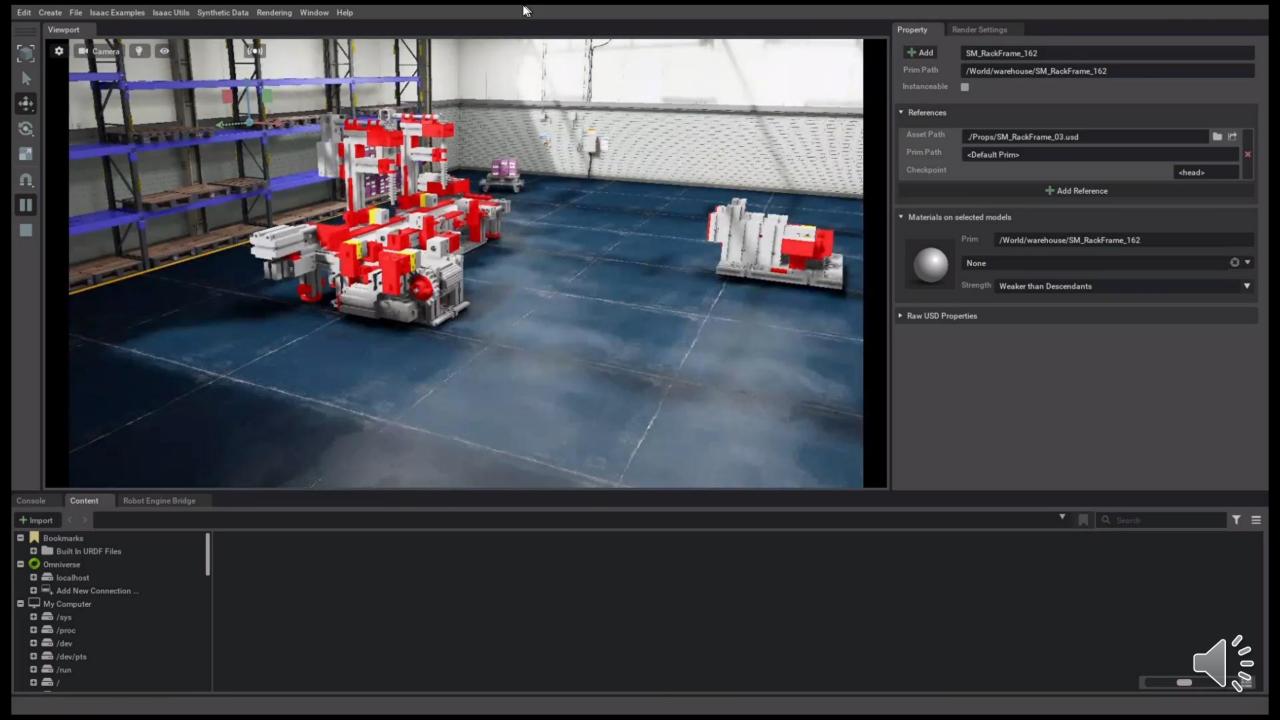
- Train CNN from synthetic data
 - Evaluate generalization capability in real world scenarios
- Evaluate performance of different CNN architectures
- Three defined target objects: collector, drill, mill











Architectures

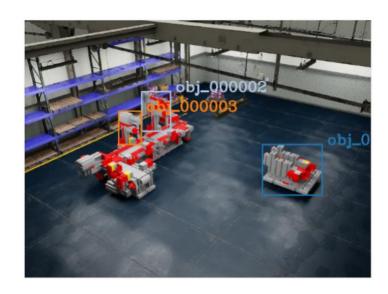
PoseCNN	CosyPose
Promising results from paper	Among top performing architectures in BOP benchmark
Lacking code documentation and structure	Good high level description and sufficient code structure
No tooling for validation and integration of external data	Various scripts and tools to analyze the level of integration of external data and its plausibility

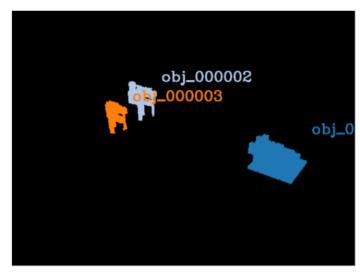


[&]quot;BOP: Benchmark for 6D Object Pose Estimation," [Online]. Available: https://bop.felk.cvut.cz/home/. [Accessed 15.09.2021]. https://github.com/ylabbe/cosypose

Adaption

- CosyPose conformant data writer for Isaac Sim
- Easy generation of arbitrary large datasets
- CosyPose adjustments for seamless injection of custom datasets in training and inference
- Preparation of 3D models
 - ➤ USD, URDF, OBJ and PLY format
 - Centered origin of models in their 3D bounding box







CosyPose Integration







RGB Image generated by Isaac Sim



URDF models transformed by poses from Isaac Sim and rendered by CosyPose



Rendered models overlaid on RGB image



Transfer Learning

- Evaluation of computational power and feasibility of full training
 - > 1 epoch with 10K images 720x540: 6:30min
 - 2 x 700 epochs (original network) with 1M images: 632 days
 - Original authors used 32 x NVIDIA V100 GPUs: approx. 10h

Training of precomputed model (TLESS) with domain specific data

- Adjustment of training data format to match original TLESS data
 - Class labels, image resolution, etc.

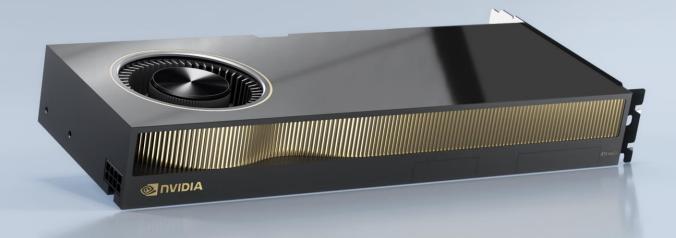


Transfer Learning – boosting Performance

30 epochs with 10K images took

• Tesla T4: 3:30h

• 2x A6000: 0:08h (!)





Wrap-up

Conclusion

- CosyPose provides a very promising approach
 - Results are solid although no particular optimization was done
- CosyPose research repo does not provide production ready code
 - No clean architecture for reusability in different scenarios
- Inference is not (yet) real-time ready
 - But CosyPose code provides many chances for optimization
- Inference results provide good initial guess for follow-up processing pipelines
 - Can stabilize results to make them more reliable
 - Refine rotational estimates in particular
- Transfer learning provides network models with good inference results
 - Training network from scratch is infeasible without GPU cluster
 - > Transfer learning provides good initial estimates without the need of huge GPU clusters
- Extended transfer learning could lead to more precise and robust inference results



Outlook

- Define clean API to make CNN reusable in different scenarios and setups
- Improve performance of CosyPose for faster training and inference (real-time)
 - Precompute point clouds in Isaac sim
 - Replace software renderer during training / inference by precomputed images / view angles
 - Reduce unnecessary / redundant copies of data
- Employ hybrid approach of CNN and traditional CV (pipeline)
 - Improve quality of results
 - Improve reliability of results
- Define DSL for domain randomization within authoring system



Open Source, Documentation

- Results are made publicly available on
 - https://github.com/netallied/cosypose4omniverse
- Setup instructions
- Changes to original CosyPose repository
- CAD and simulation files
- Feel free to contact us for any questions!



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