

# Learning deeply to vanish light: intelligent metasurface design for next-generation antireflection

Yuheng Chen,<sup>a,b</sup> Vaishnavi Iyer,<sup>a,b</sup> Alexander V. Kildishev,<sup>b</sup> Vladimir M. Shalaev,<sup>a,b</sup> and Alexandra Boltasseva<sup>a,b,\*</sup>

<sup>a</sup>Purdue University, Birck Nanotechnology Center, and Purdue Quantum Science and Engineering Institute, Elmore Family School of Electrical and Computer Engineering, West Lafayette, Indiana, United States

<sup>b</sup>Quantum Science Center, Oak Ridge National Laboratory, Oak Ridge, Tennessee, United States

Almost half of the sunlight striking a silicon solar cell is lost to reflection—a fundamental inefficiency that limits real-world energy conversion.<sup>1,2</sup> The root of the problem lies in the stark refractive index contrast between air and crystalline silicon, which causes a significant mismatch in optical impedance at the interface, leading to strong Fresnel reflections across much of the solar spectrum.<sup>3</sup>

To address this, solar cell manufacturers have traditionally relied on antireflective coatings (ARCs) made from multilayer stacks of dielectric thin films such as silicon nitride ( $\text{Si}_3\text{N}_4$ ), titanium dioxide ( $\text{TiO}_2$ ), or magnesium fluoride ( $\text{MgF}_2$ ).<sup>4</sup> These coatings are carefully engineered using interference principles to cancel out reflected waves at specific wavelengths, thereby improving light transmission into the cell. However, such designs are inherently narrowband and most effective only at or near normal incidence, meaning when sunlight strikes the cell surface perpendicularly. In practice, sunlight arrives from a variety of angles throughout the day and across seasons, particularly in outdoor, fixed-tilt solar installations. Under these oblique conditions, the performance of conventional ARCs rapidly deteriorates, with reflectance increasing substantially at high incidence angles.

Reporting in *Advanced Photonics Nexus*, Ovcharenko and co-workers confronted this challenge head-on by developing a single-layer metasurface antireflective coating that achieves record-low broadband reflection, spanning the 500 to 1200 nm wavelength range and maintaining exceptional angular performance.<sup>5</sup> Notably, the authors explicitly minimized both the polarization and angular dependence of reflection across a broad angular range from 0 to 60 deg. Their approach merges classical photonics with neural-network-based inverse design, yielding a solution that is not only elegant but also profoundly practical. Their innovation lies in bypassing the multilayer paradigm altogether. By engineering the geometry of subwavelength metasurface structures on a single interface, they induce tailored optical resonances that destructively interfere with reflected waves over an impressively broad spectrum.

A key advancement of this work is the unification of forward modeling and inverse optimization. Instead of manually iterating through geometric permutations, the authors deployed the GLOnets machine learning framework that interprets reflectance gradients to converge rapidly on optimal configurations.<sup>6,7</sup> The result is not only a lower reflectance but also a design process that is scalable, systematic, and adaptable across use cases. Importantly, the proposed free-form inverse-designed metasurface achieves angular- and polarization-averaged reflectance values that get close to those of optimized, multimaterial, three-layer planar ARCs—reported to achieve  $\sim 2.95\%$  average reflection over the same 500 to 1200 nm wavelength range. The most compelling demonstration lies in their comparison among different typical design approaches using single- or multilayer planar structures: both forward-designed

cross-circular and free-form inverse-designed structures obtain the best reported antireflection properties for single-layer structures,  $\sim 2\%$  and  $4.4\%$  for the normal and oblique incidence, respectively.

This achievement exemplifies a broader shift in the photonics field—from rigid, manually engineered architectures to flexible, algorithmically driven design frameworks—and suggests that the future of optical coatings, and nanophotonics more broadly, will depend as much on intelligent structural design as on the discovery of new materials. Still, some challenges and opportunities remain. Although single-layer metasurfaces offer clear advantages, single-material multilayer ARCs also remain a compelling and viable alternative. For instance, multilayer stacks with continuously varying refractive index profiles—achievable through graded control of nitrogen flow during deposition—have demonstrated excellent broadband antireflection performance, with recent neural-network-based design techniques addressing challenges in fabrication robustness and index tunability.<sup>8</sup> Such designs have shown promise not only in theory but also in practical scenarios that account for deposition errors and material imperfections.

In summary, Ovcharenko et al. reconceptualized reflection not merely as a loss mechanism to be minimized but also as a design challenge that can be systematically addressed through algorithmic optimization. Their study underscored the potential of data-driven, intelligent design frameworks to advance next-generation photovoltaic technologies. This signifies a subtle shift in photonic engineering, where researchers now combine deep learning with traditional photonics theory to achieve more advanced control over light.

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\*Address all correspondence to Alexandra Boltasseva, [aeb@purdue.edu](mailto:aeb@purdue.edu)

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