

Deep Learning Enabled Nanophotonic Design via Finite Element Simulation

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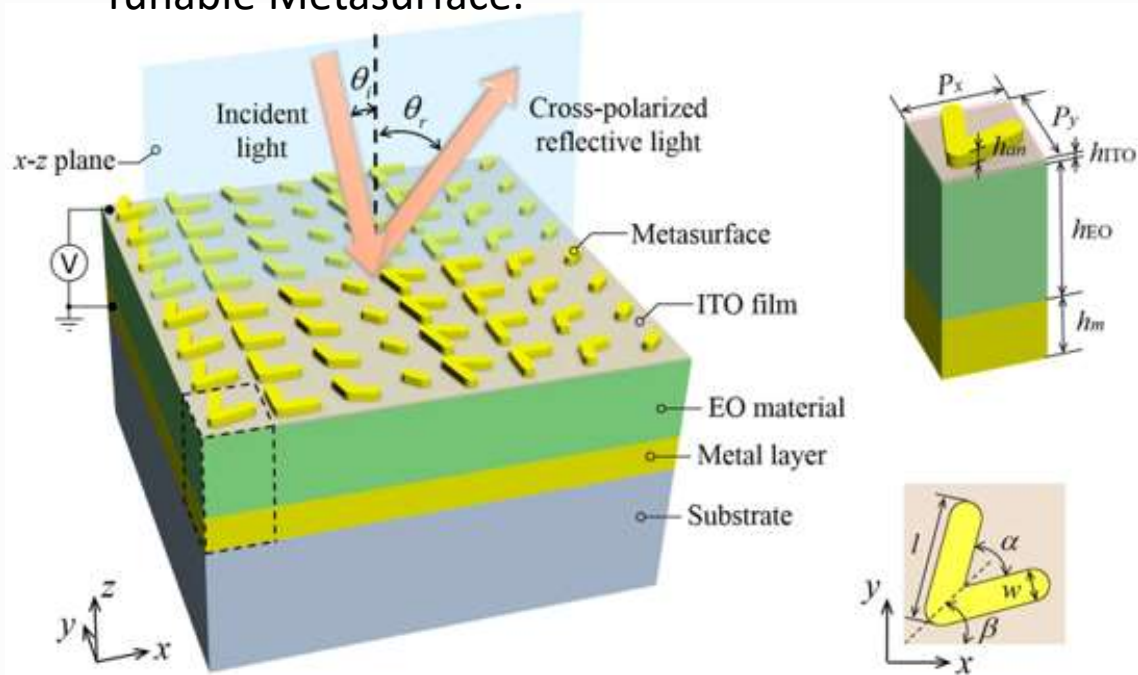


Outline

- Motivation.
 - Metamaterials and Metasurfaces.
 - Finite Element Approach, Data-Driven Approach .
- Machine Learning Models.
 - Deep Neural Networks(DNNs) .
 - Generative Adversarial Networks(GANs).
- Simulation and Results.
- Conclusions.

Metamaterials and Metasurfaces

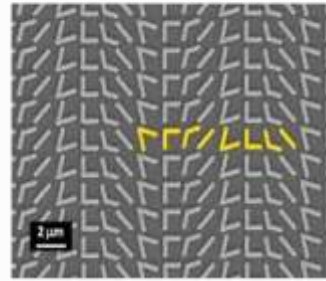
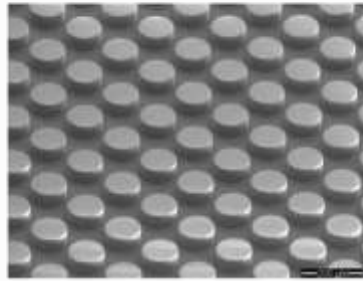
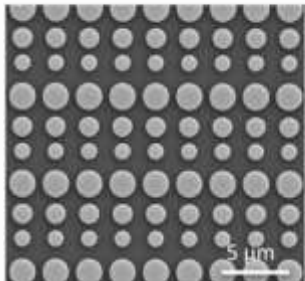
- Tunable Metasurface.



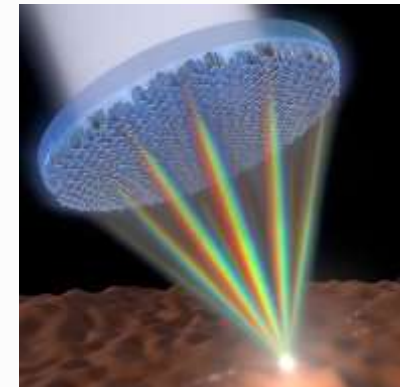
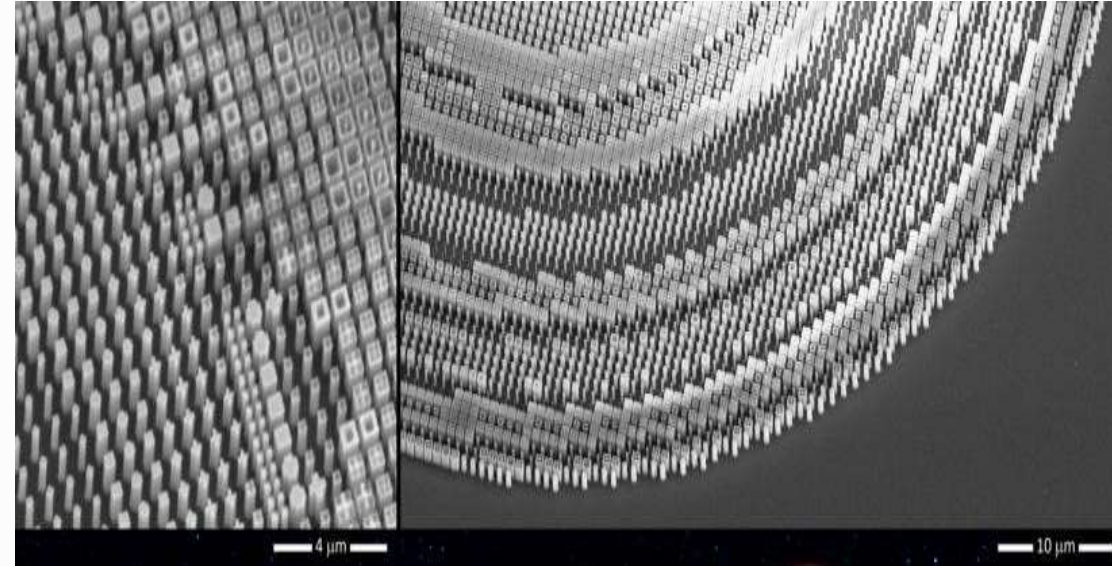
Jingjing Guo, Scientific REPORTS | 7: 14078

Tapashree Roy et al.2017 ,Acsnano

N. Yu et al. (2011)



- Meta-Lens.

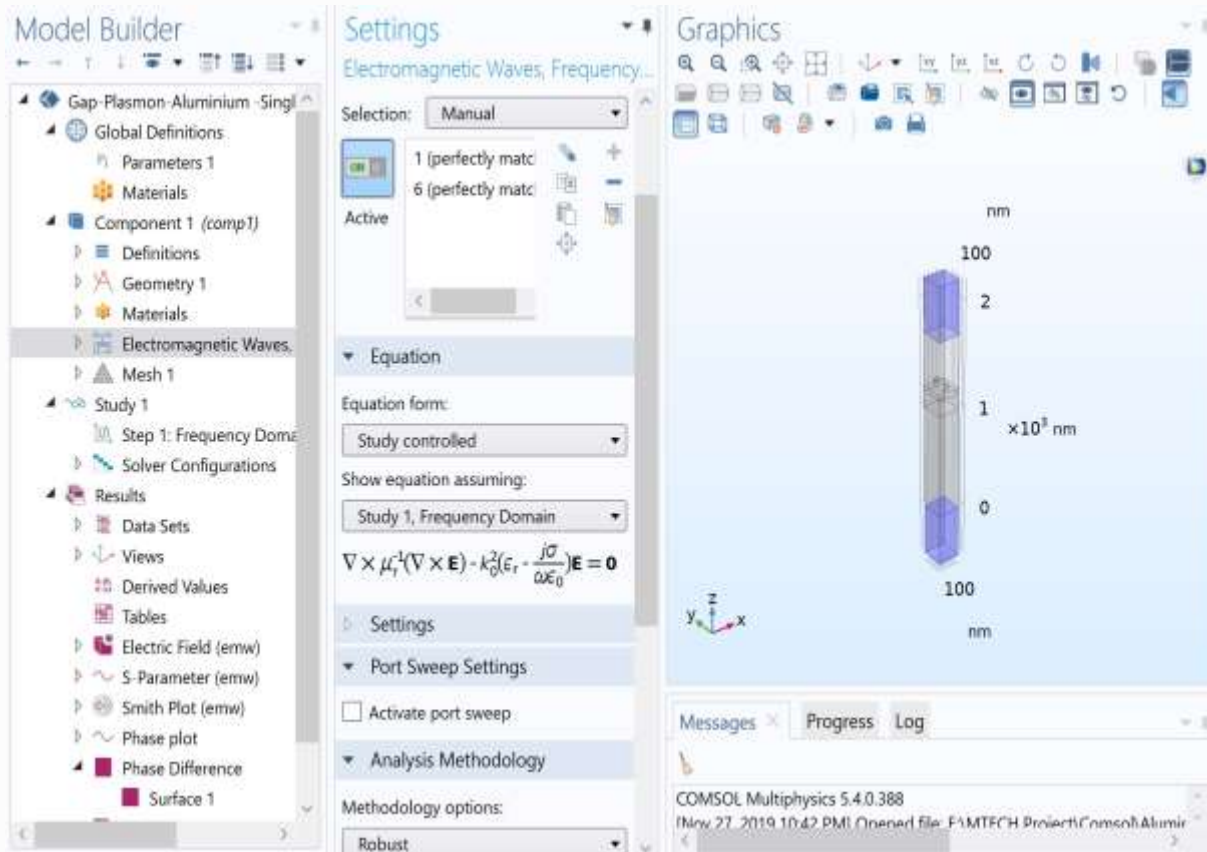


Sajan Shrestha,

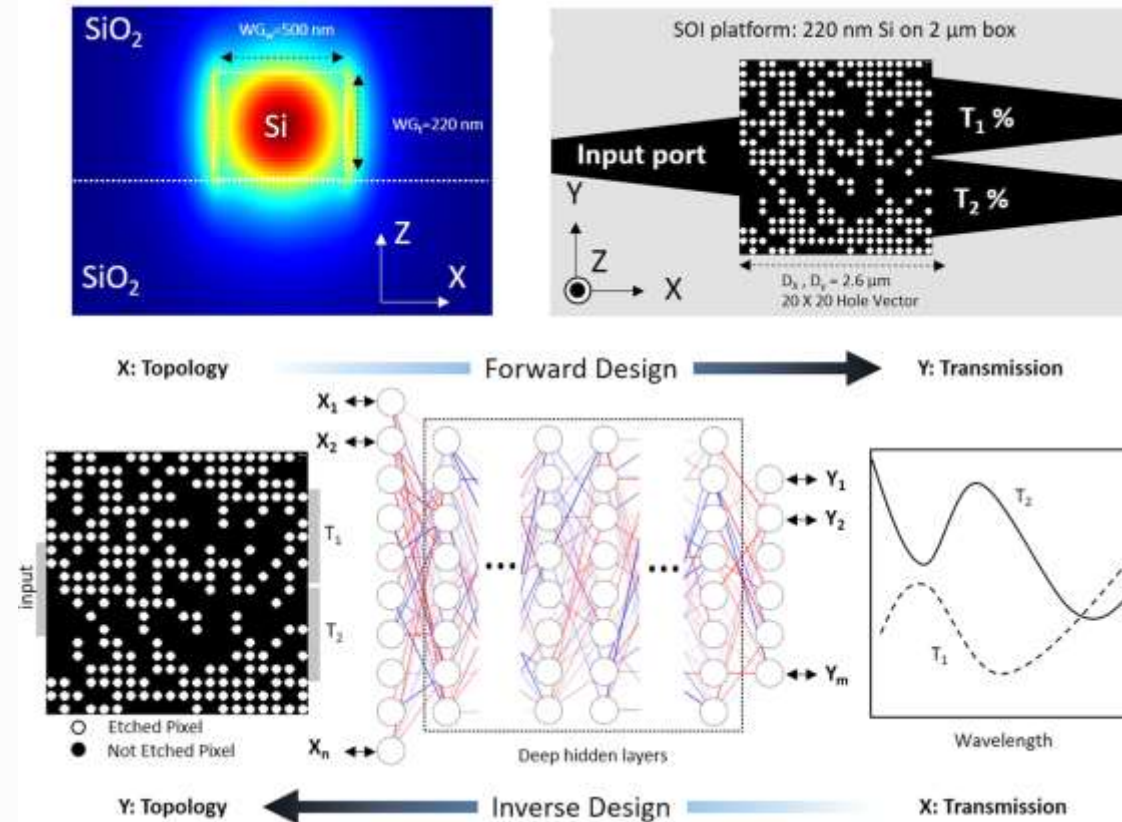
Light: Science & Applications, volume 7, Article number: 85 (2018)

Why Machine Learning?

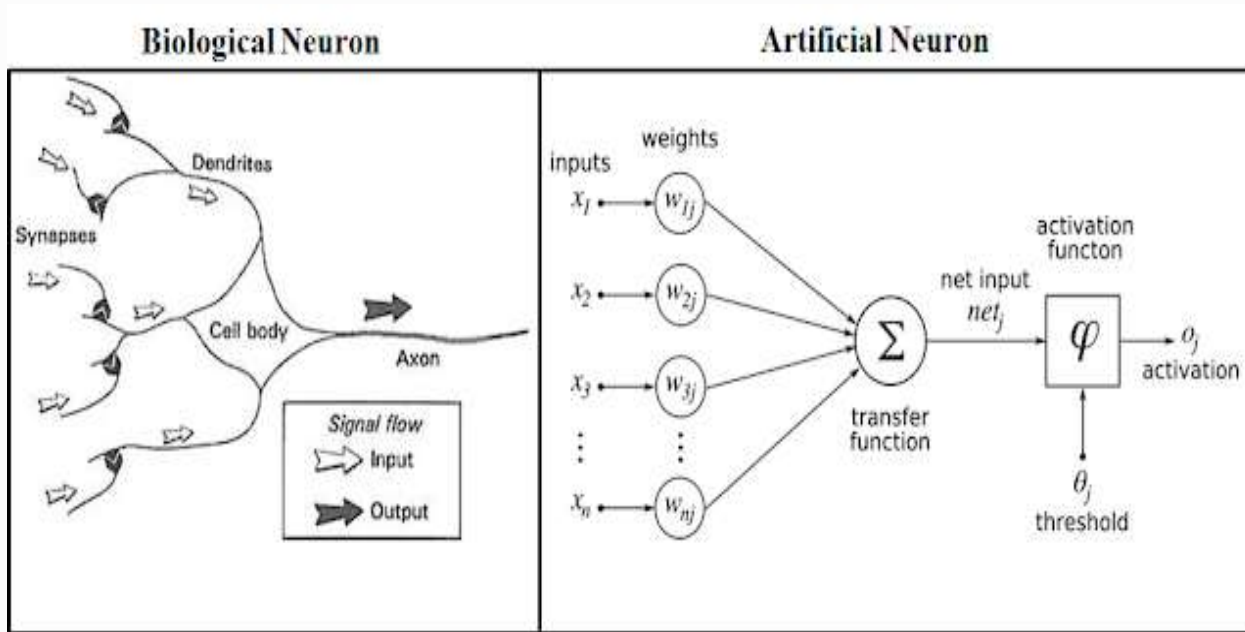
- Conventional Approach.



- Data-driven Approach.

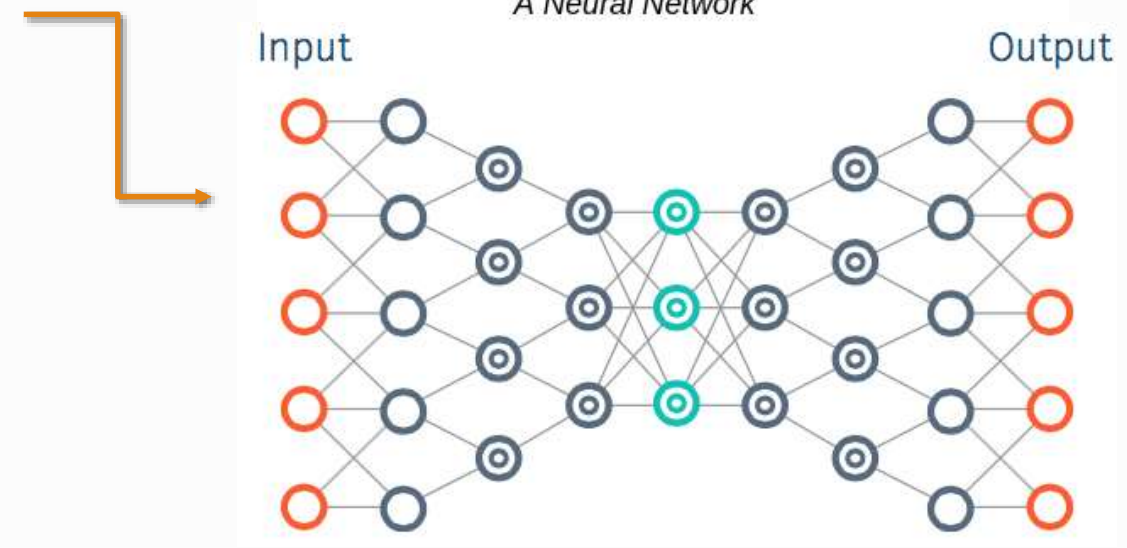
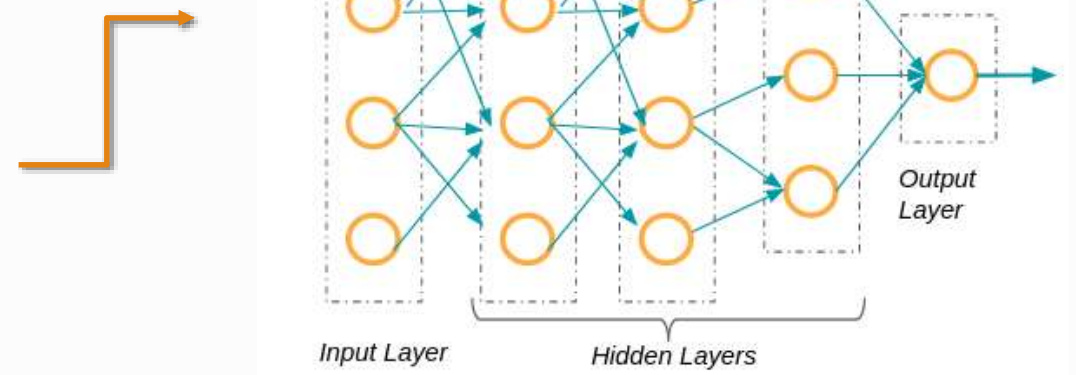


Machine learning Models



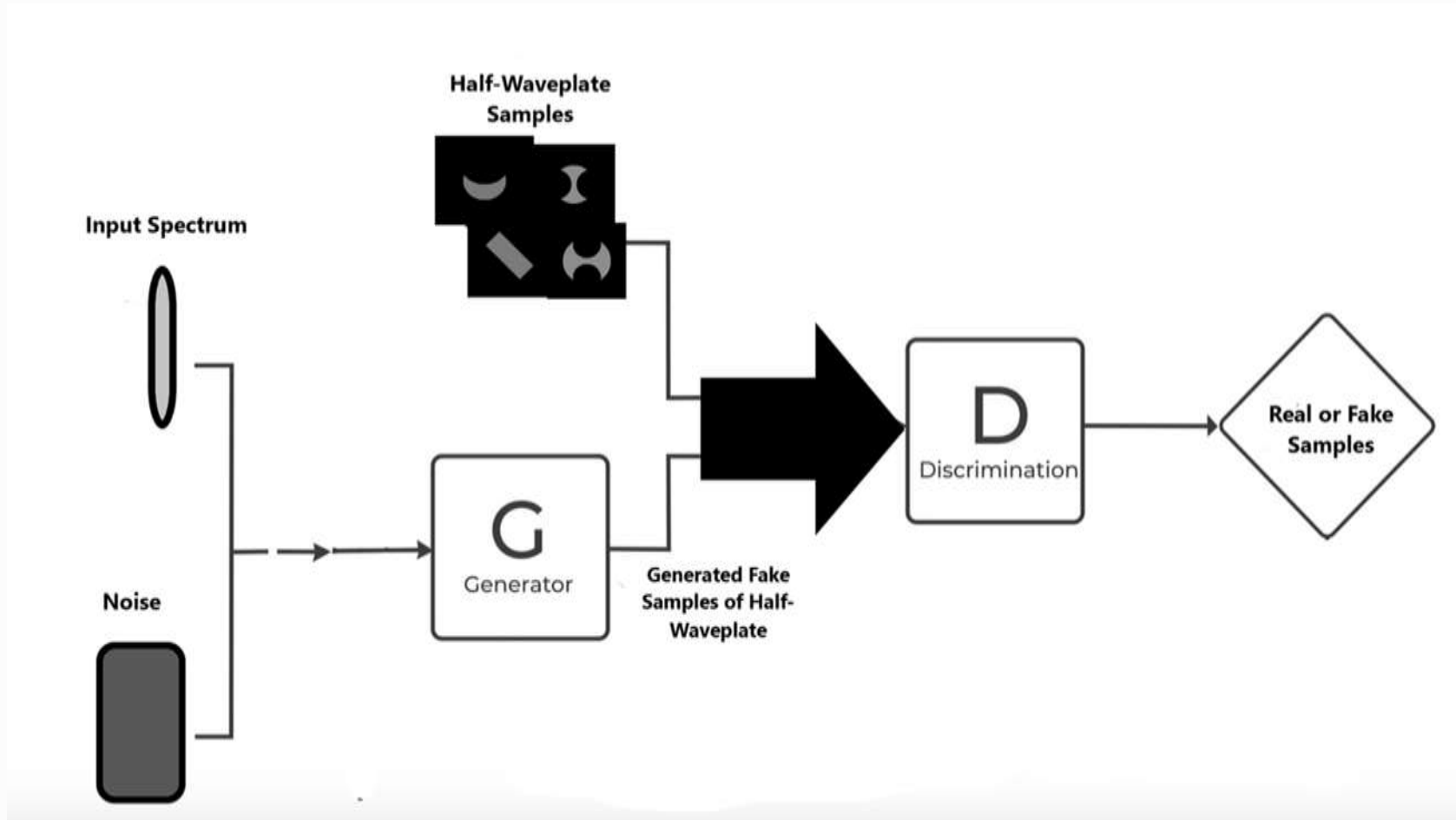
Data Science and Neural Networks

Deep Neural Networks

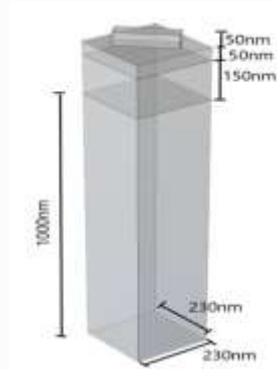
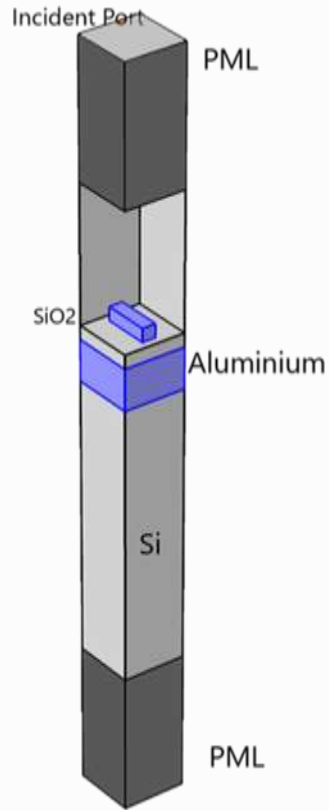


Community home, AI

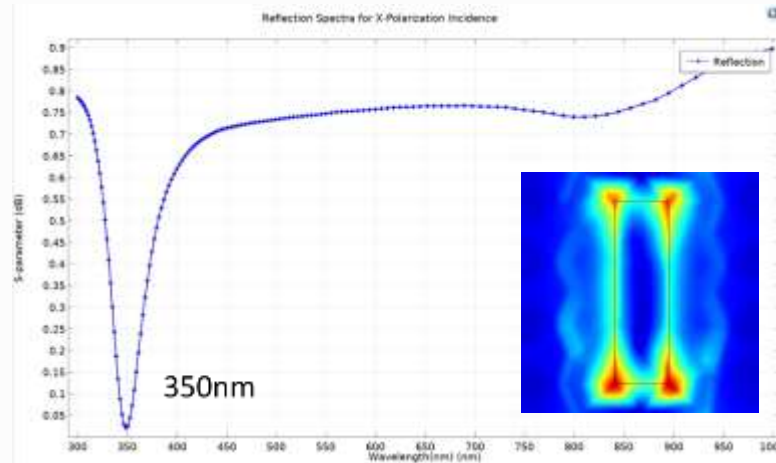
- Conditional- Generative Adversarial Network



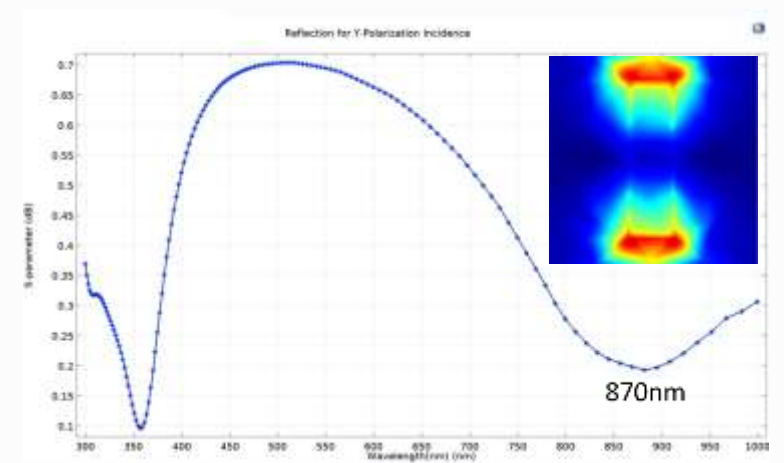
Modelling State of Polarization



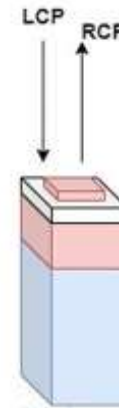
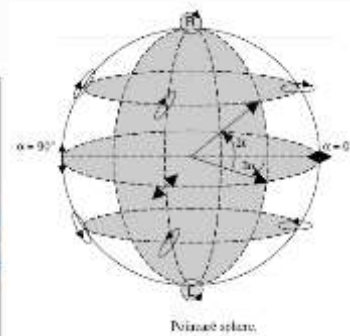
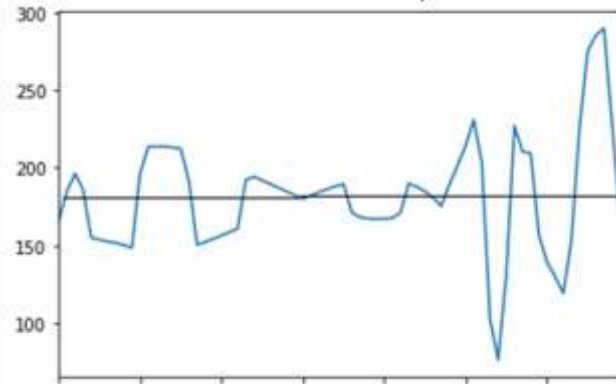
X-Polarization Incidence.



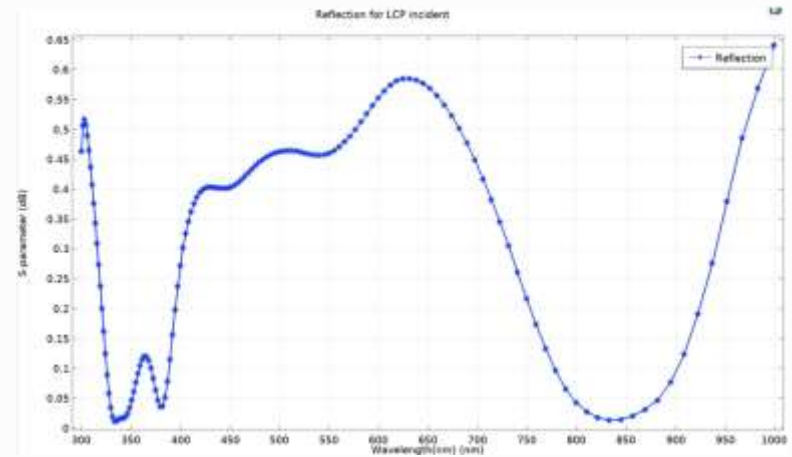
Y-Polarization Incidence.



Phase difference between X- and Y-polarized.

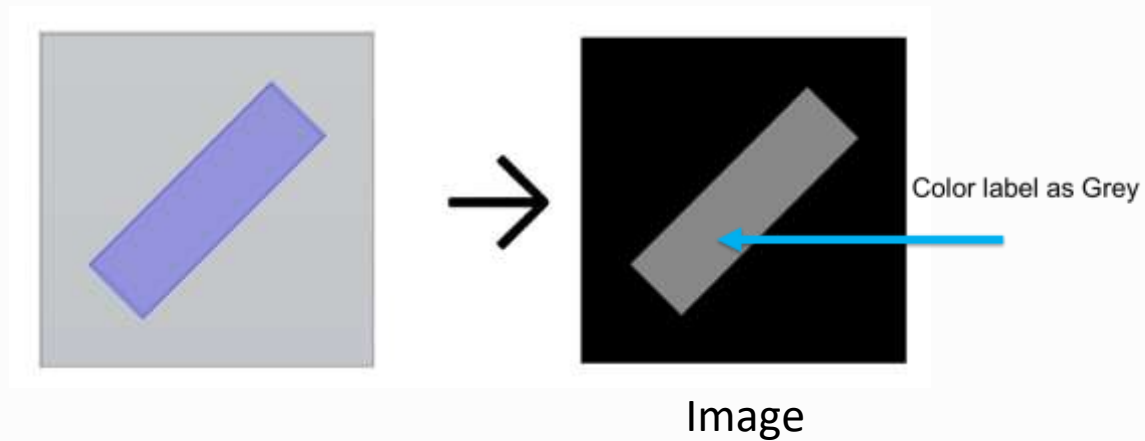


LCP to RCP conversion.

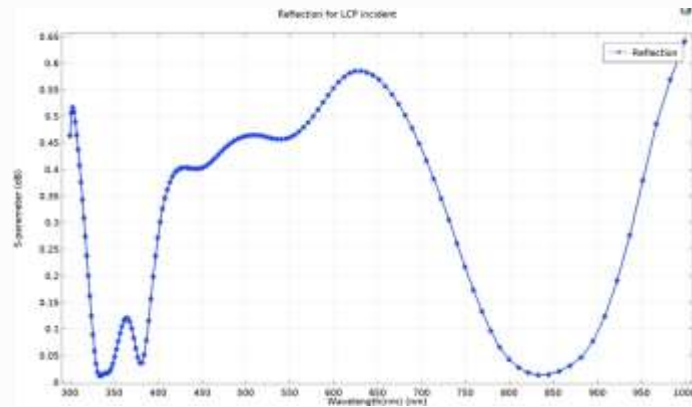


Can we achieve more efficiency?

Dataset Preparation.

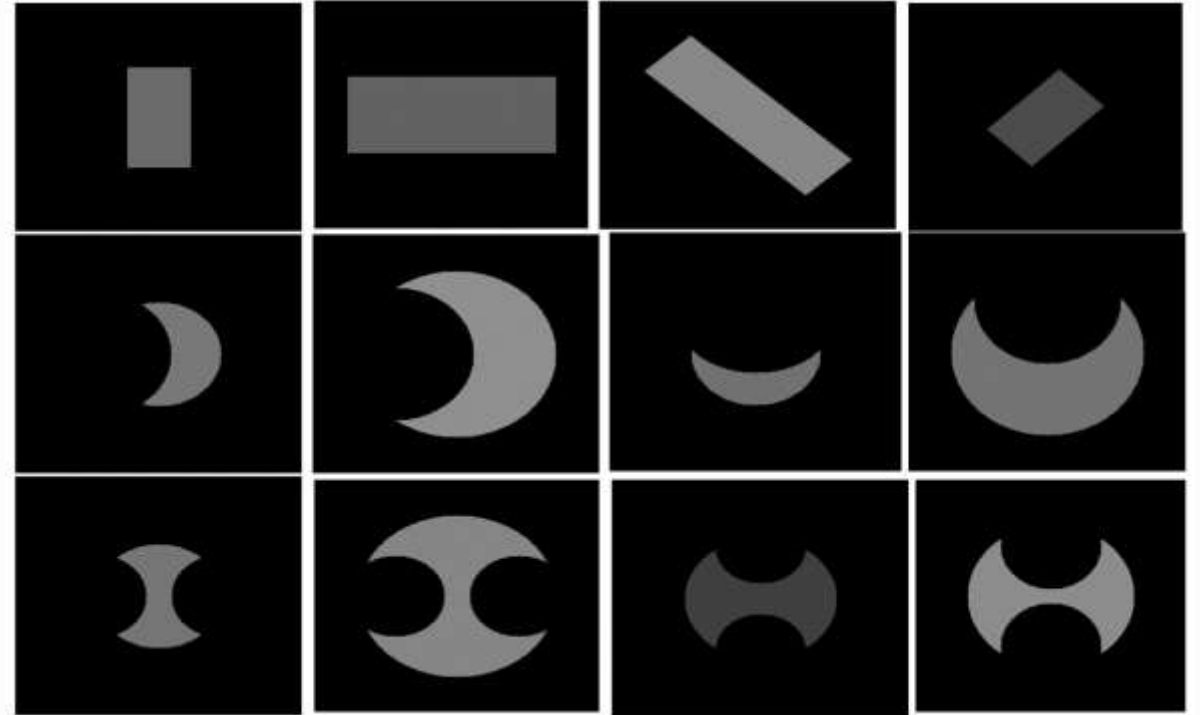


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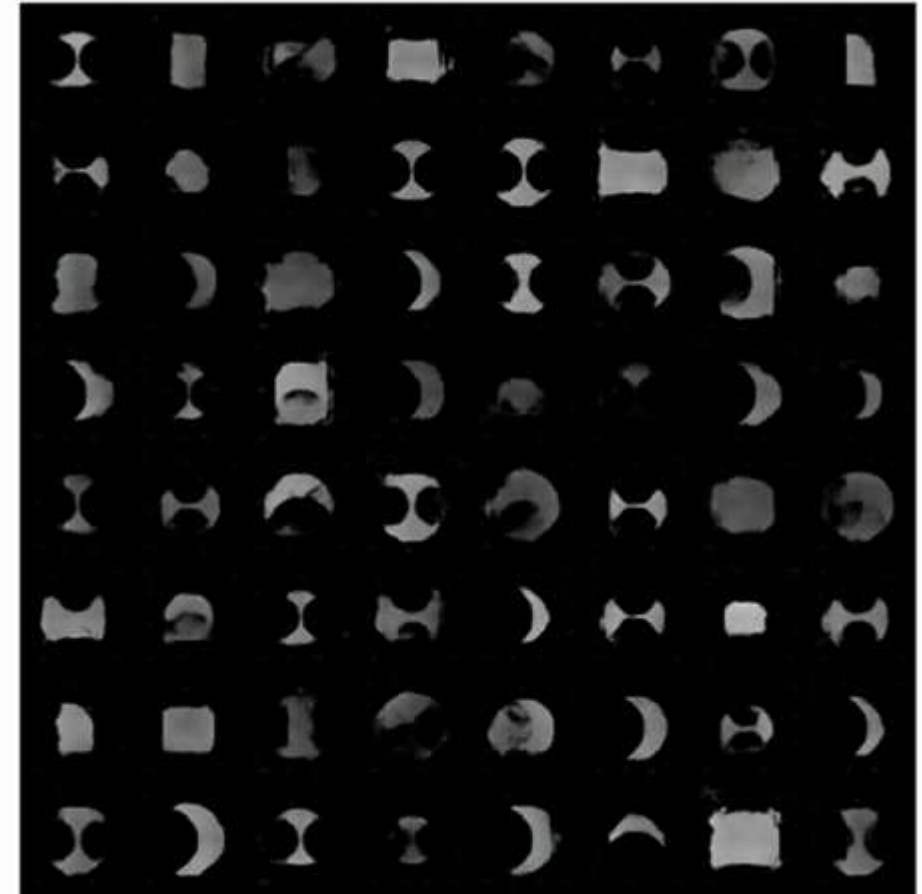
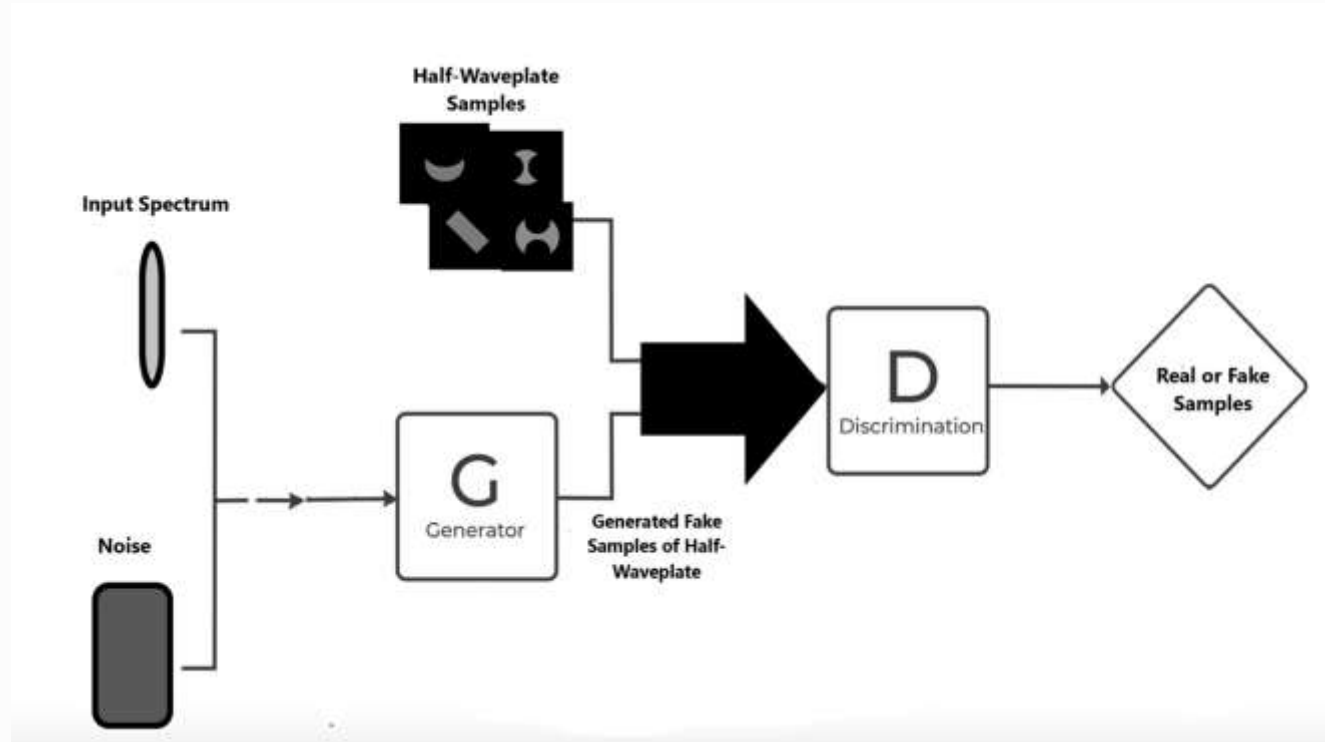
100-points vector spectrum

Half-waveplate Design Samples



- 1000 Half-waveplate simulations using Livelink for MATLAB with random generation algorithm.

Training of Deep Learning Model



Conclusion:

- High-quality training device data using the combination of iterative optimizers and accurate electromagnetic solvers i.e. Finite Element Simulations using Comsol.
- Machine Learning models can learn correlations between device topology and its electromagnetic response.
- A data-driven design and characterization process for nanophotonic devices.
- Complex designs with multiple structural parameters could be learned using machine learning models.



thank you

