



# Decoupling Simulation Accuracy from Mesh Quality

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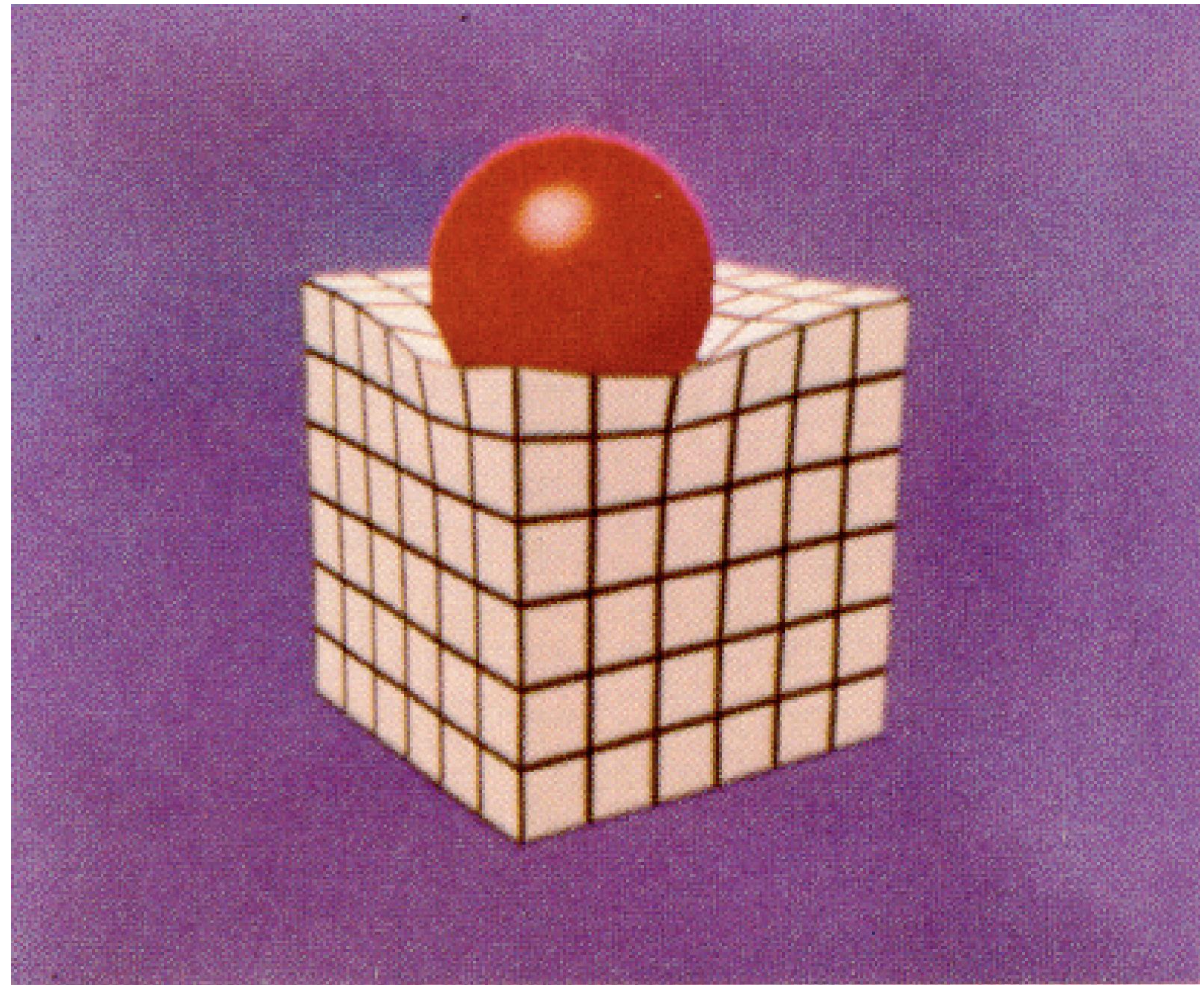
<sup>1</sup>New York University

<sup>2</sup>NTopology

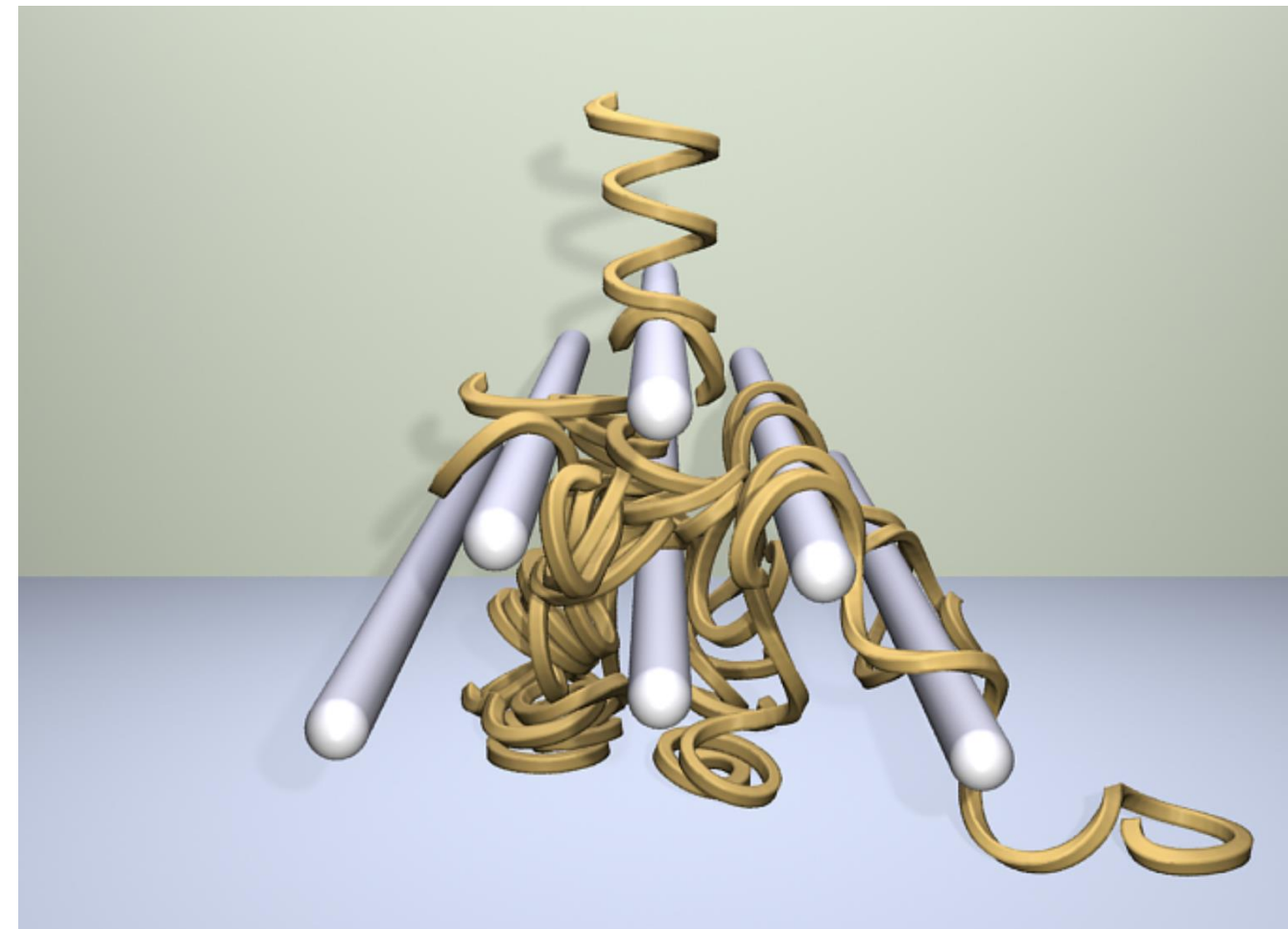
<sup>3</sup>Florida State University



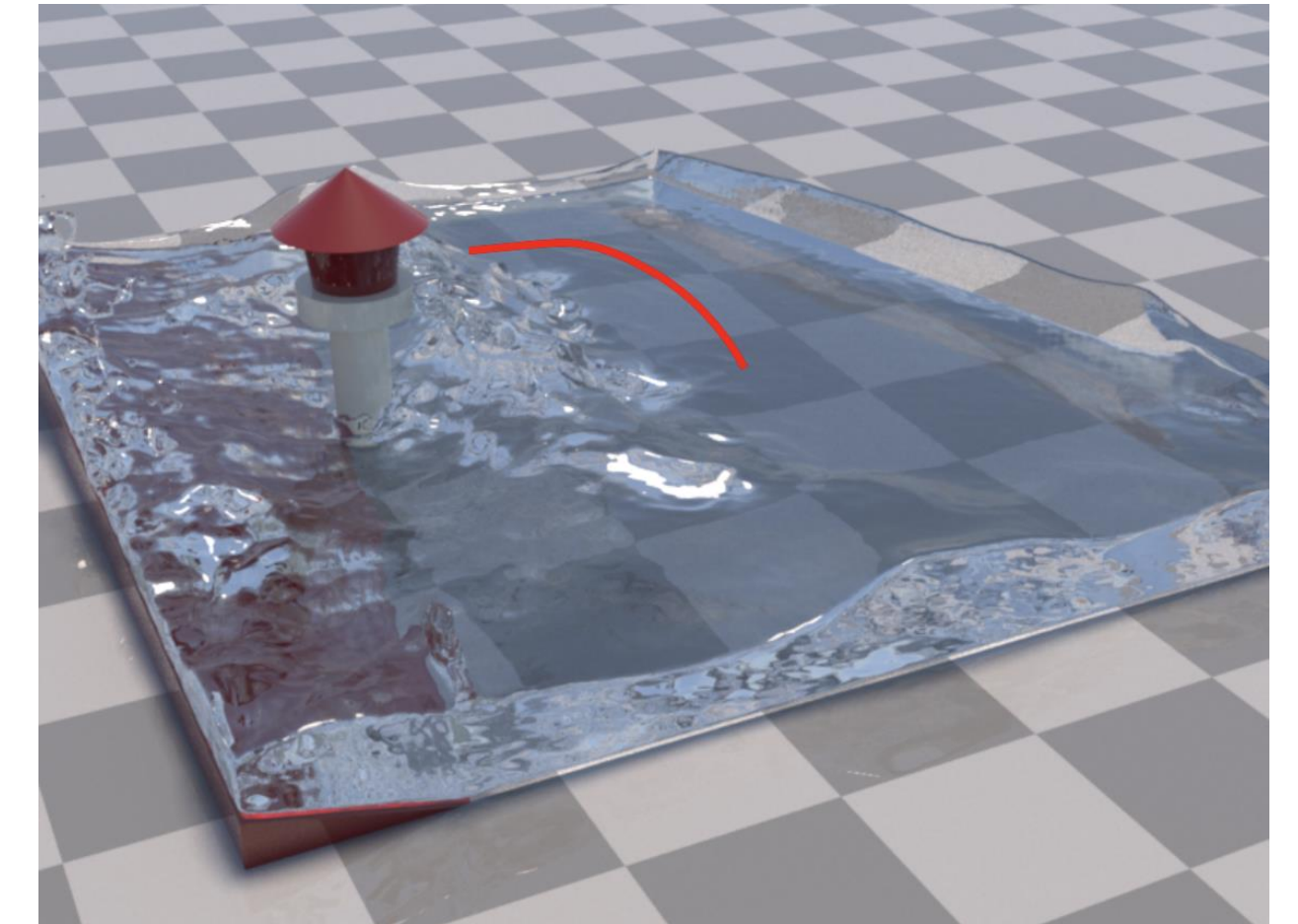
# Simulating Physics



Modeling [Terzopoulos et al. 1987]



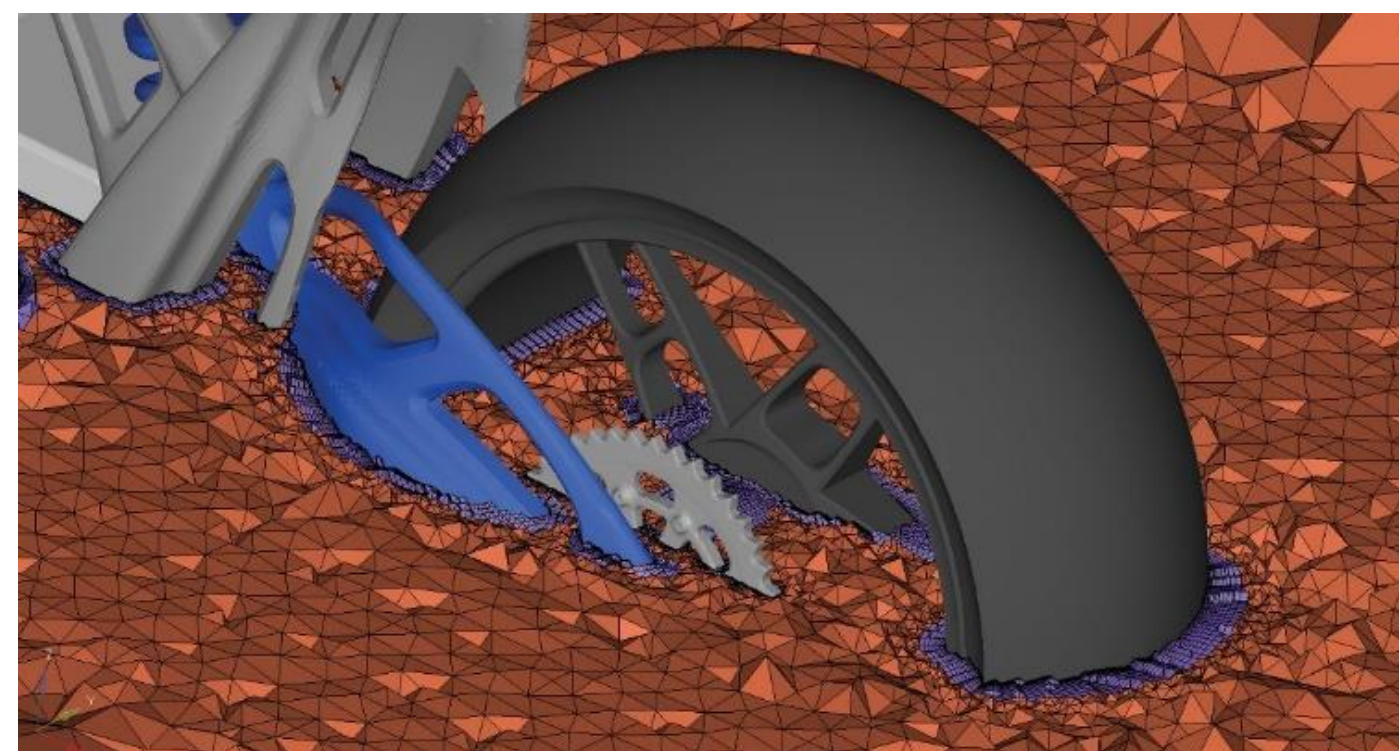
Deformation [Bargteil et al. 2014]



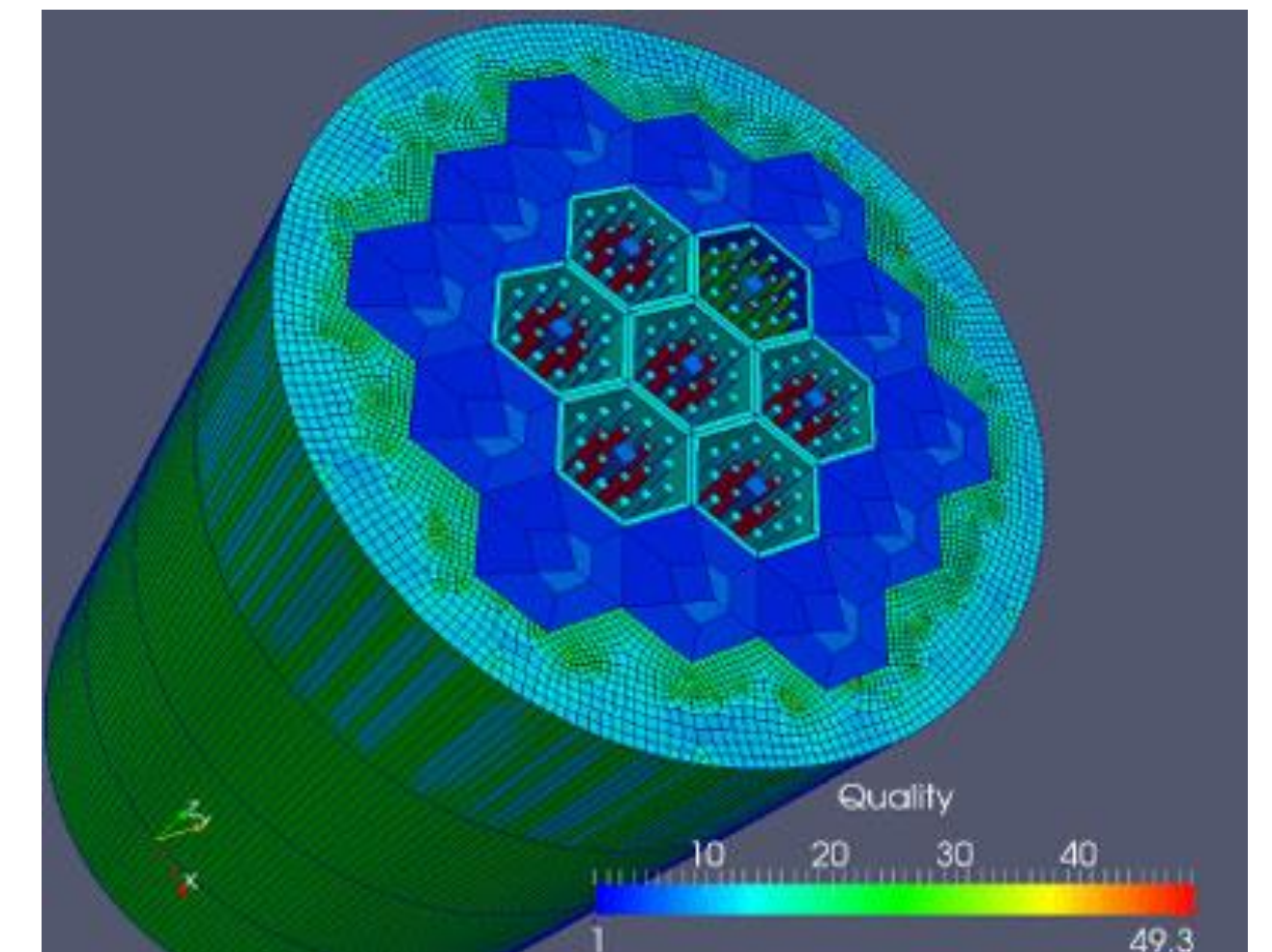
Fluid dynamics [Pan et al. 2013]



Topology Optimization [Zhu et al. 2017]



Aerodynamics



Engineering



# Partial Differential Equation (PDE)

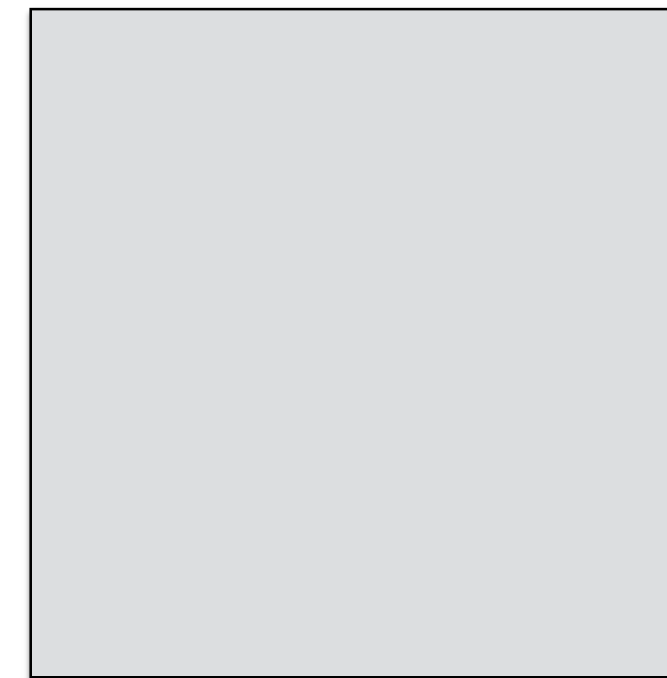
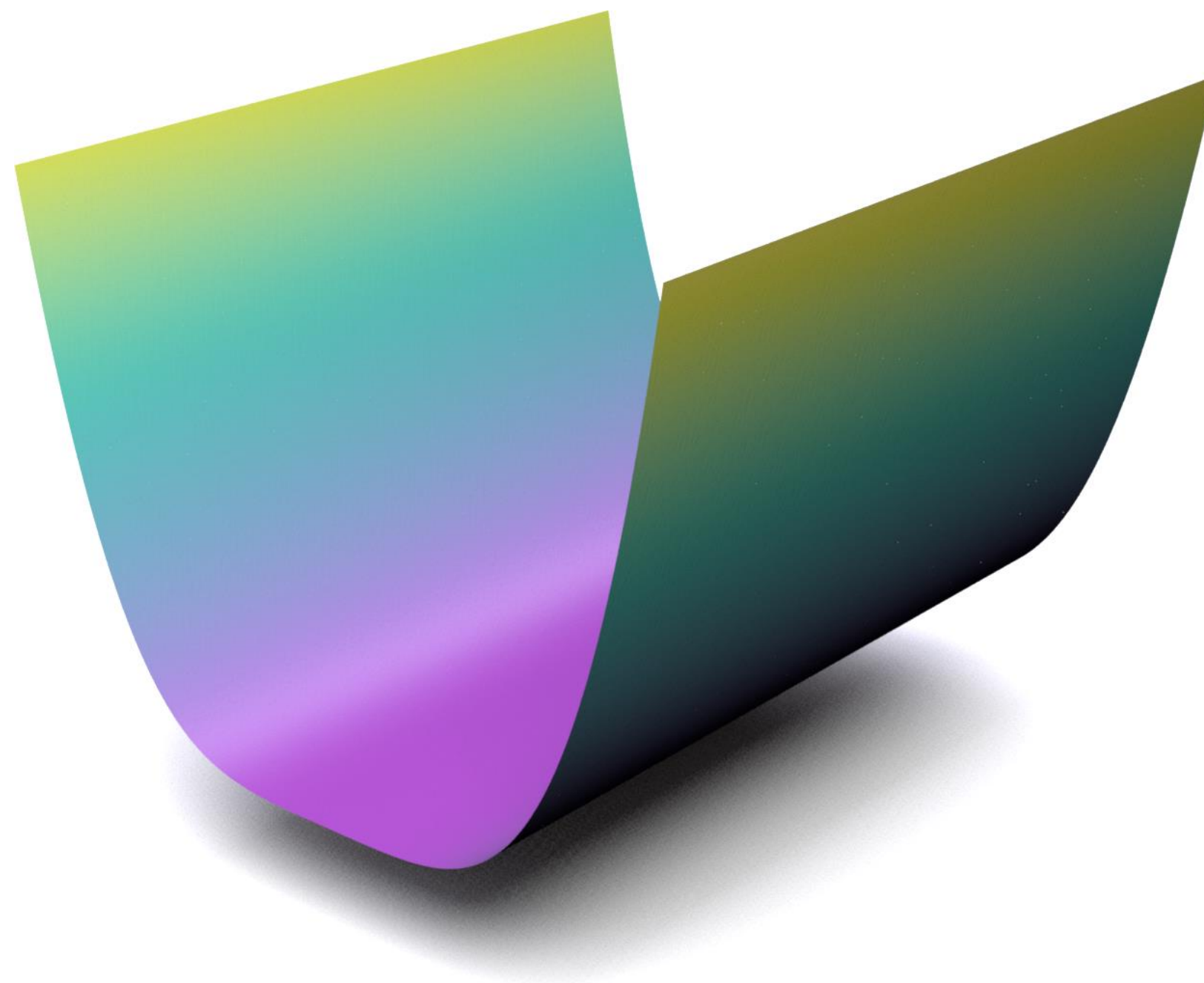
# Partial Differential Equation (PDE)

$$\Delta u = f, \quad f = 12x^2$$

# PDE Solving

$$\Delta u = 12x^2$$

$$u = x^4$$



# Finite Element Method (FEM)

$$\Delta u = f$$

$$u = \frac{x^4}{4} \quad ?$$



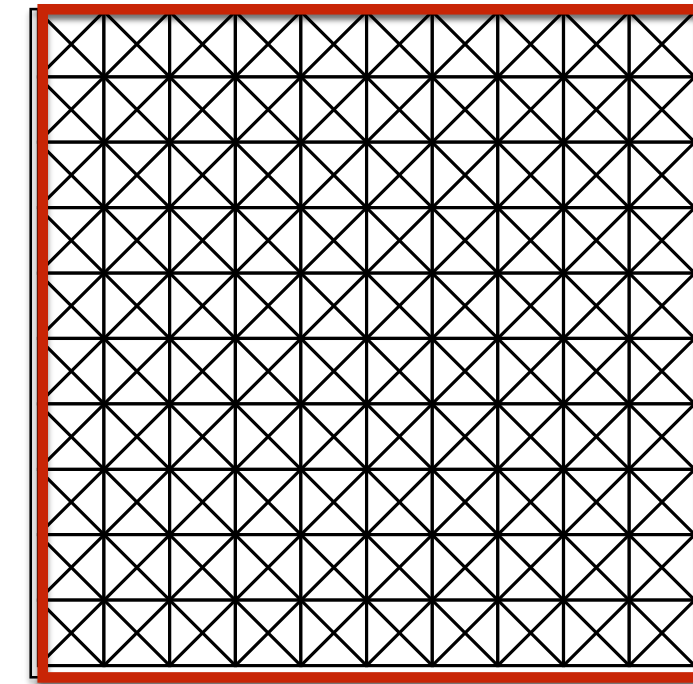
# Finite Element Method (FEM)

$$\Delta u = f$$

$$u = \frac{x^4}{4}$$

?

$$U = \sum_{i=1}^n u_i \phi_i$$

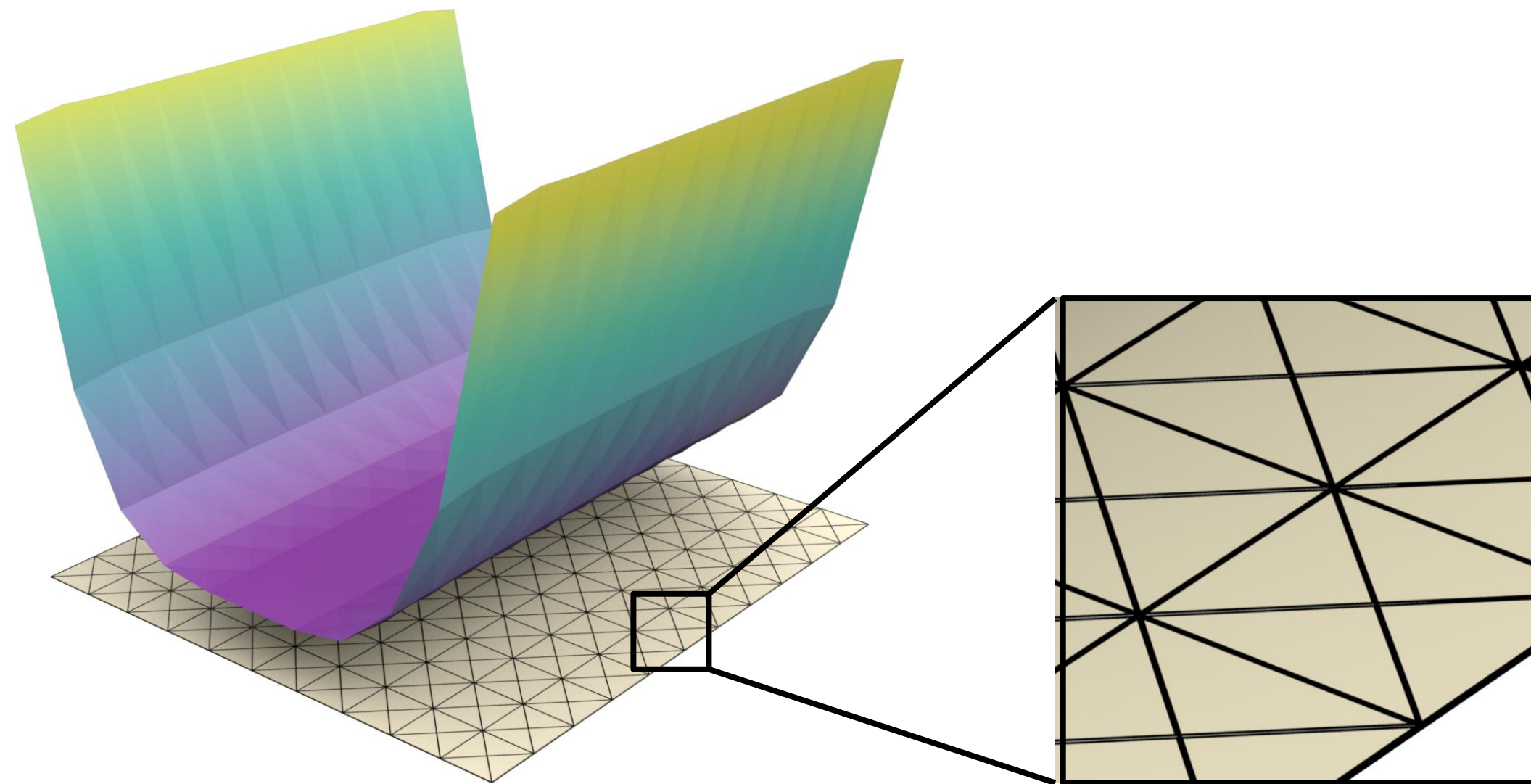
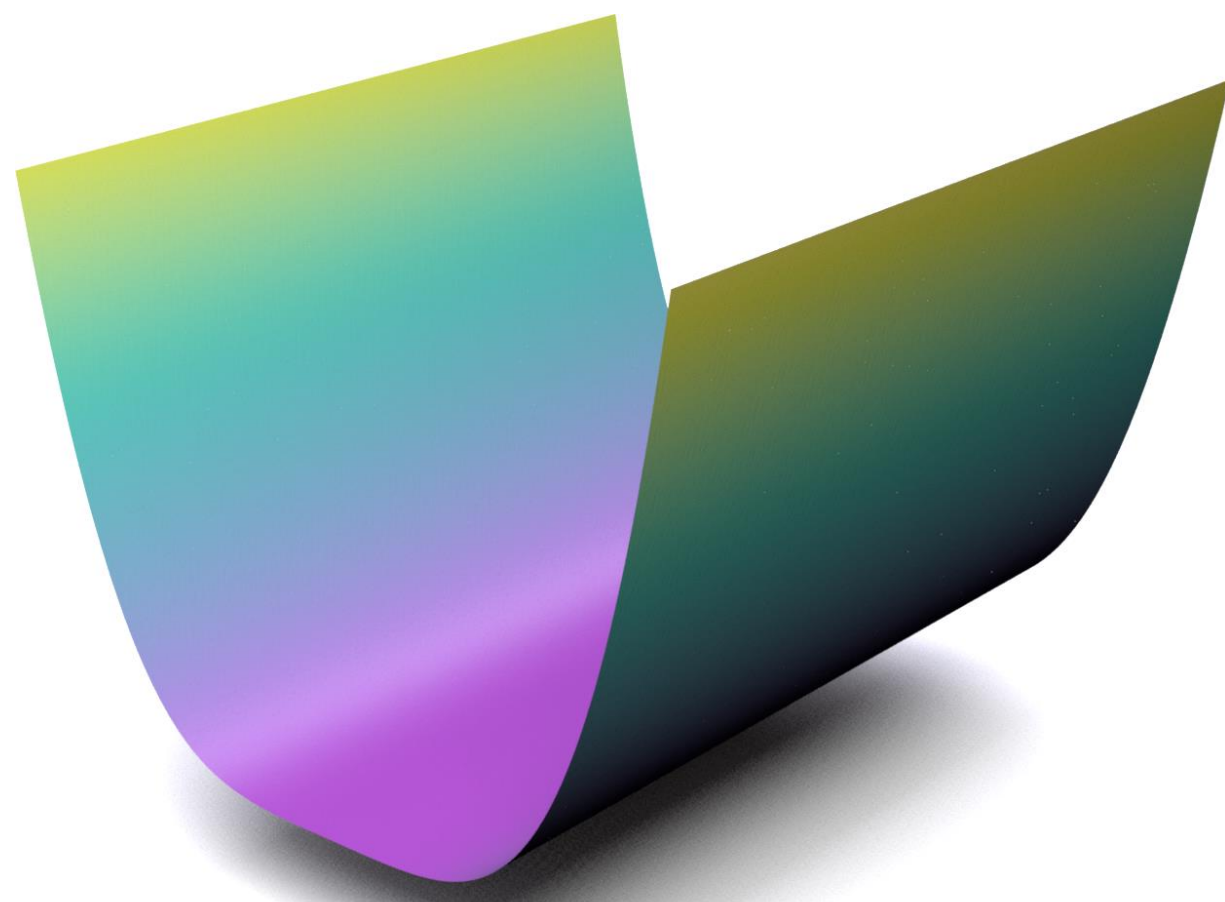
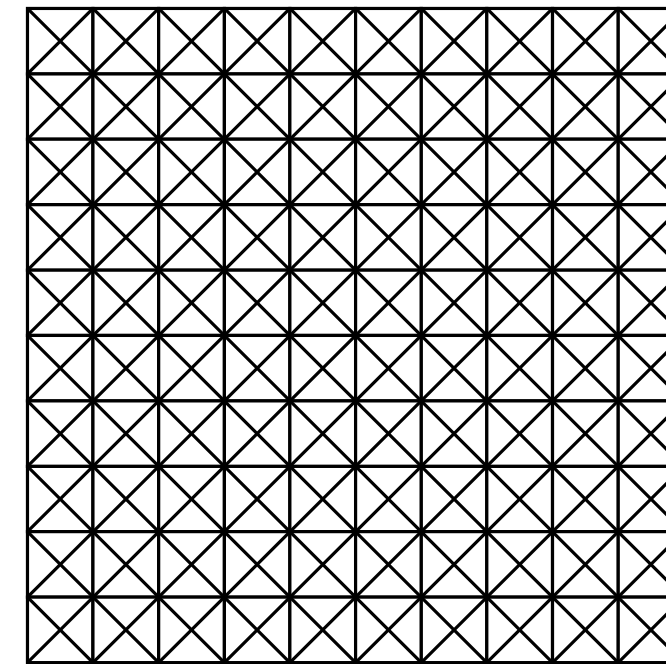


# Finite Element Method (FEM)

$$\Delta u = f$$

$$u = x^4 \approx$$

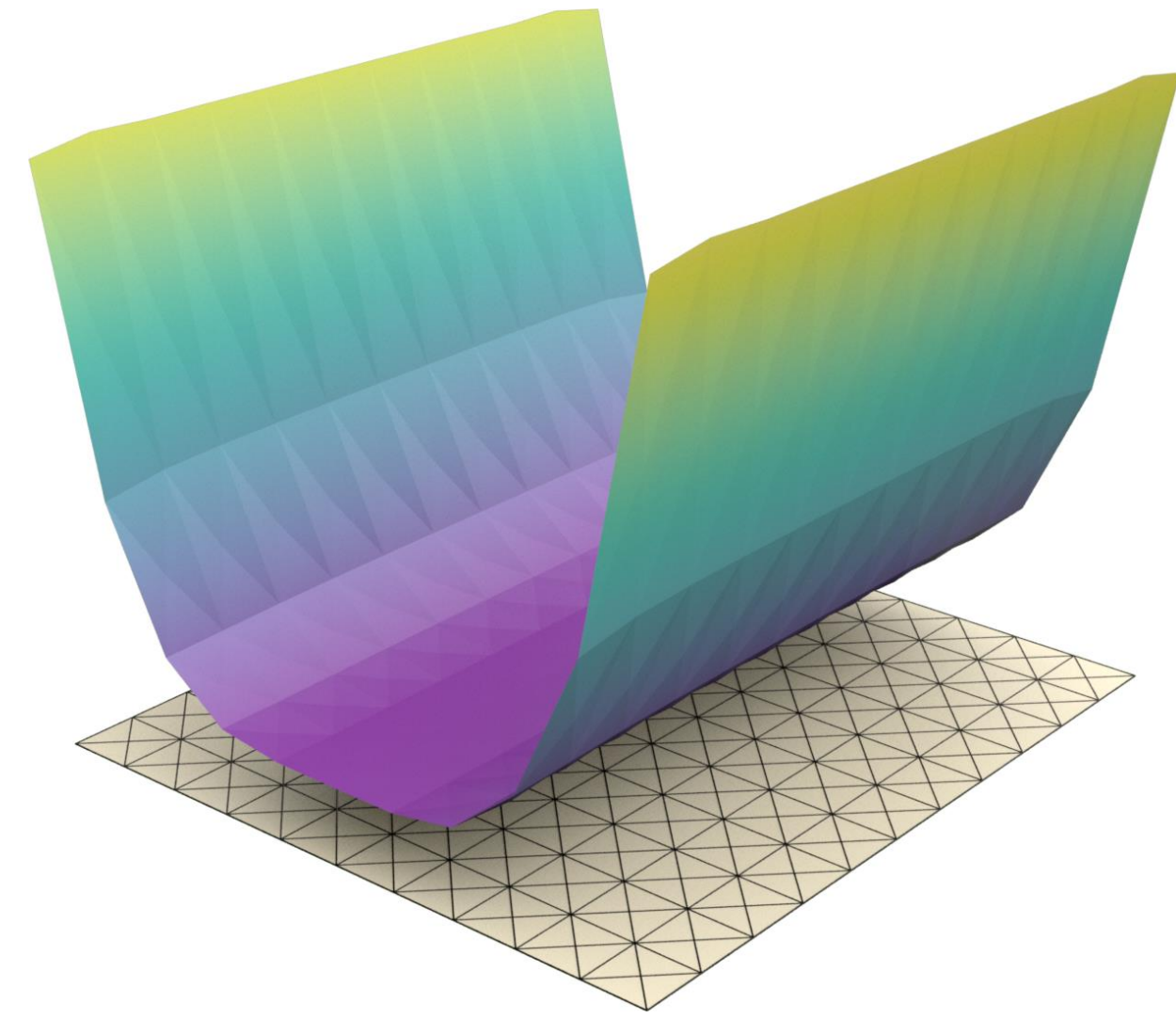
$$U = \sum_{i=1}^n u_i \phi_i$$



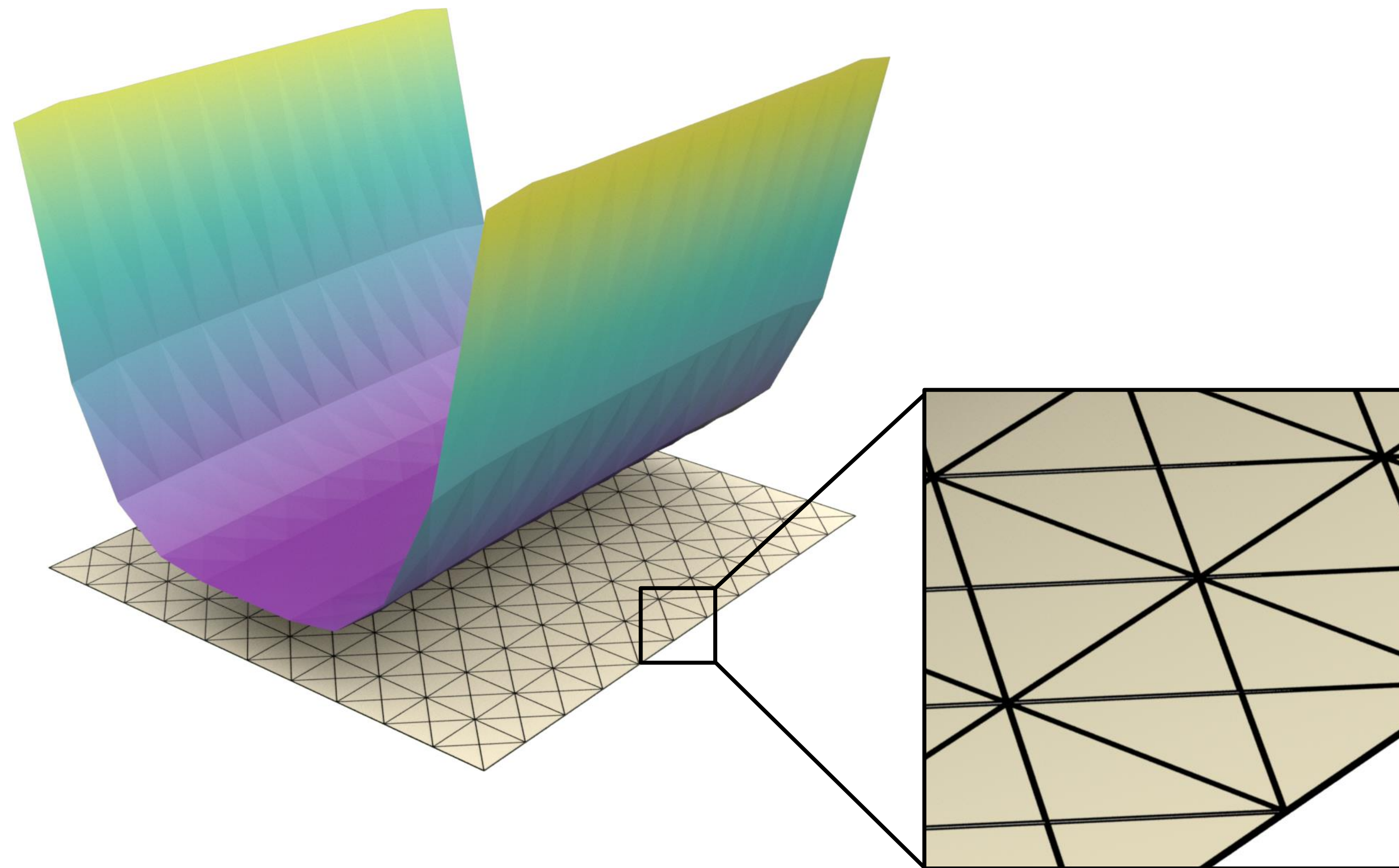
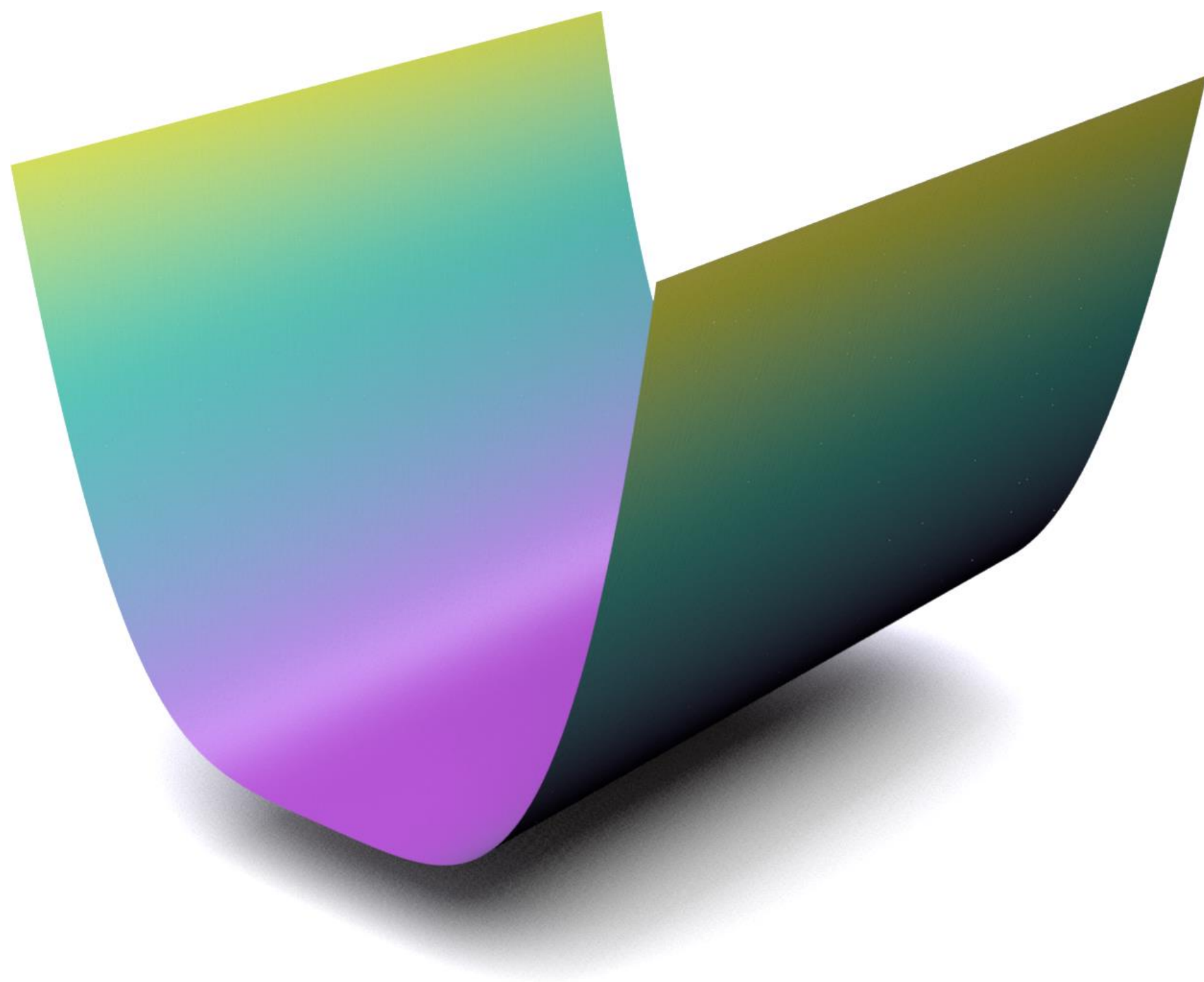


# Three Factors Affect FEM Accuracy

- Mesh resolution
- Basis order
- Element quality

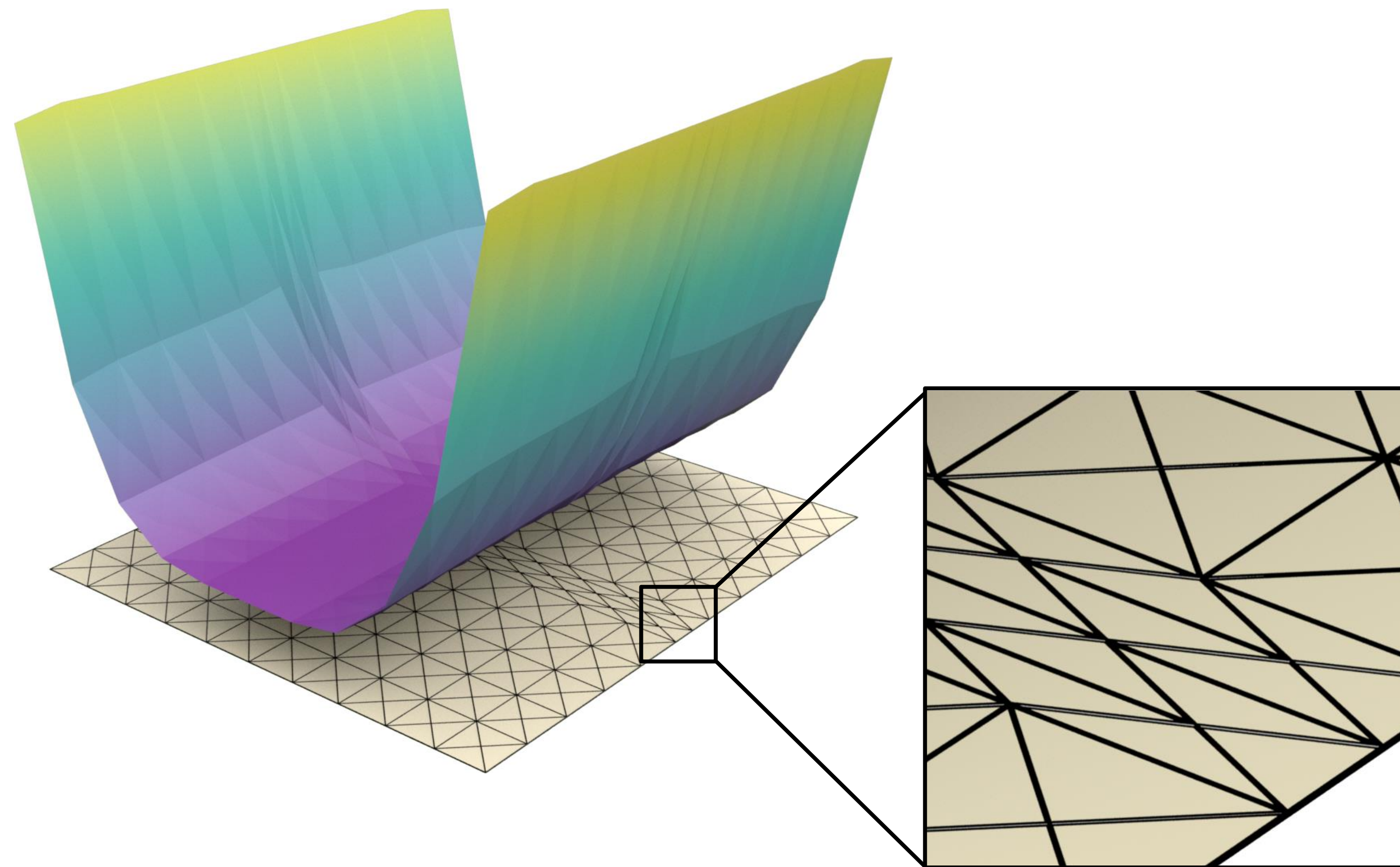
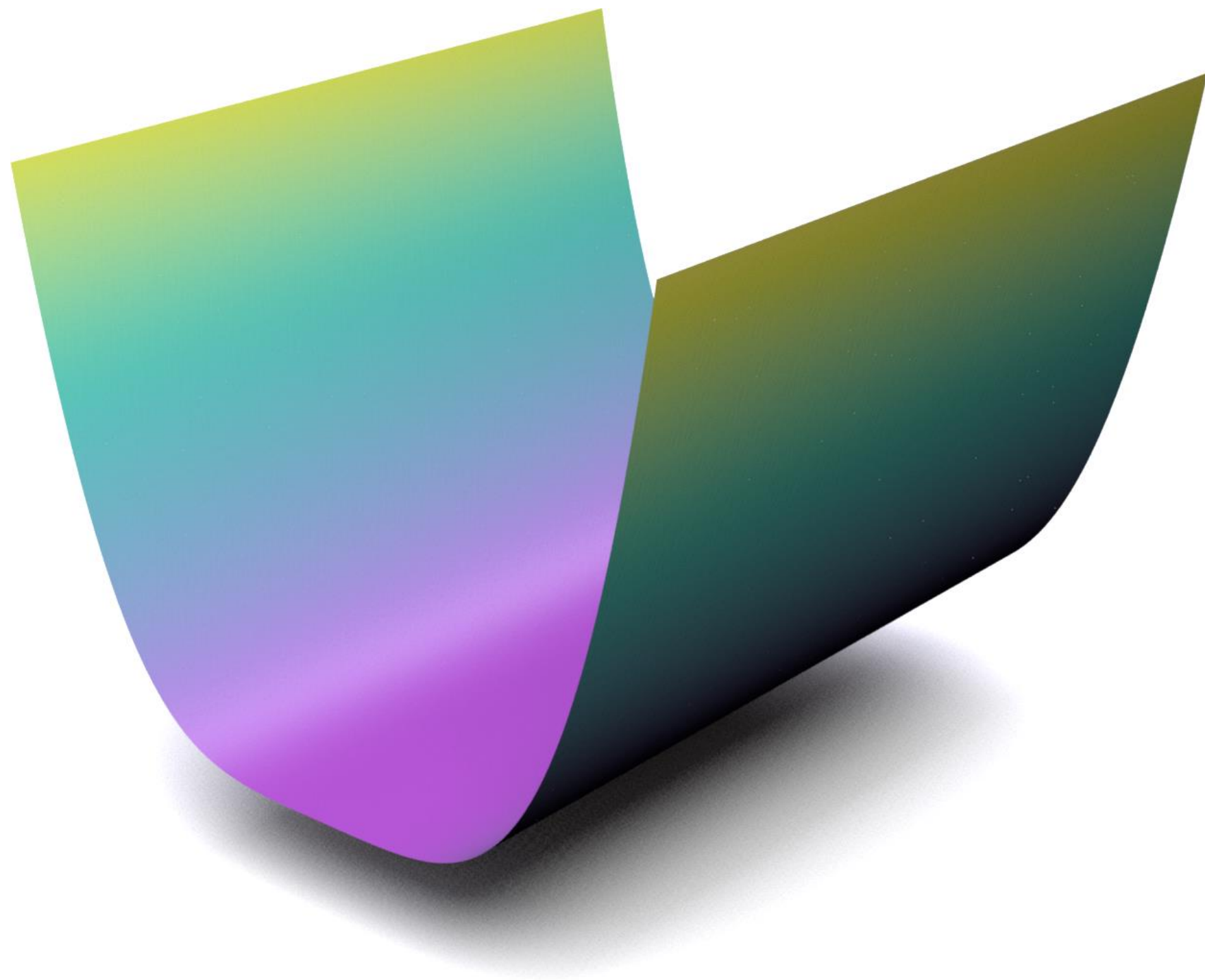


# Quality Matters???



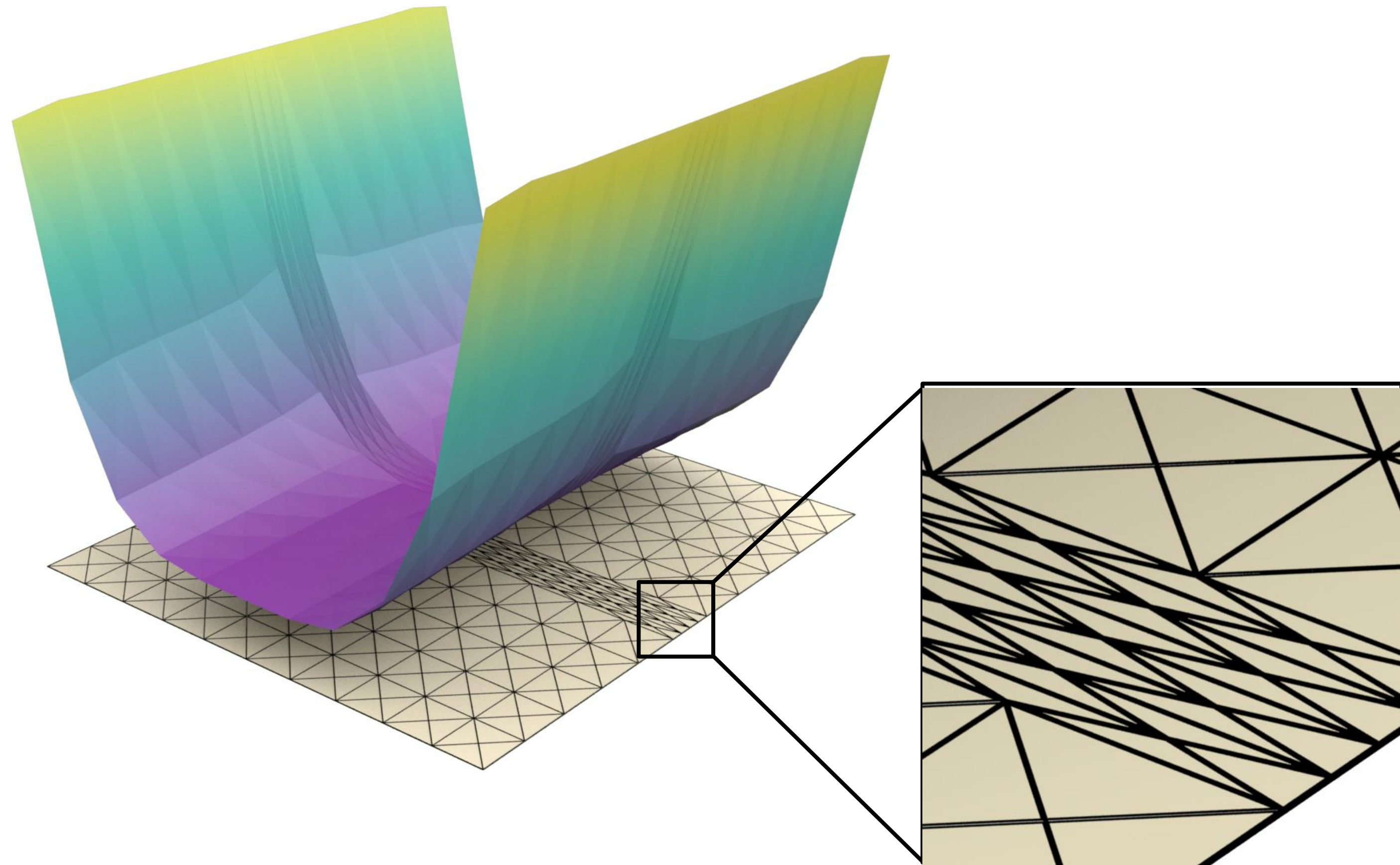
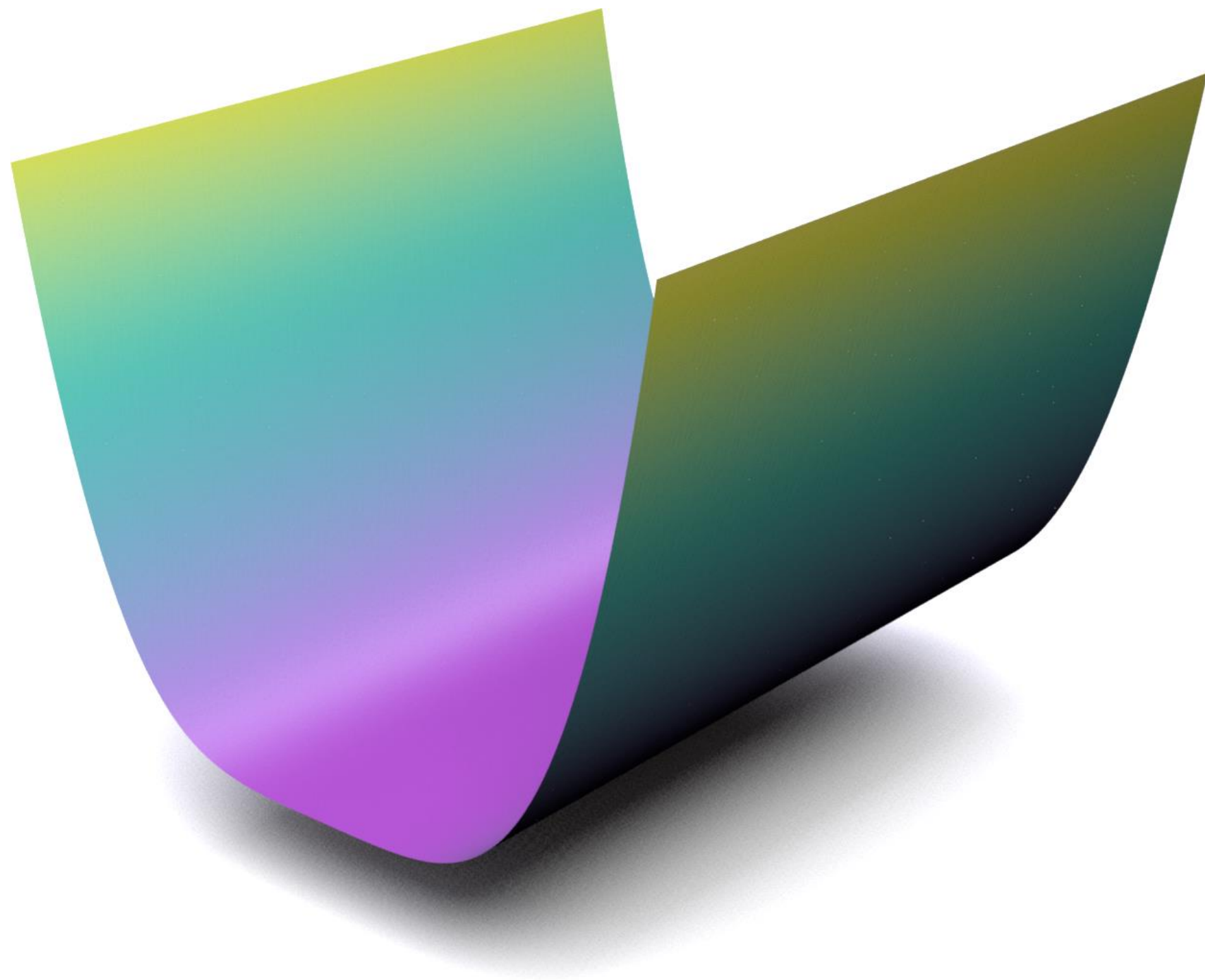


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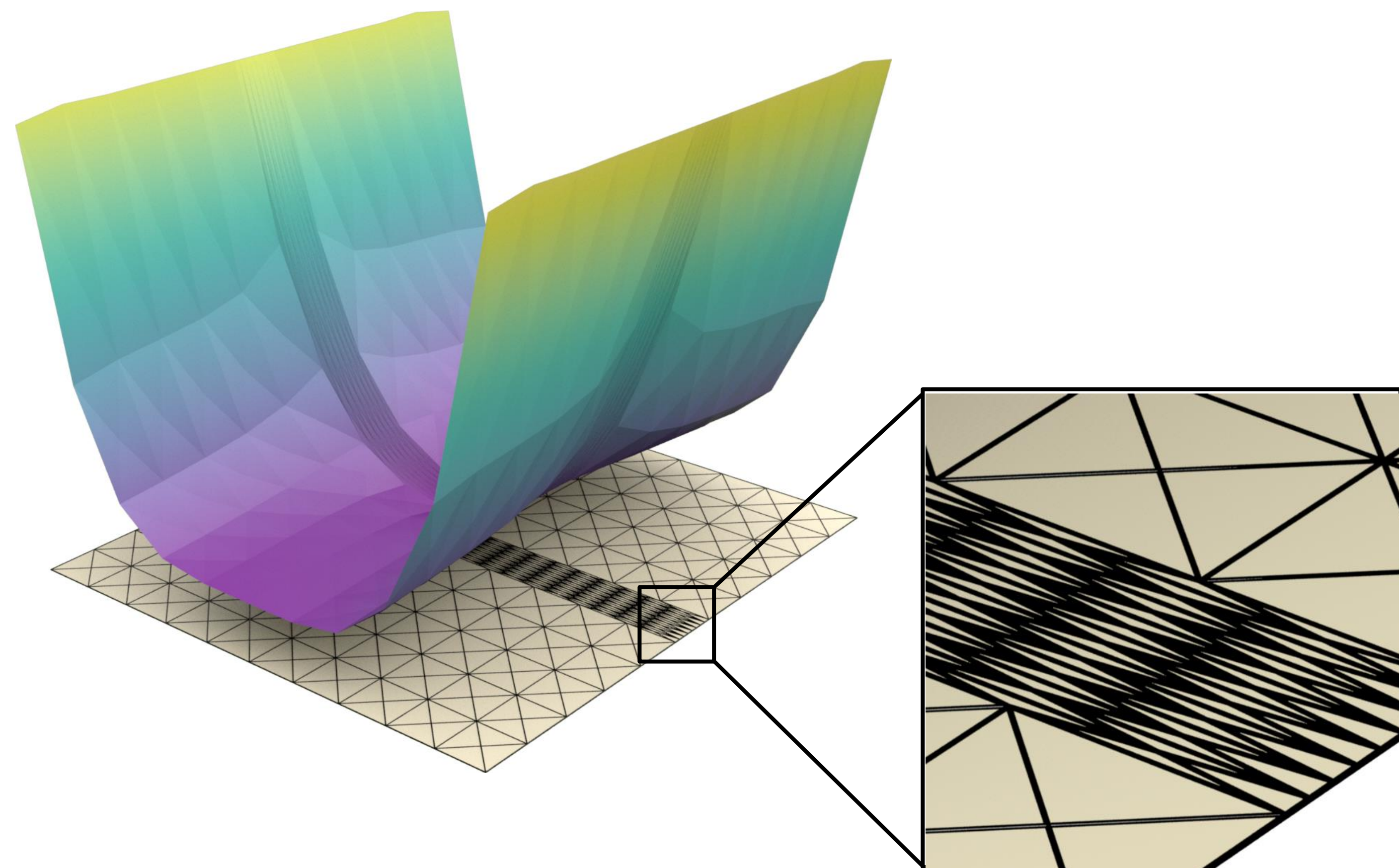
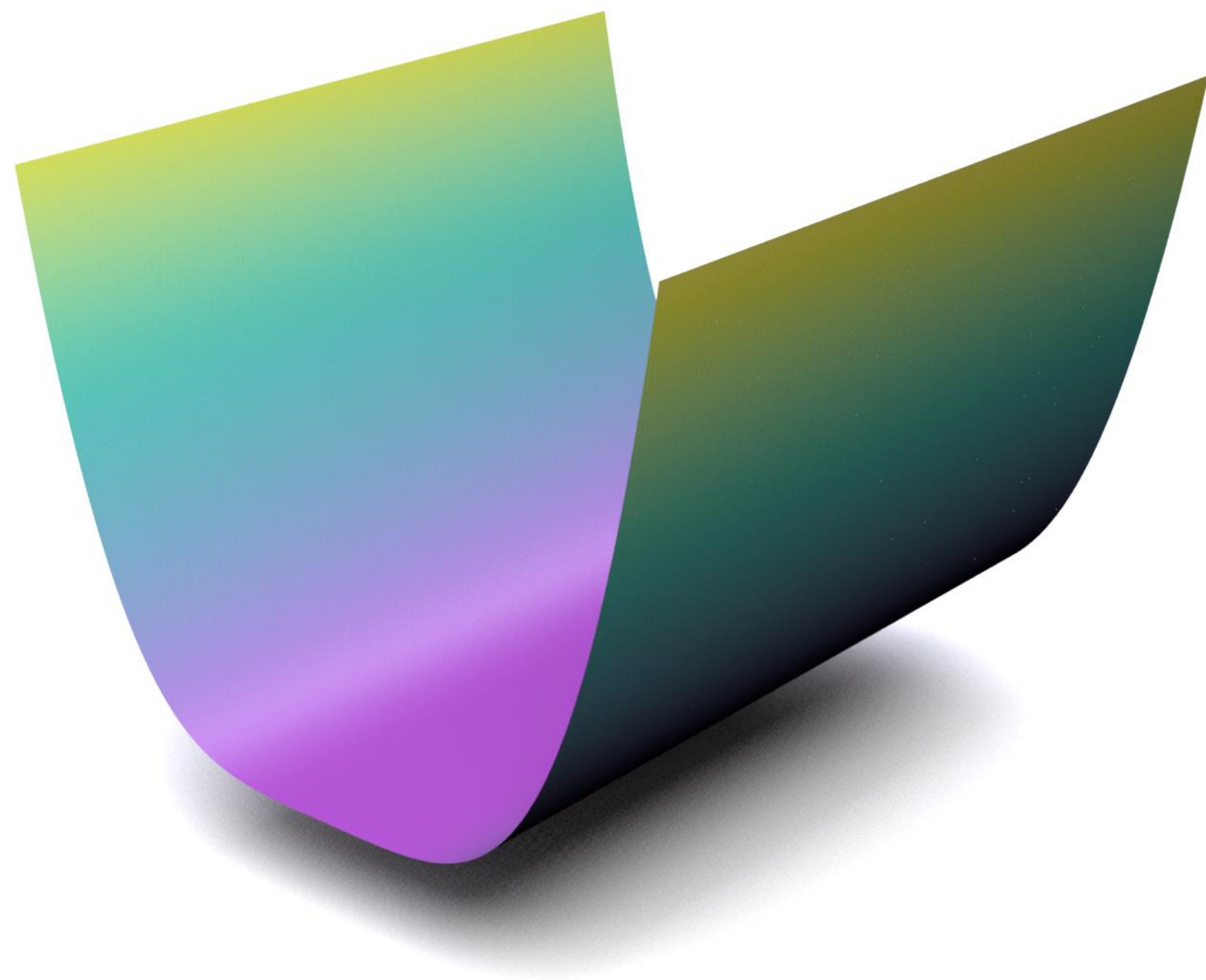


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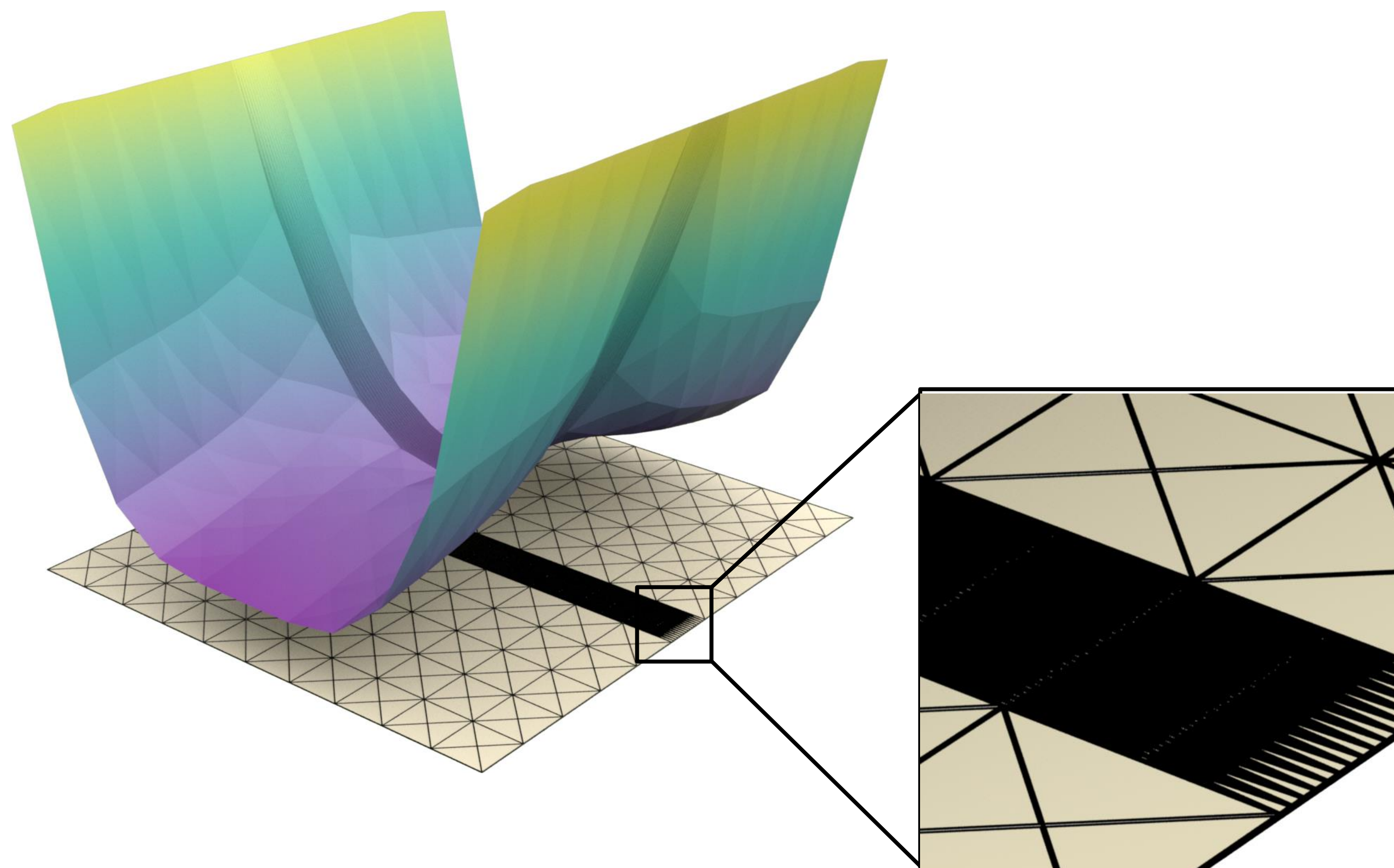
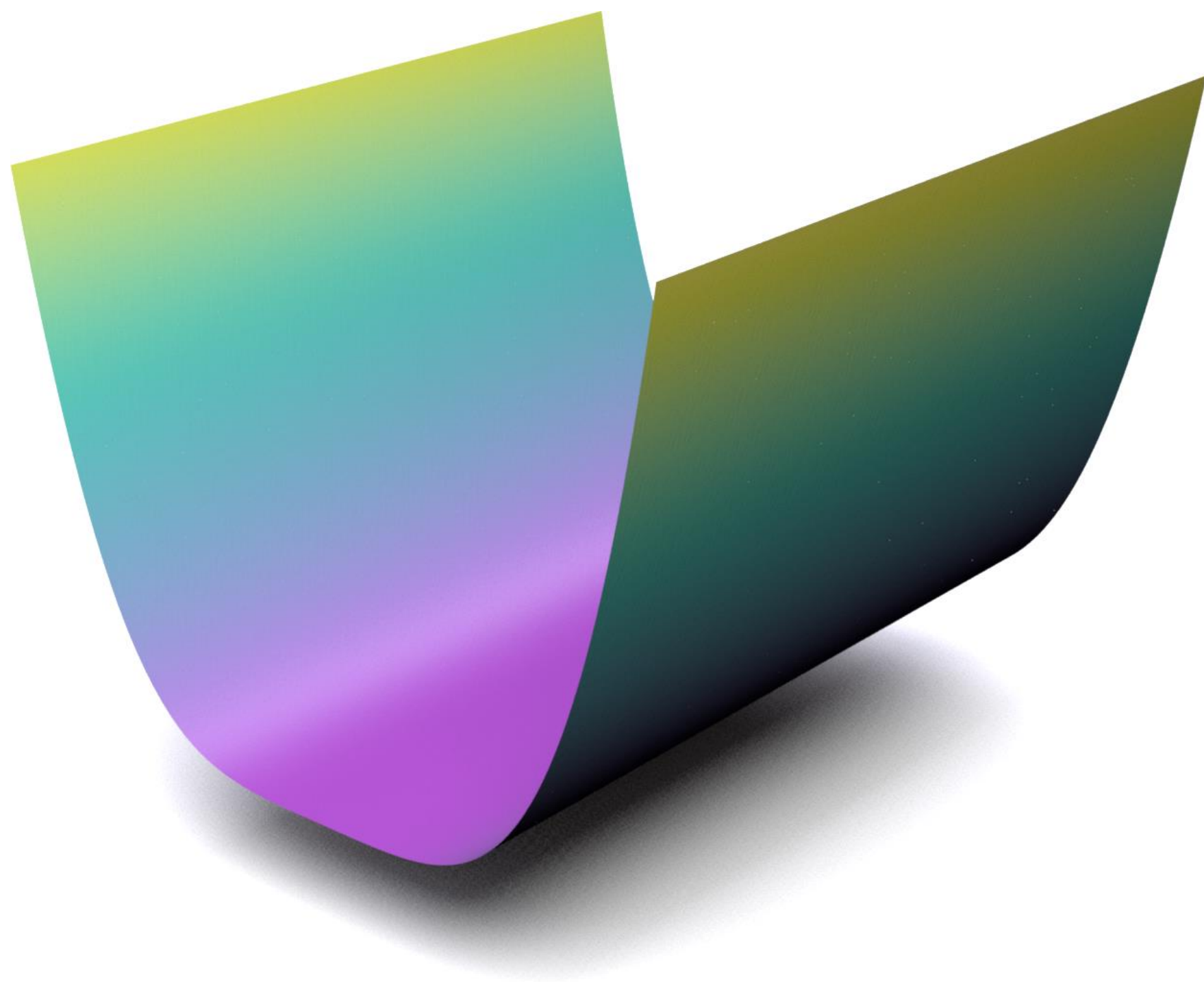


# Quality Matters



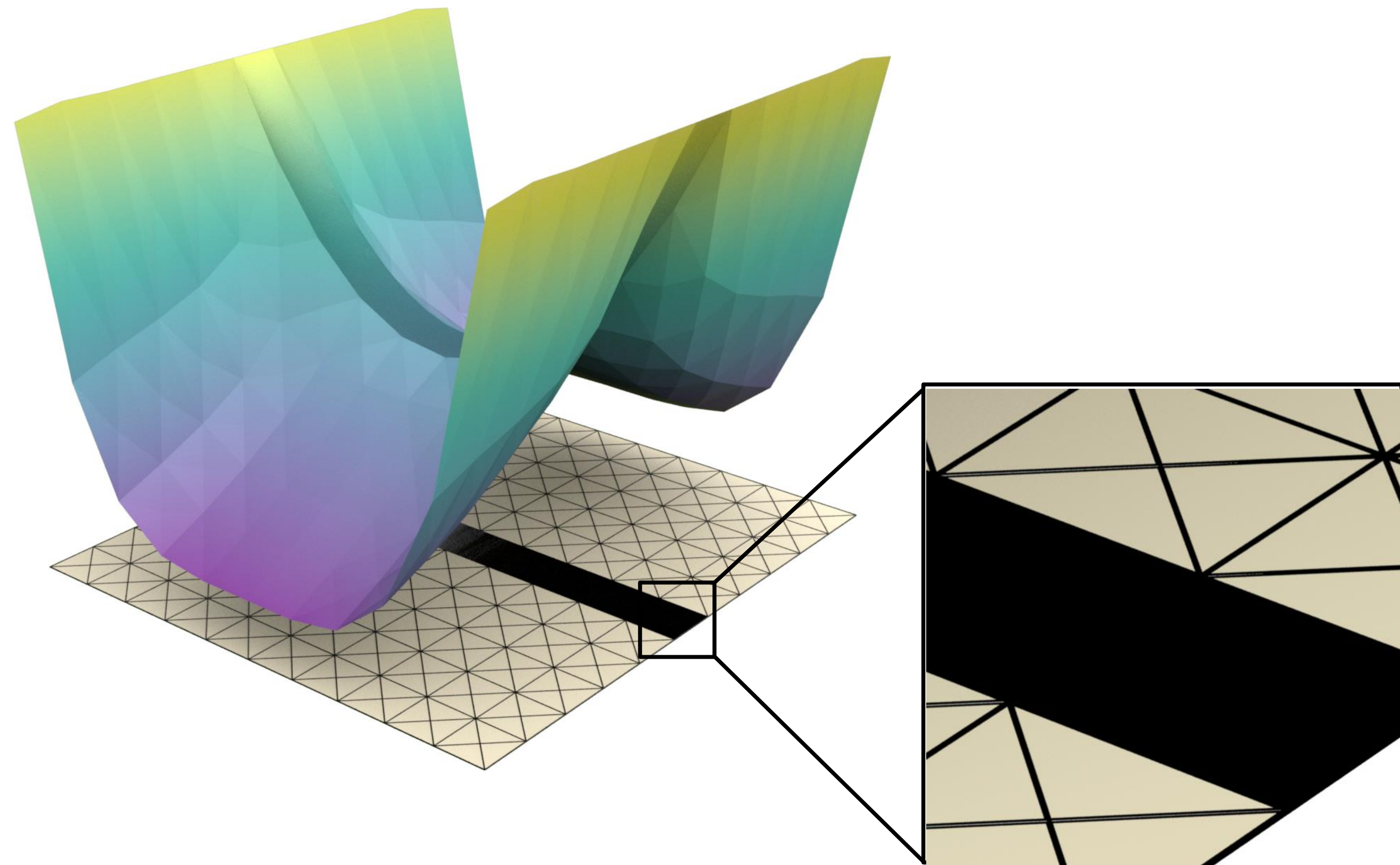
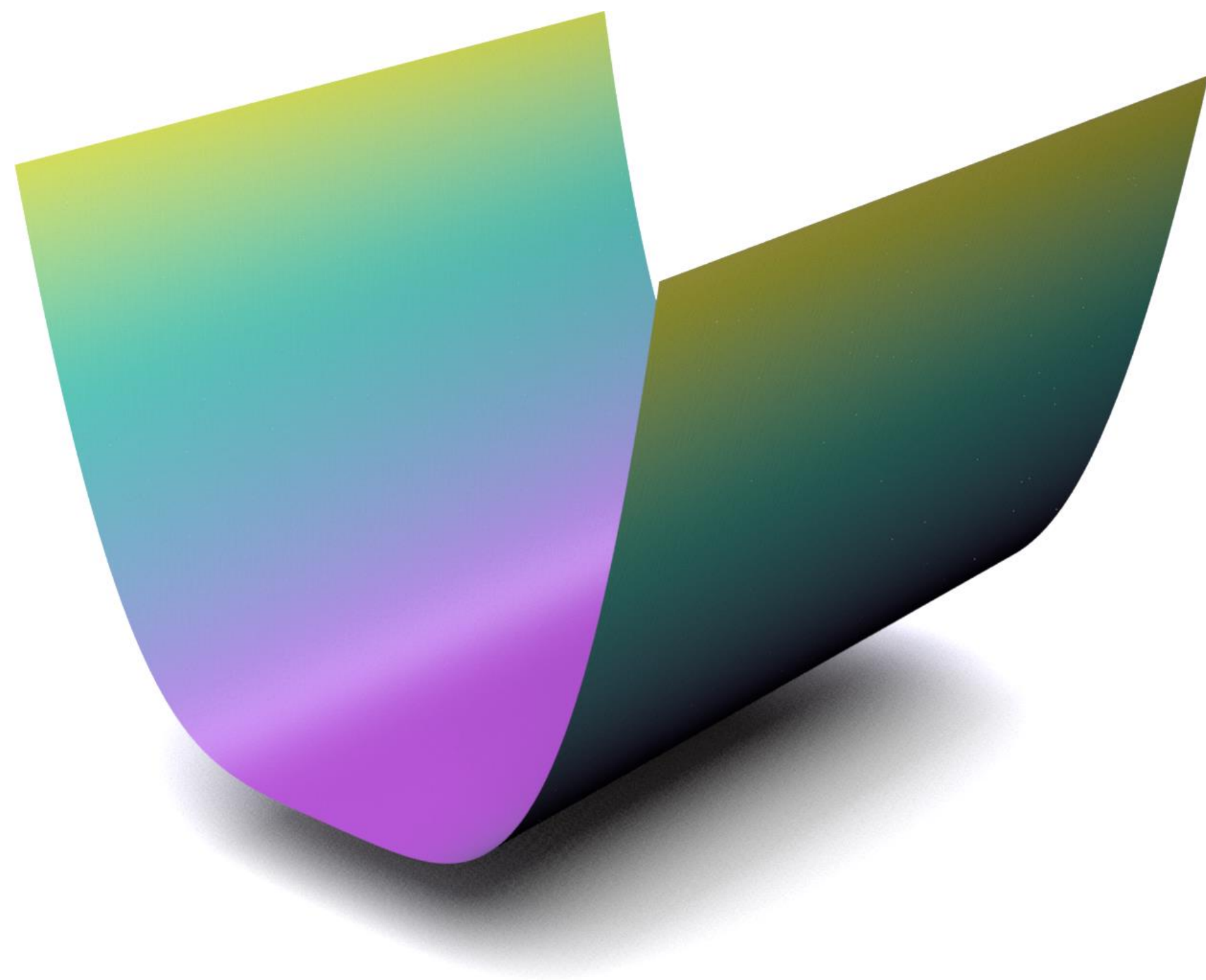


# Quality Matters!



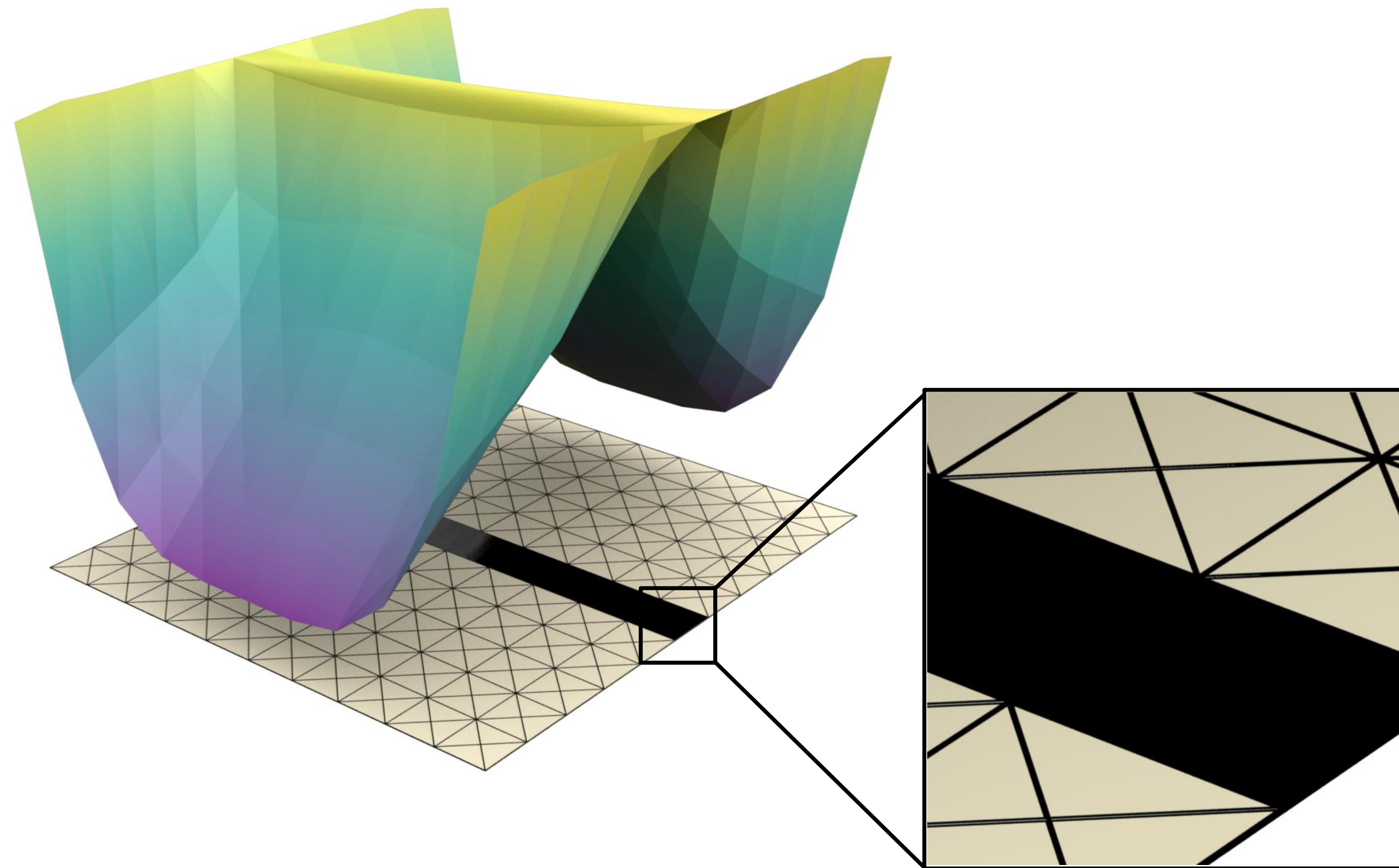
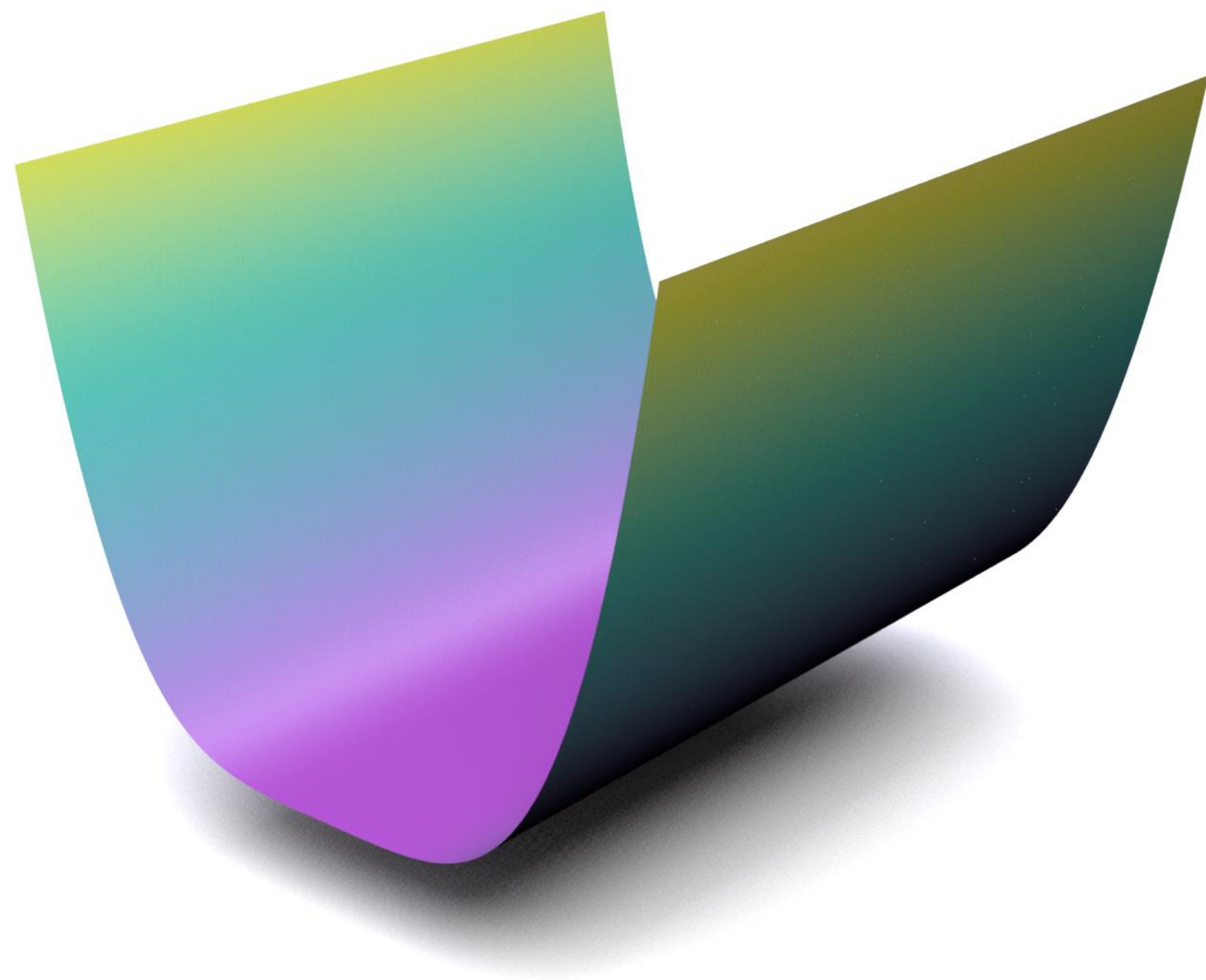


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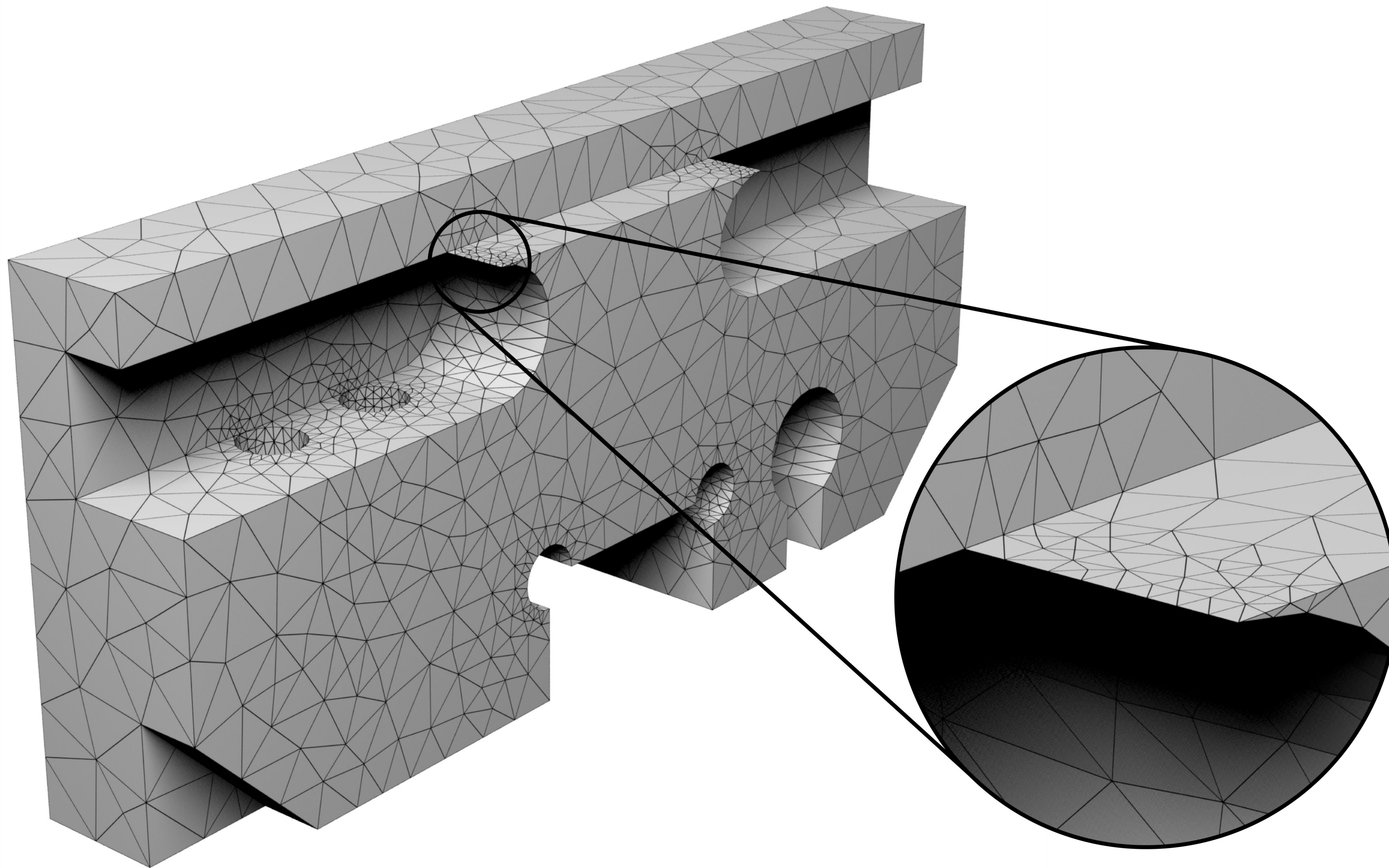




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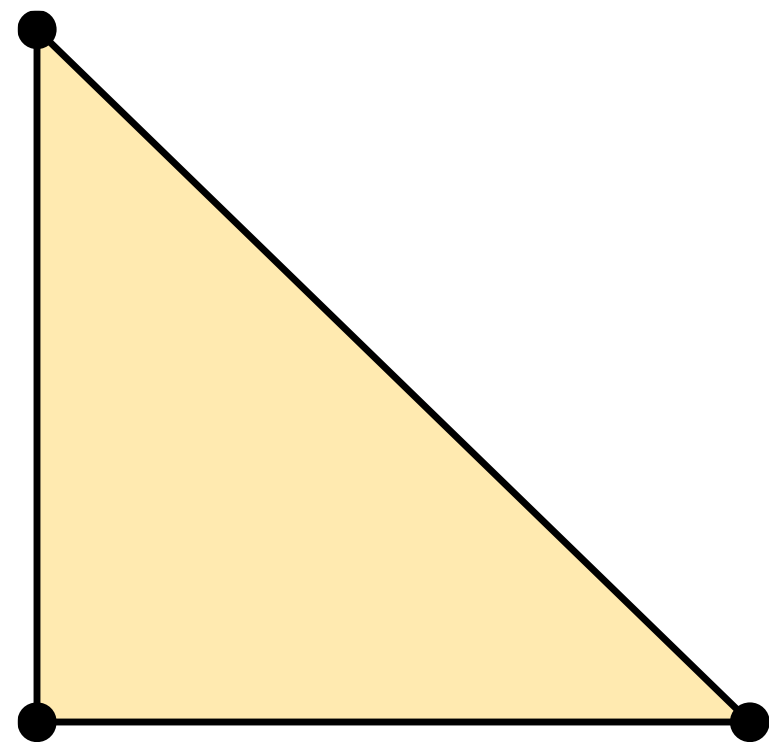




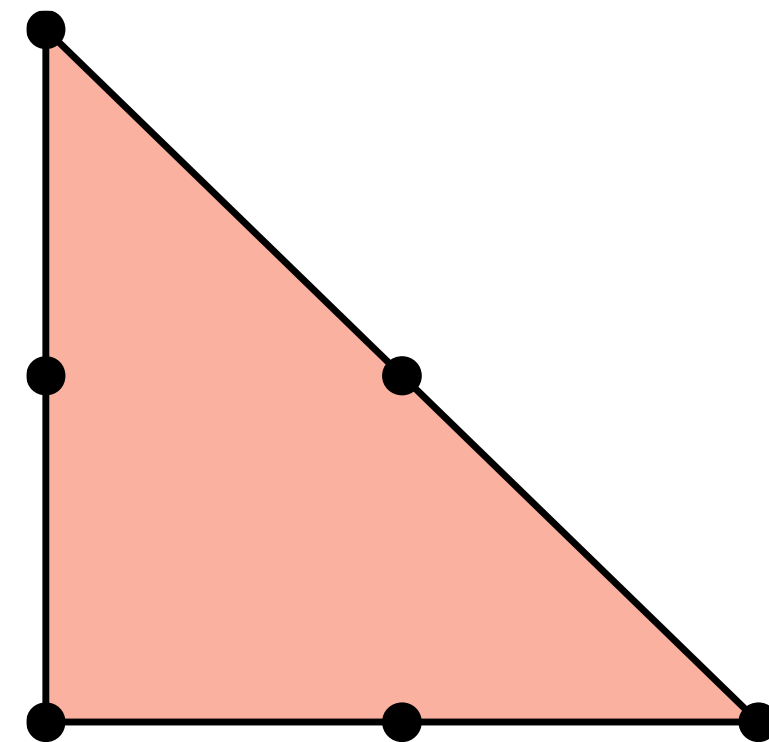




# Our Solution

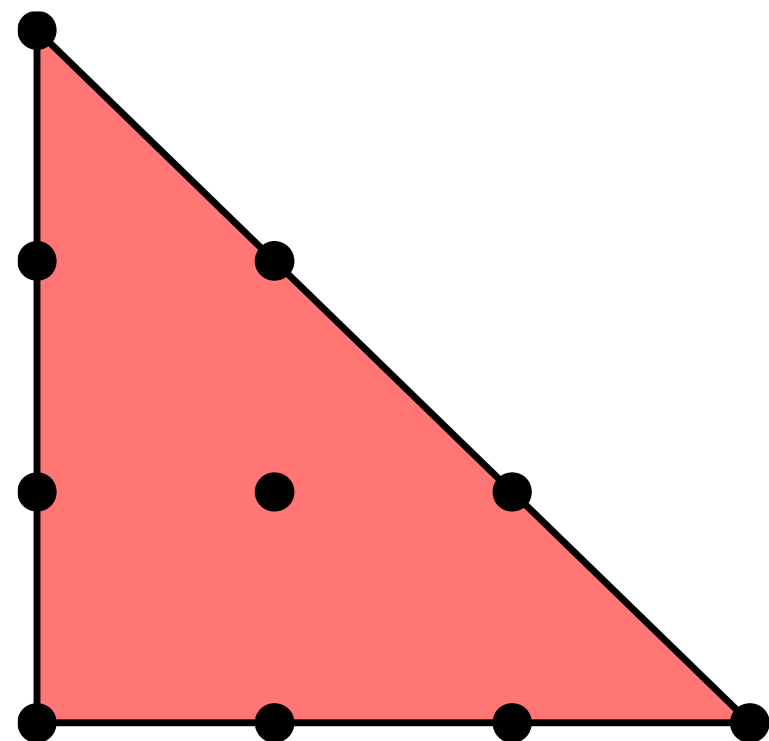


Linear

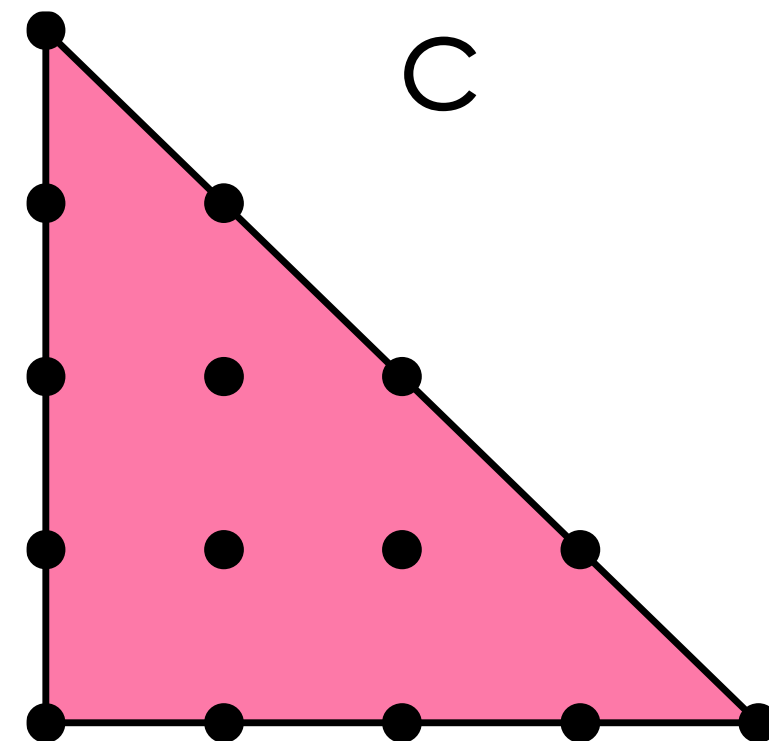


Quadratic

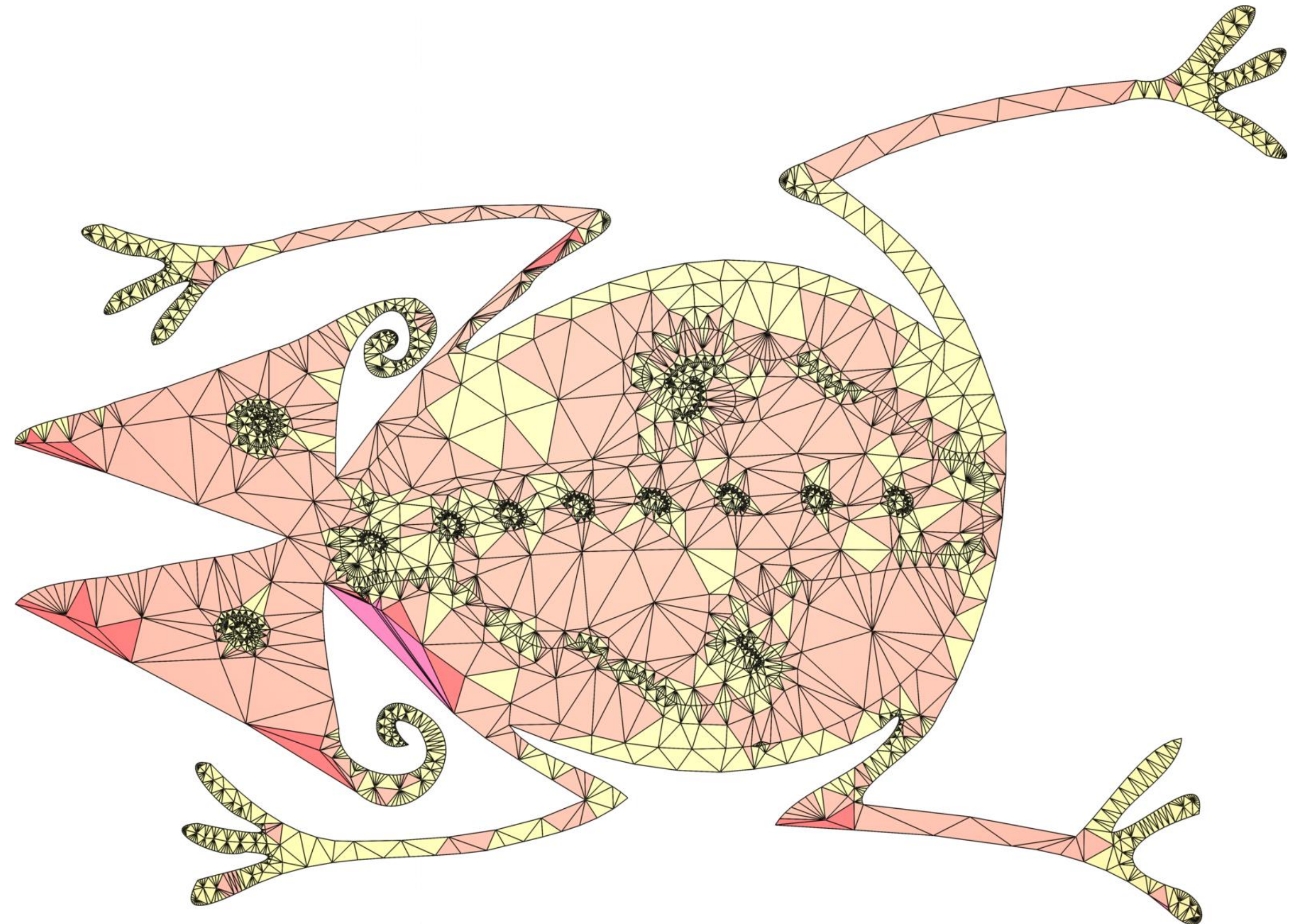
c



Cubic



Quartic





# Posteriori Refinement

- h-refinement [Wu 01], [Simnett 09], [Wicke 10], [Pfaff 14], ...
- p-refinement [Babuška 94], [Kaufmann 13], [Bargteil 14], [Edwards 14], ...

# Priori Refinement

We increase order only based on the input



# Overview

$$k = \frac{\ln \left( B \hat{h}^{\hat{k}+1} \frac{\sigma_E^2}{\hat{\sigma}^2} \right) - \ln h_E}{\ln h_E}$$

1. Use formula



## Order of an element

$$\boxed{k} = \frac{\ln \left( B \hat{h}^{\hat{k}+1} \frac{\sigma_E^2}{\hat{\sigma}^2} \right) - \ln h_E}{\ln h_E}$$



User parameter, = 3

$$k = \frac{\ln \left( B \hat{h}^{\hat{k}+1} \frac{\sigma_E^2}{\hat{\sigma}^2} \right) - \ln h_E}{\ln h_E}$$

Average edge length

$$k = \frac{\ln \left( B \hat{h}^{\hat{k}+1} \frac{\sigma_E^2}{\hat{\sigma}^2} \right) - \ln h_E}{\ln h_E}$$



Base order, usually 1

$$k = \frac{\ln \left( B \hat{h}^{\hat{k}+1} \frac{\sigma_E^2}{\hat{\sigma}^2} \right) - \ln h_E}{\ln h_E}$$

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$$\hat{\sigma}_{2D} = \sqrt{3}/6$$

$$\hat{\sigma}_{3D} = \sqrt{6}/12$$

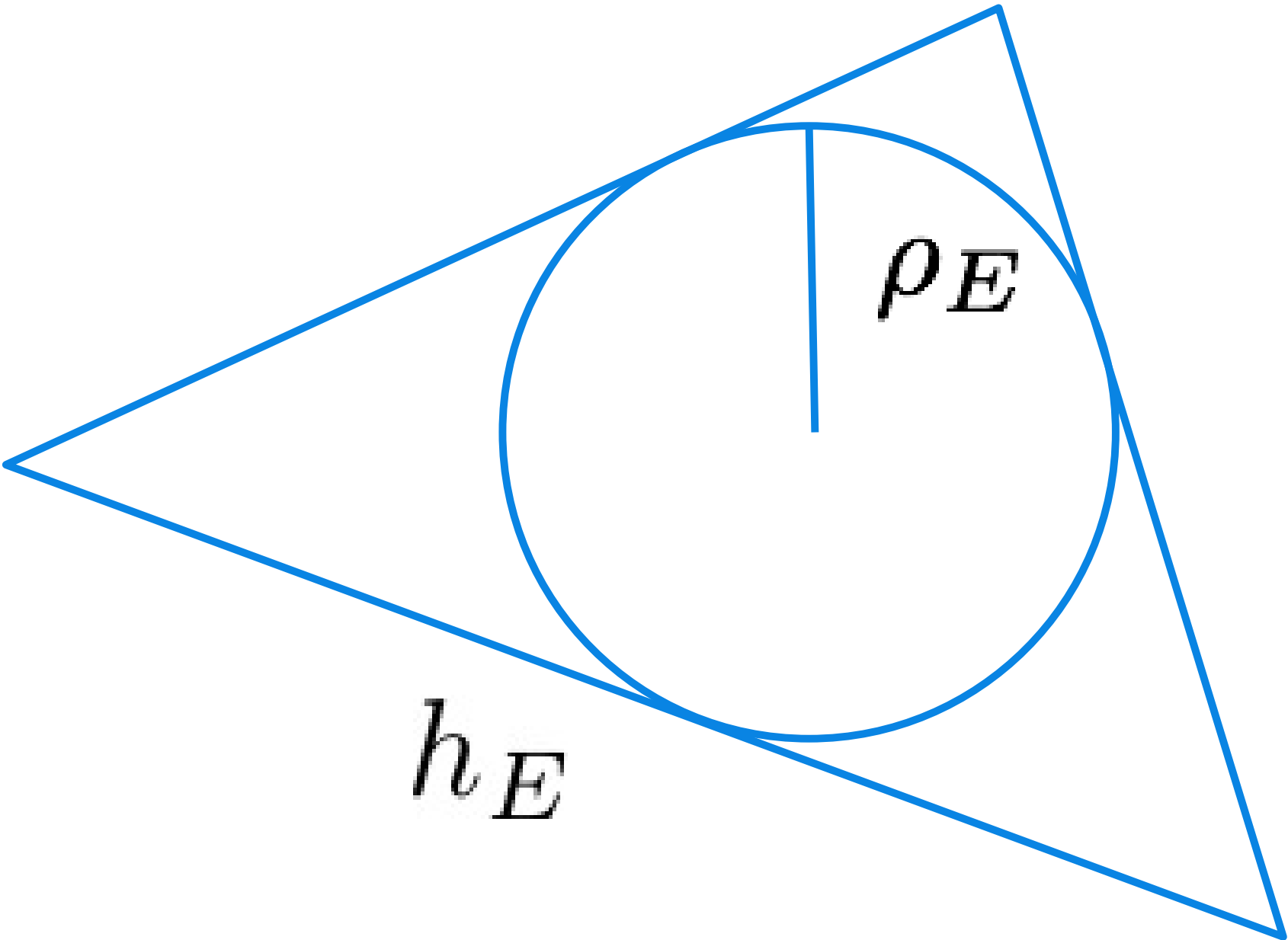


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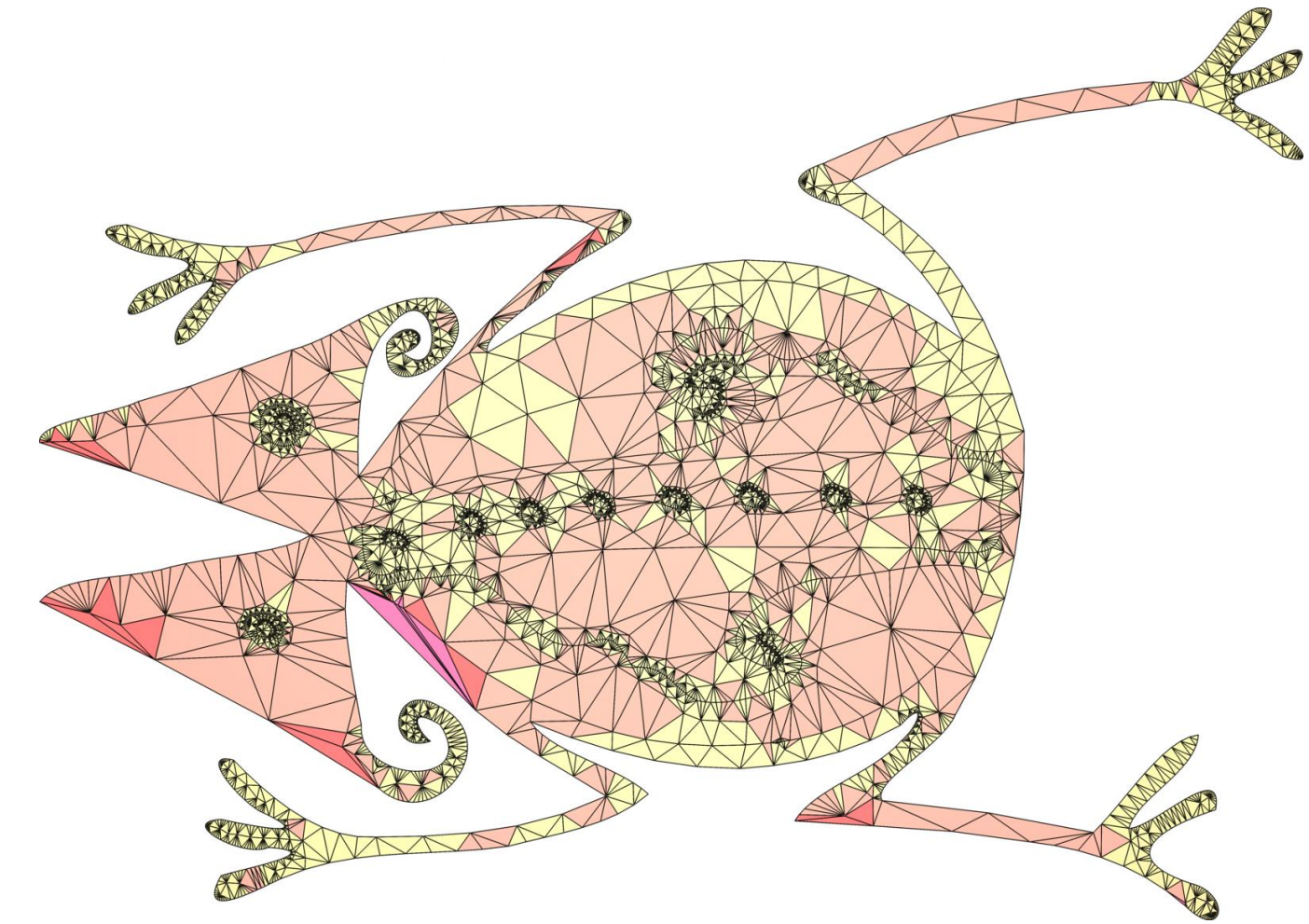
$$\sigma_E = \frac{\rho_E}{h_E}$$



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1. Use formula




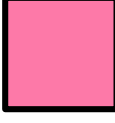


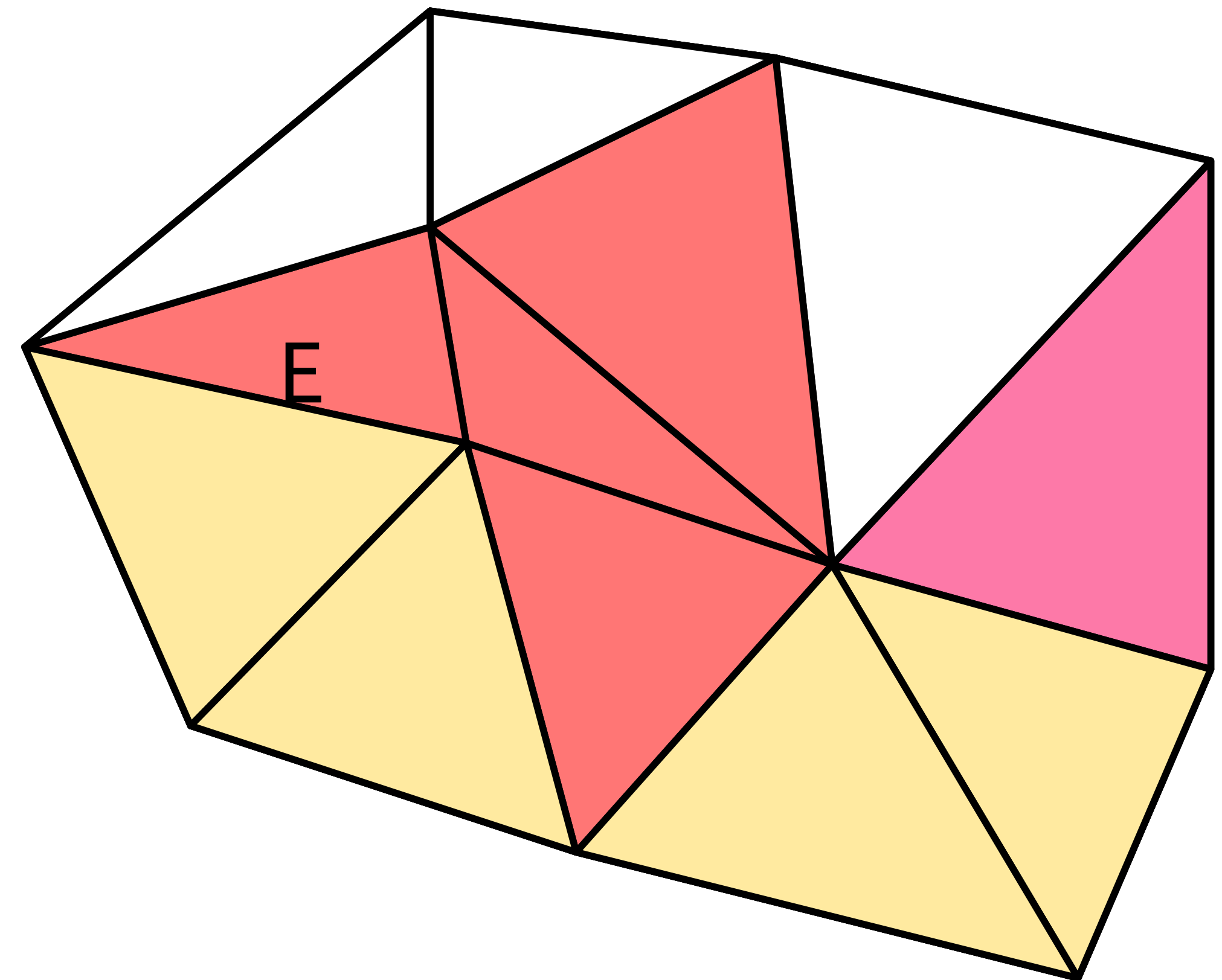
2. Propagate degrees



# Degree Propagation

- For each element  $E$
- Compute  $k_E$  using formula
- Increase the order (if necessary) of:
  - The element  $E$
  - All edge/face neighbors

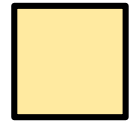
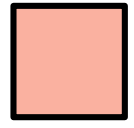
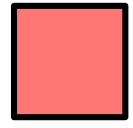
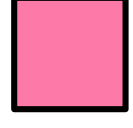
  $P_1$    $P_2$    $P_3$    $P_4$

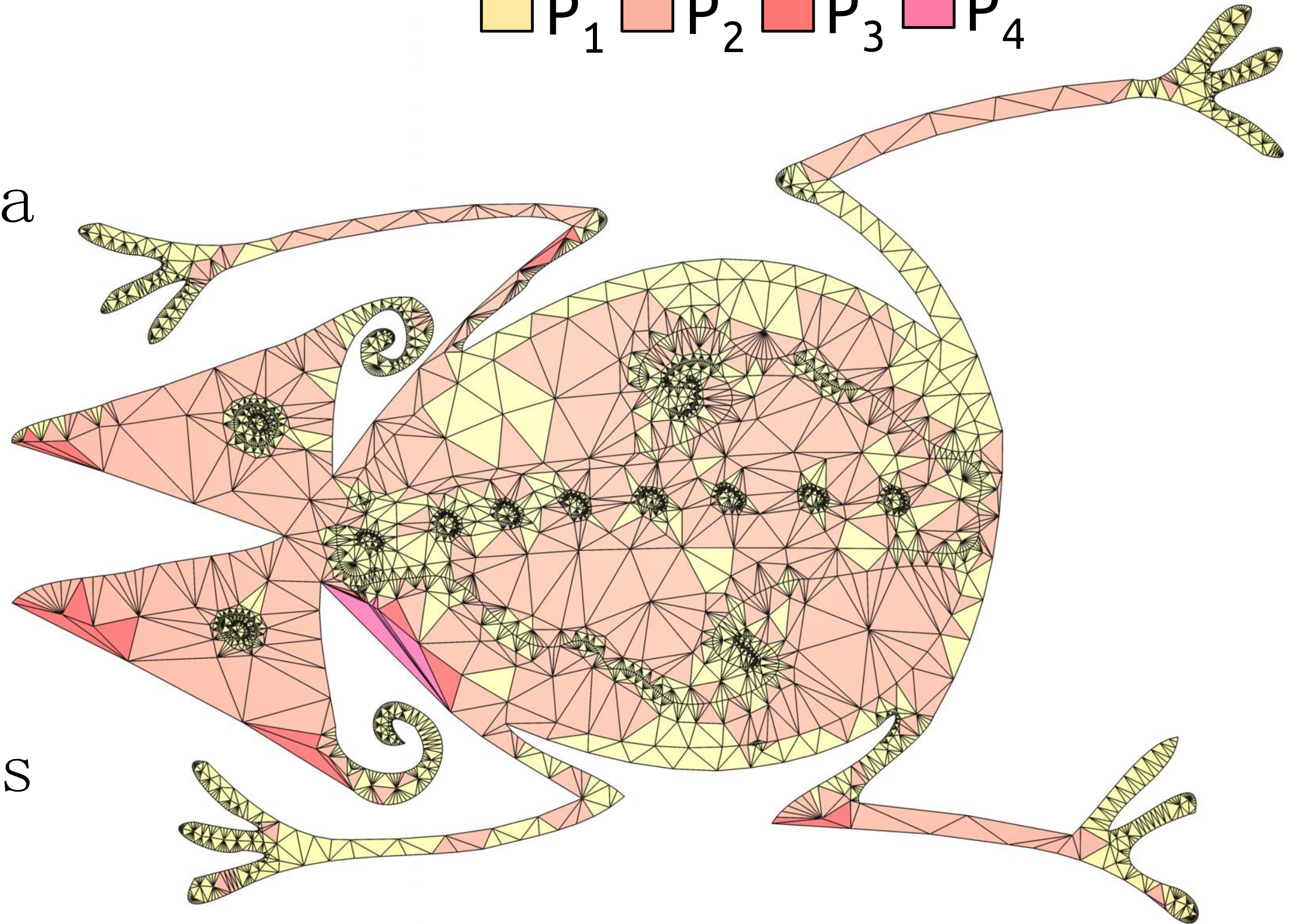




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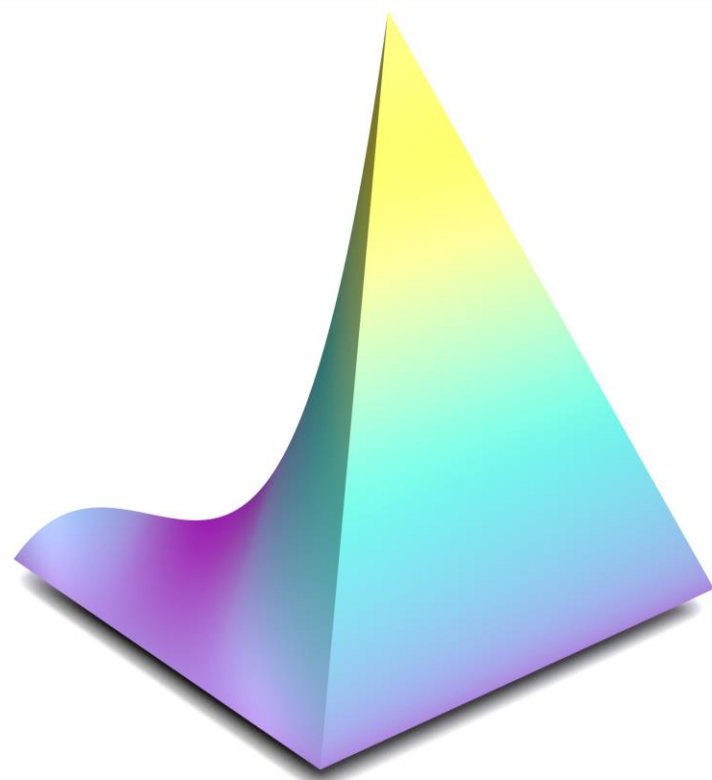




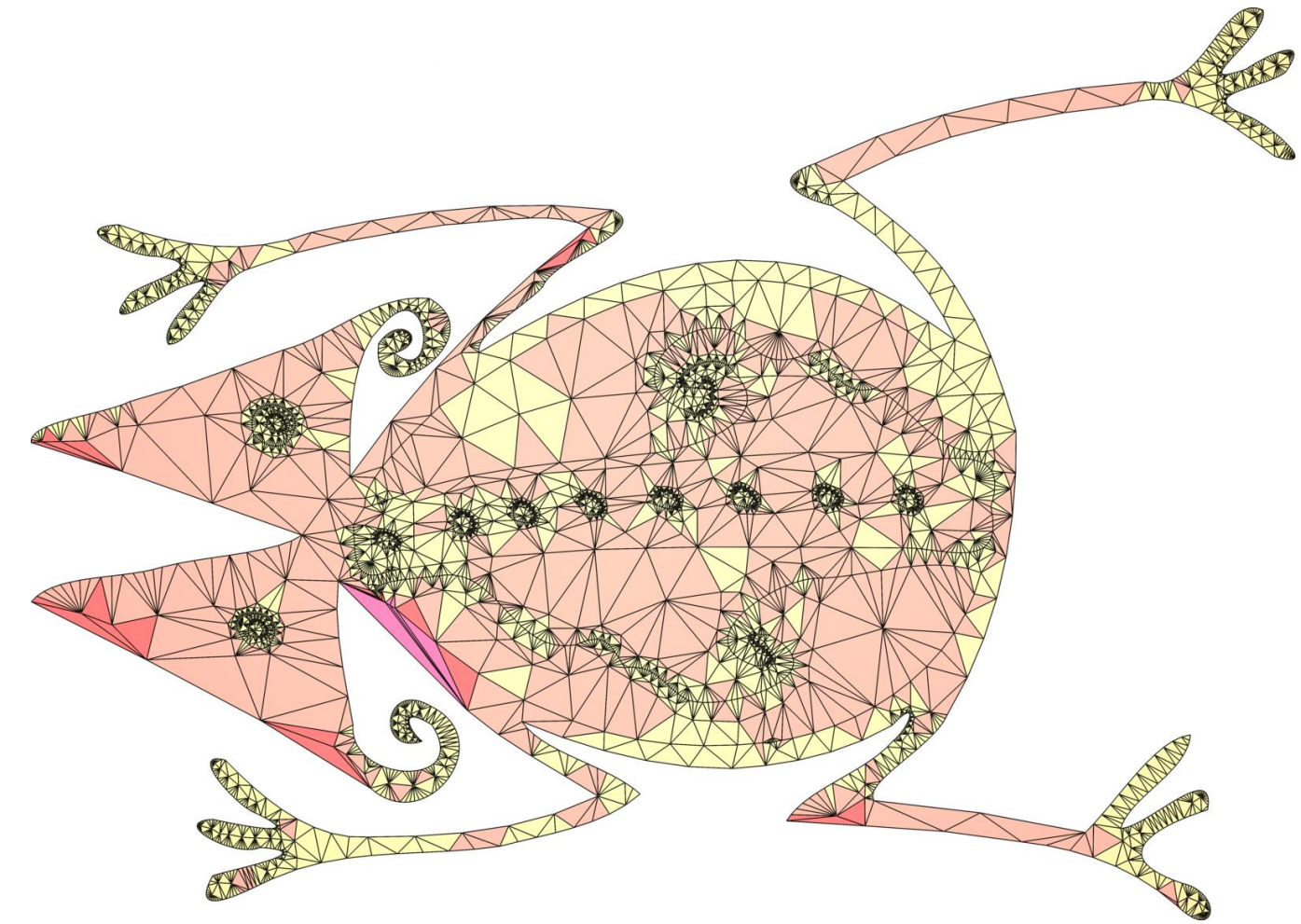
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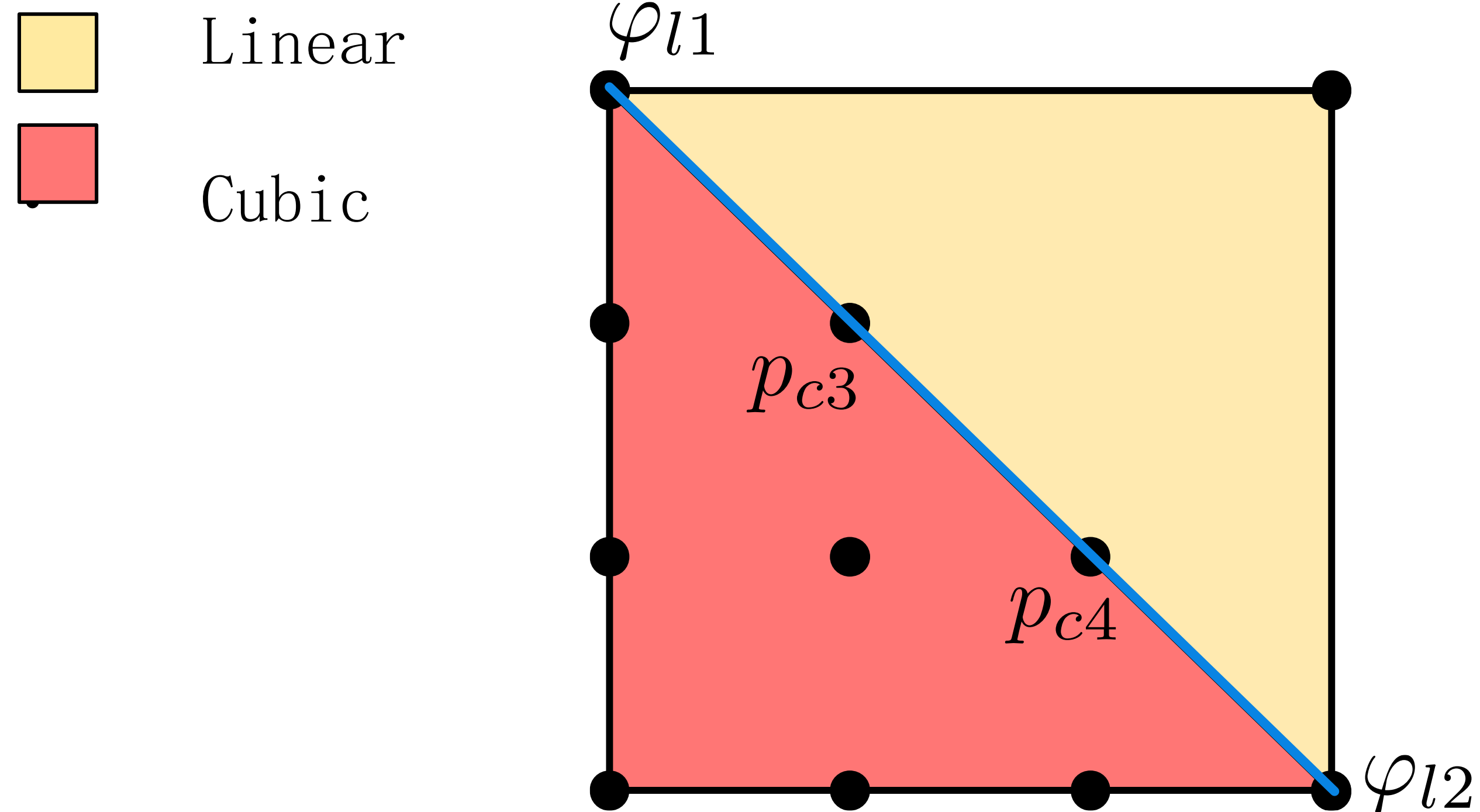


3. Construct  $C^0$  basis



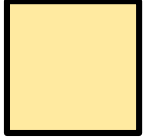
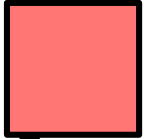
2. Propagate degrees

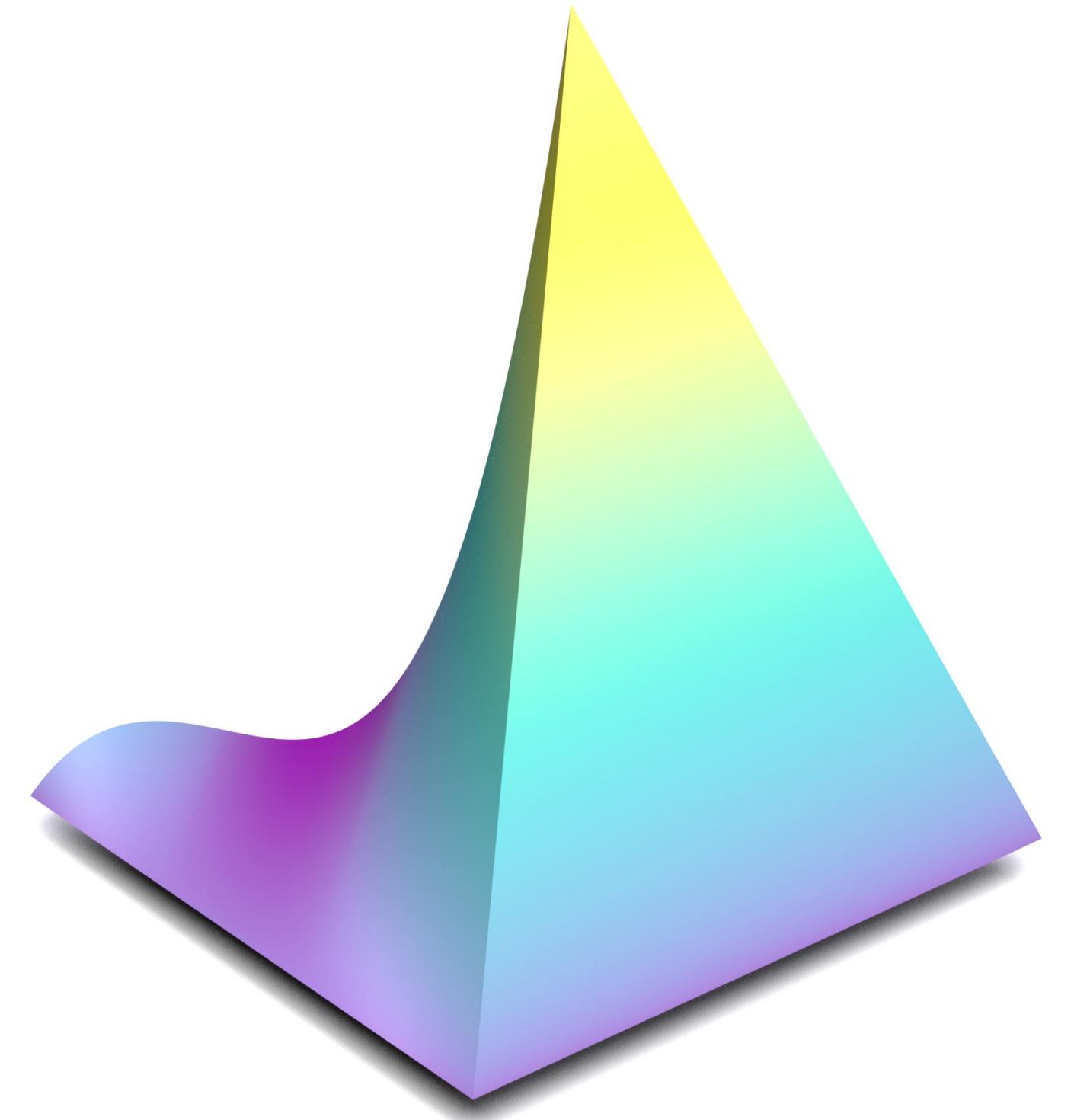
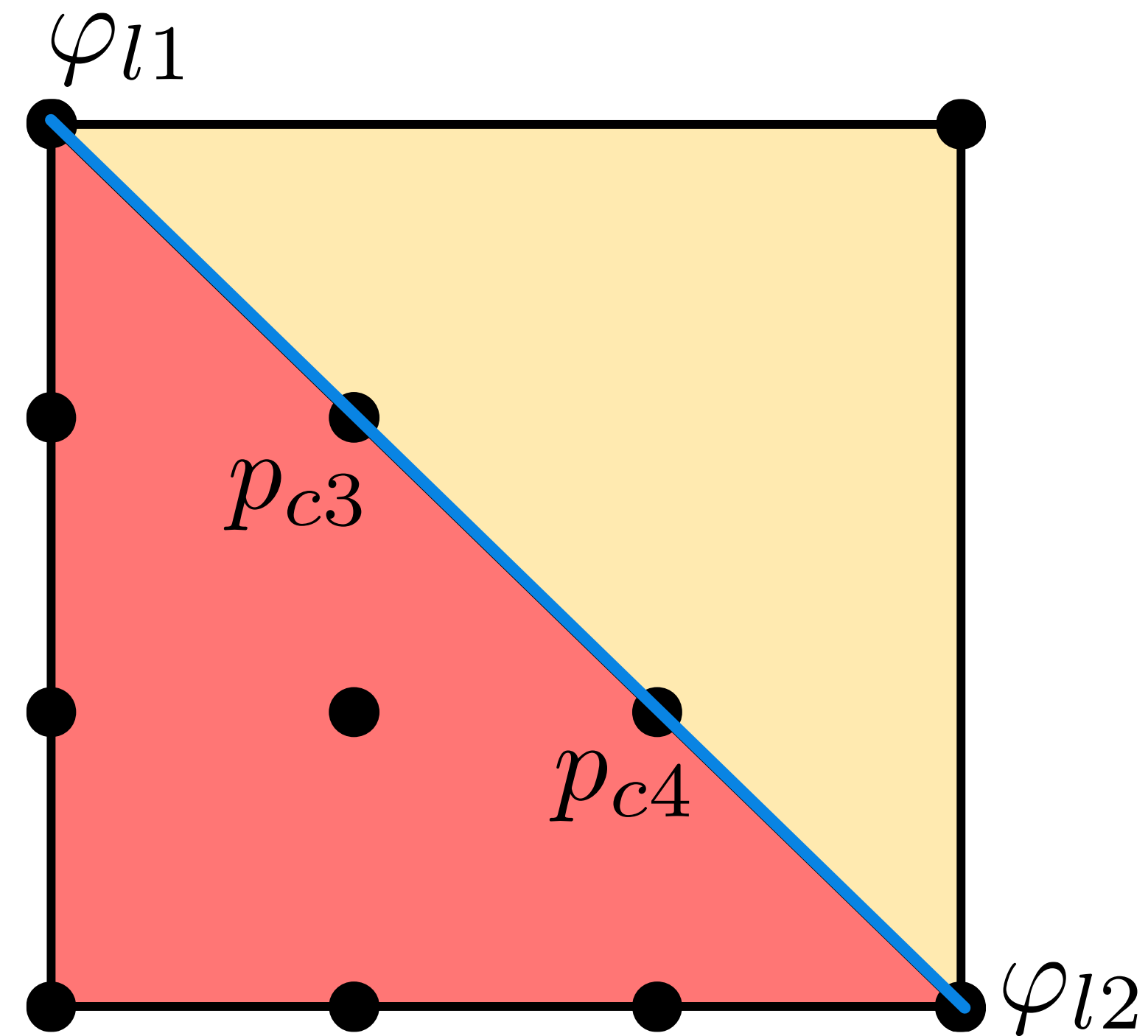
# Building Continuous Basis





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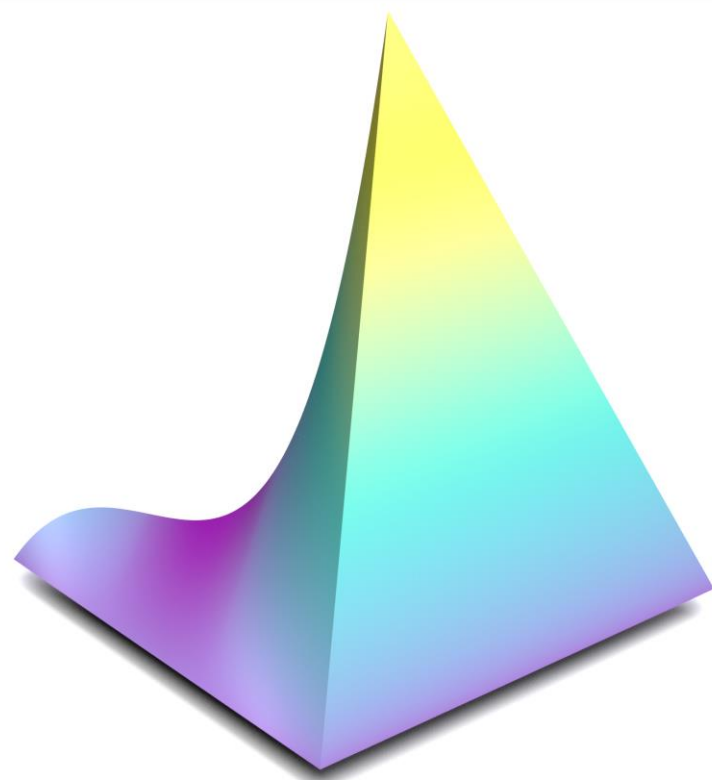
 Linear  
 Cubic



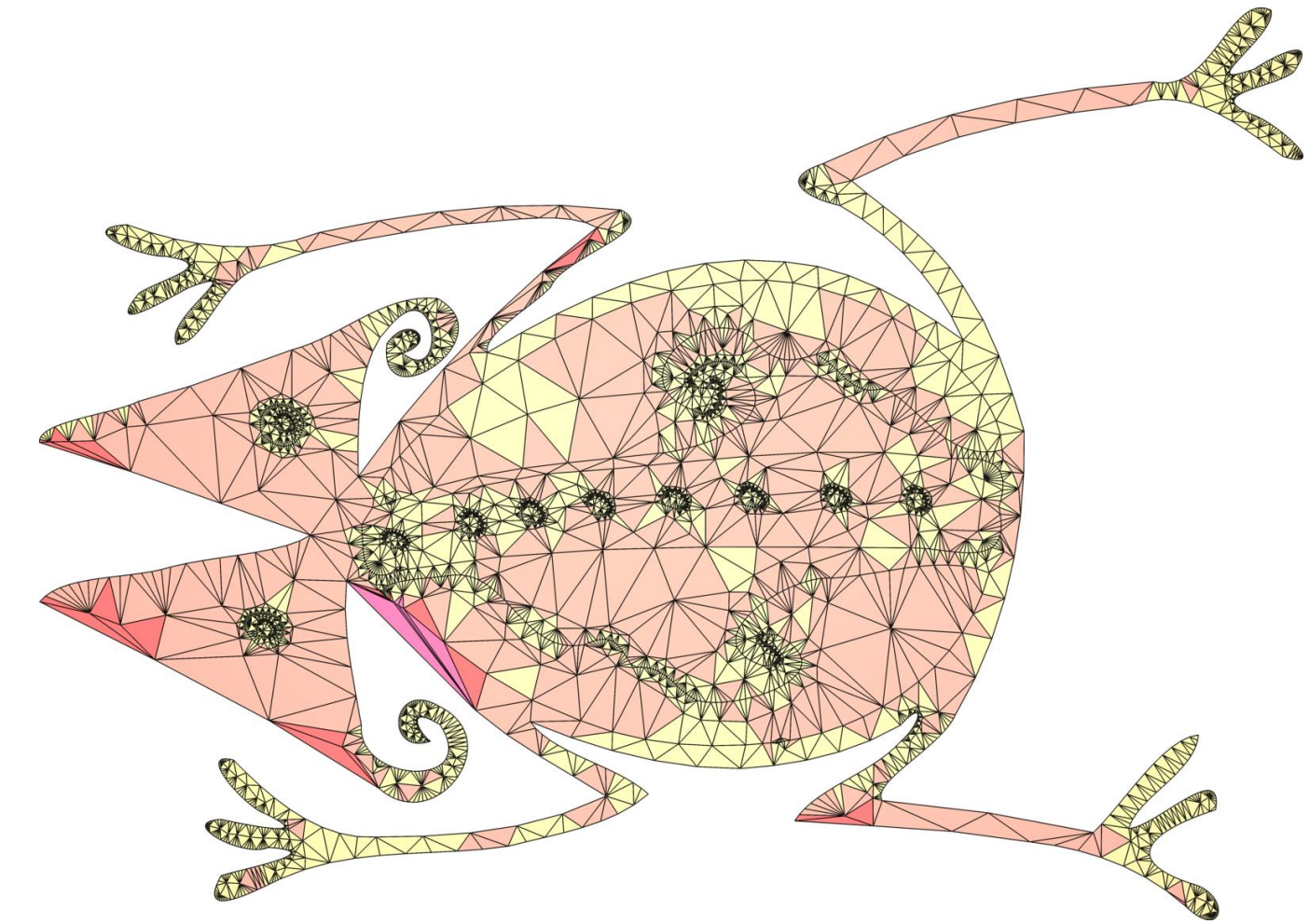
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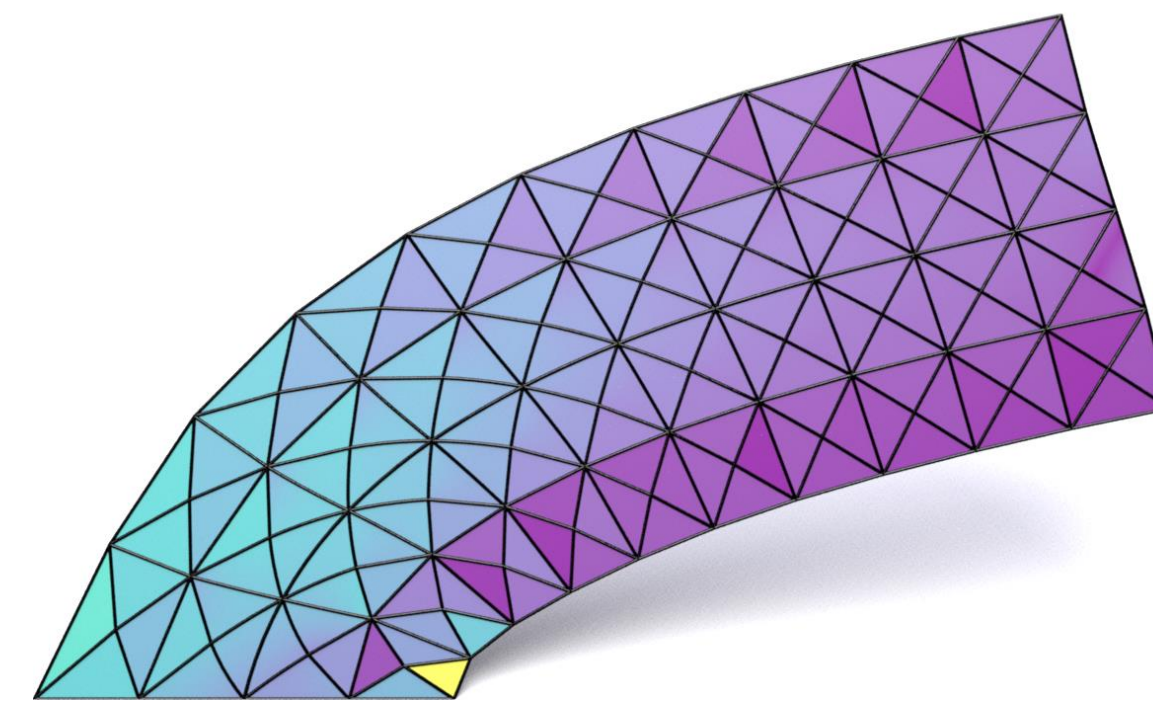
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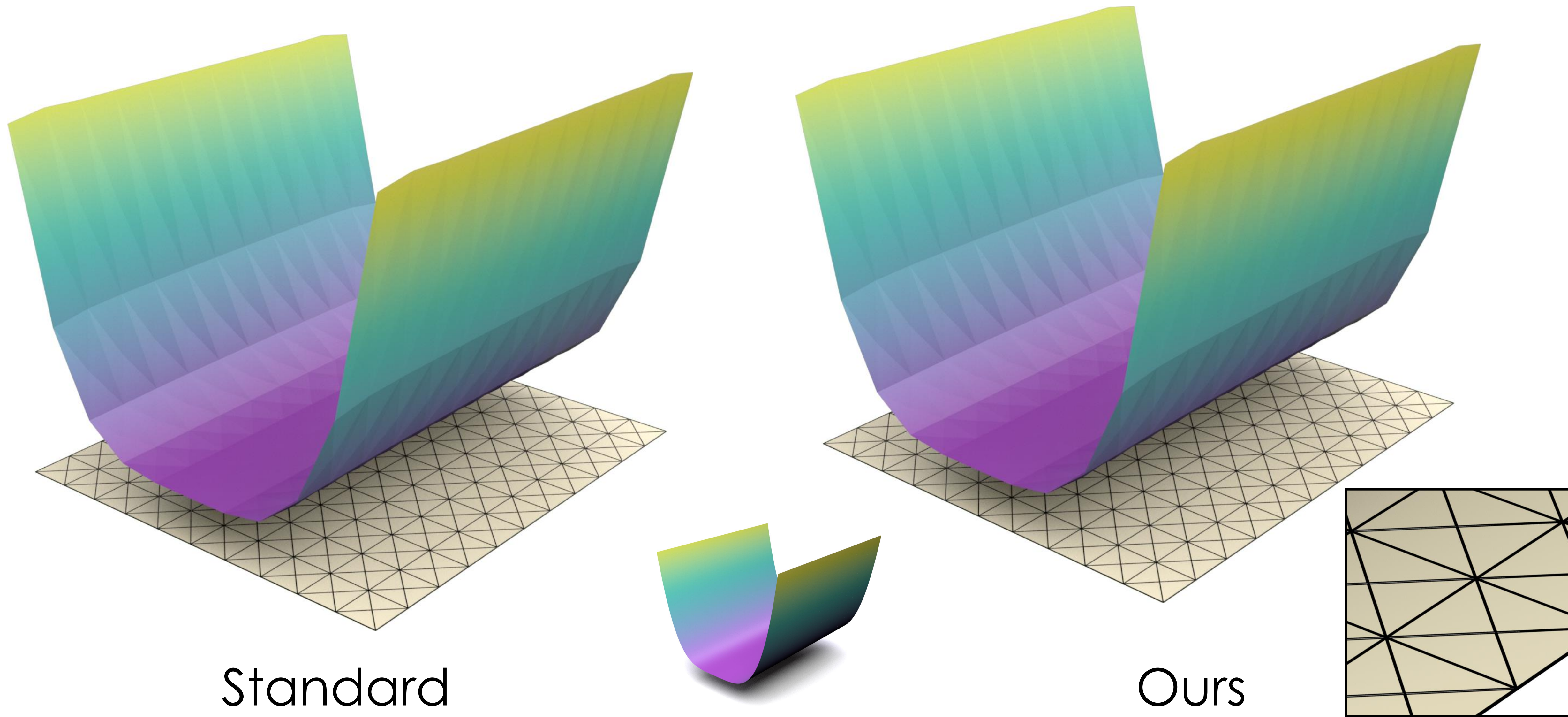
2. Propagate degrees



4. Simulate!

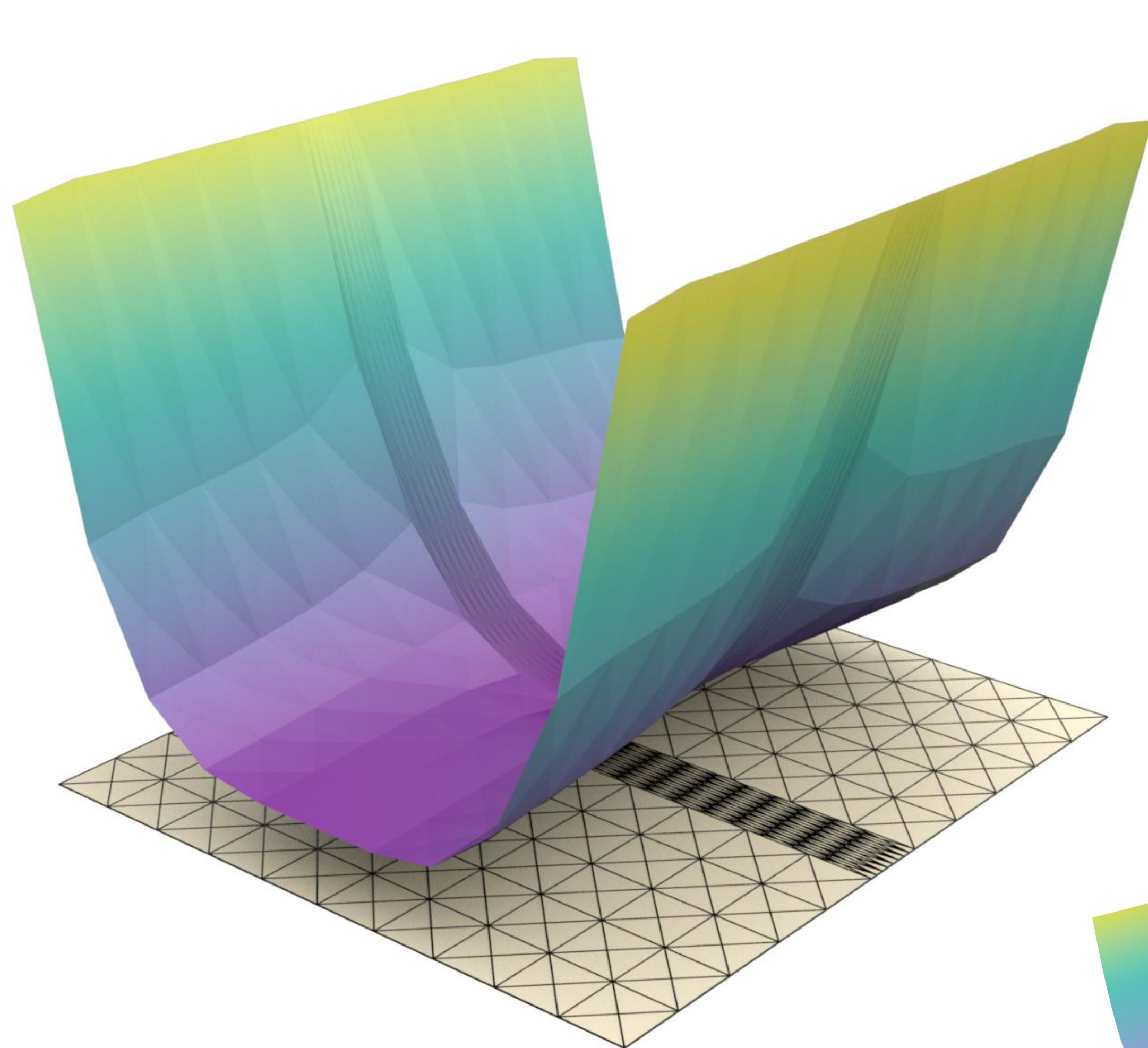


# Laplace

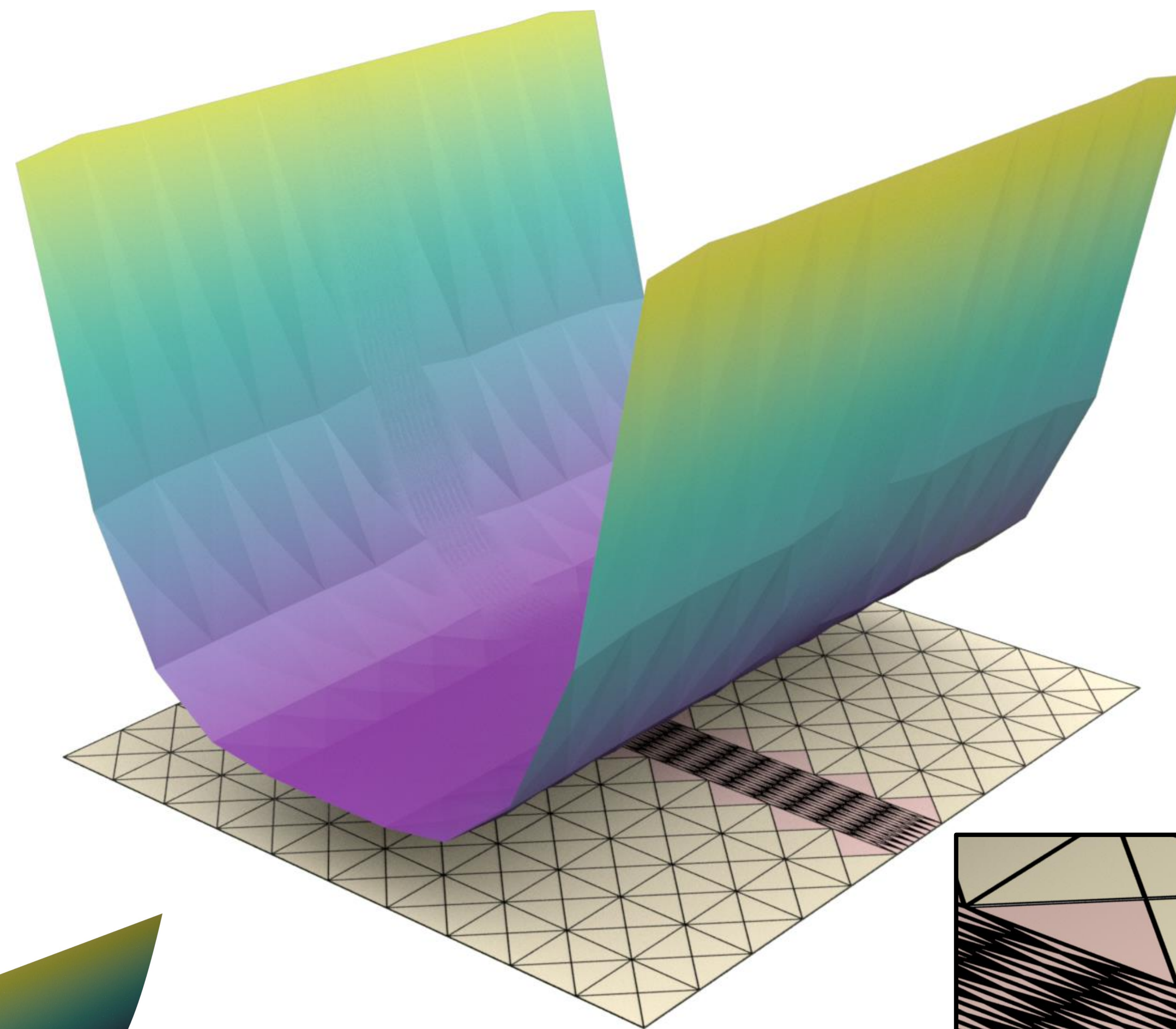
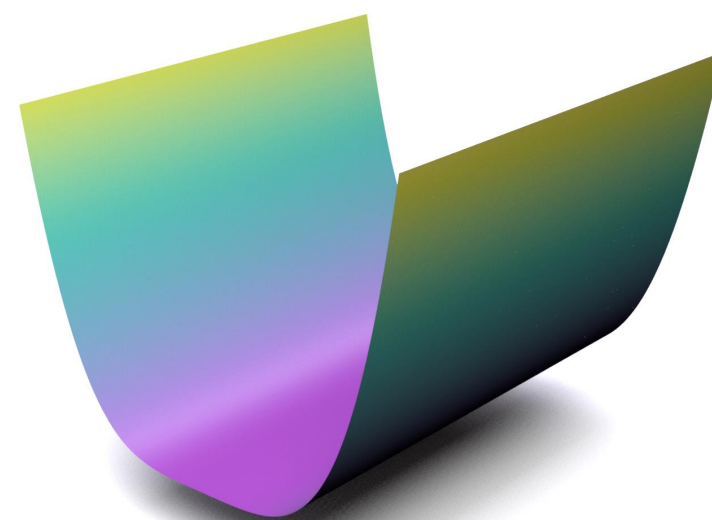




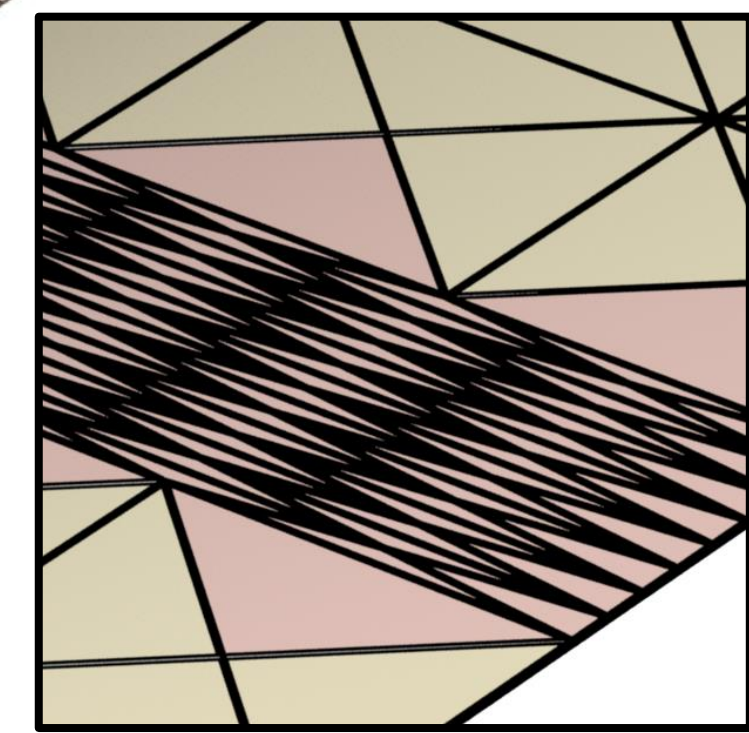
# Laplace



Standard

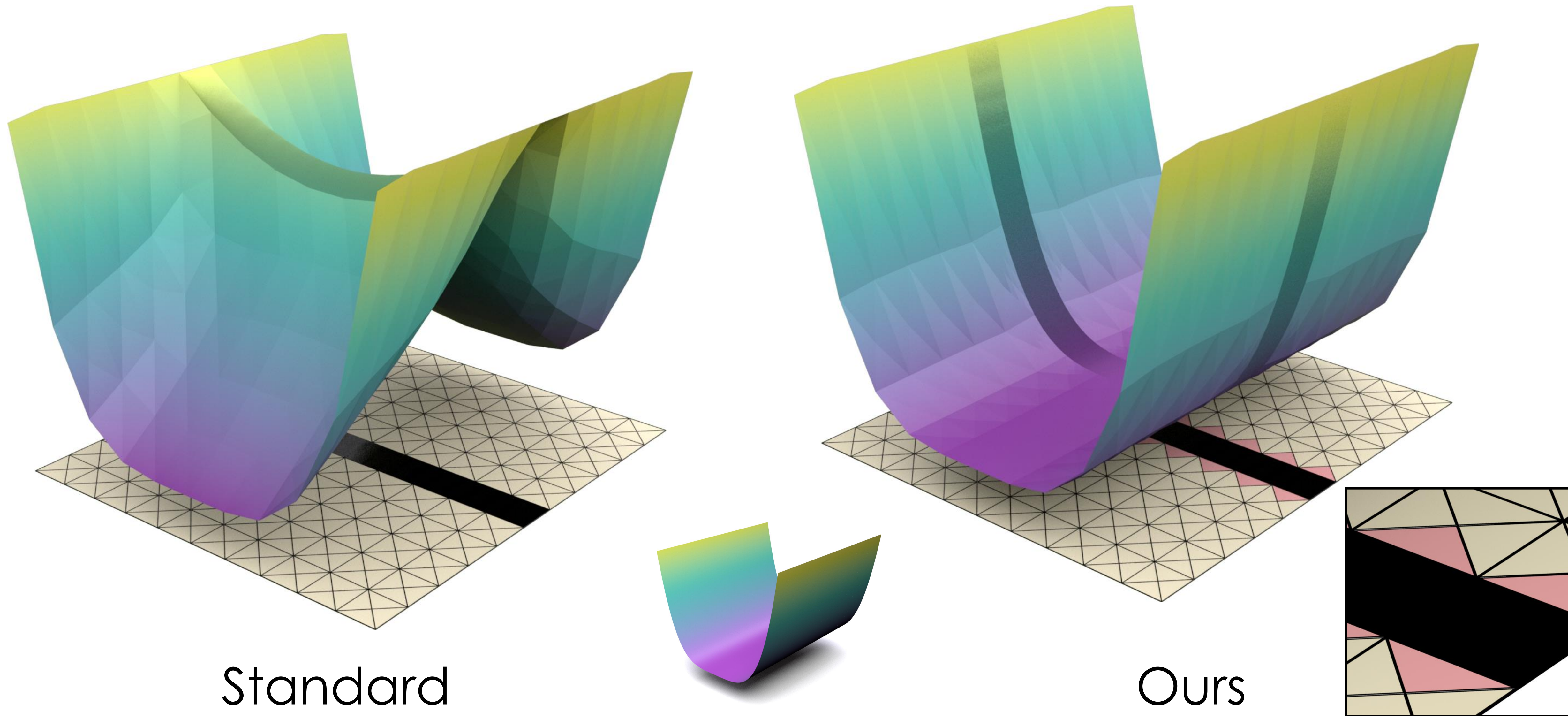


Ours



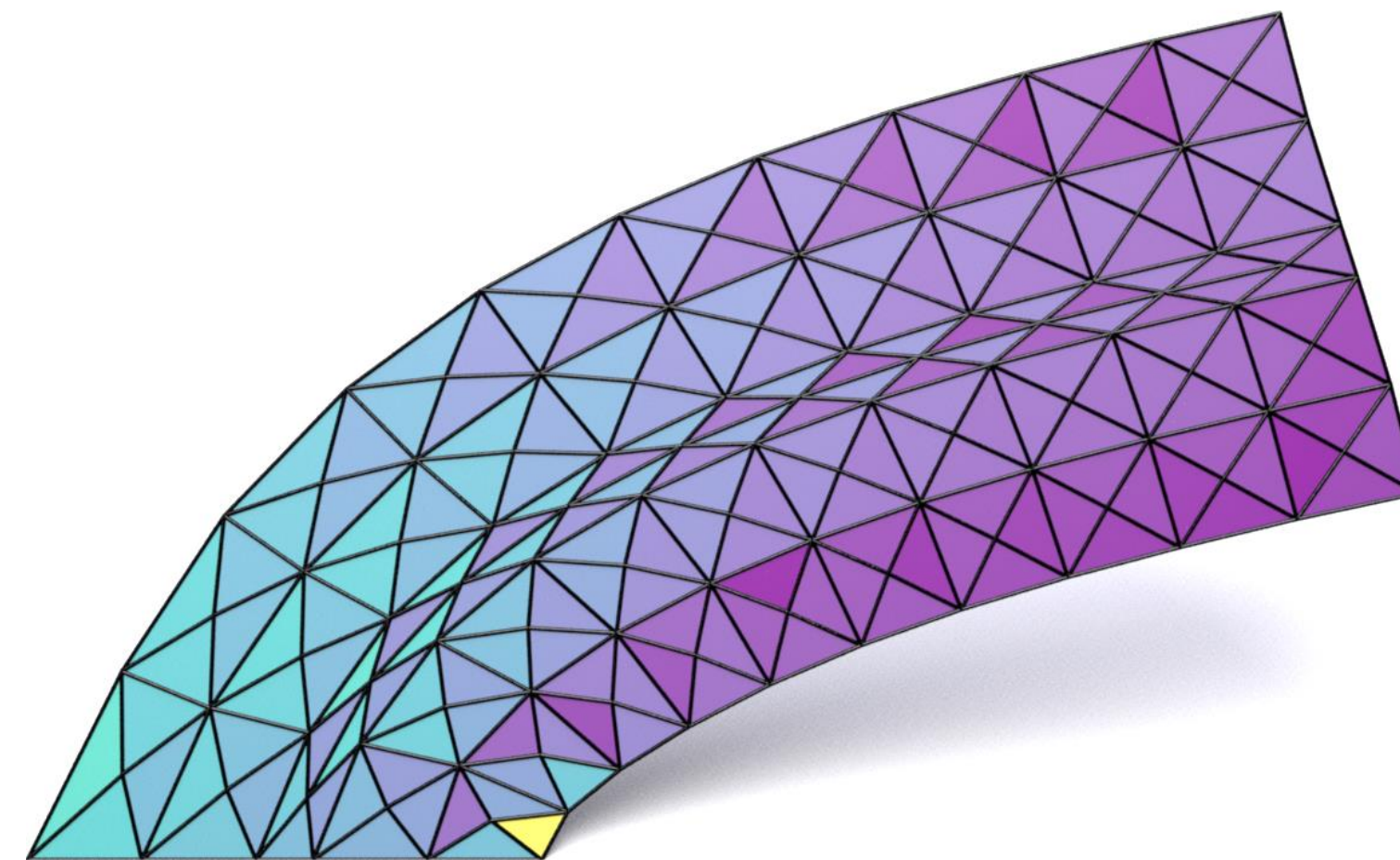
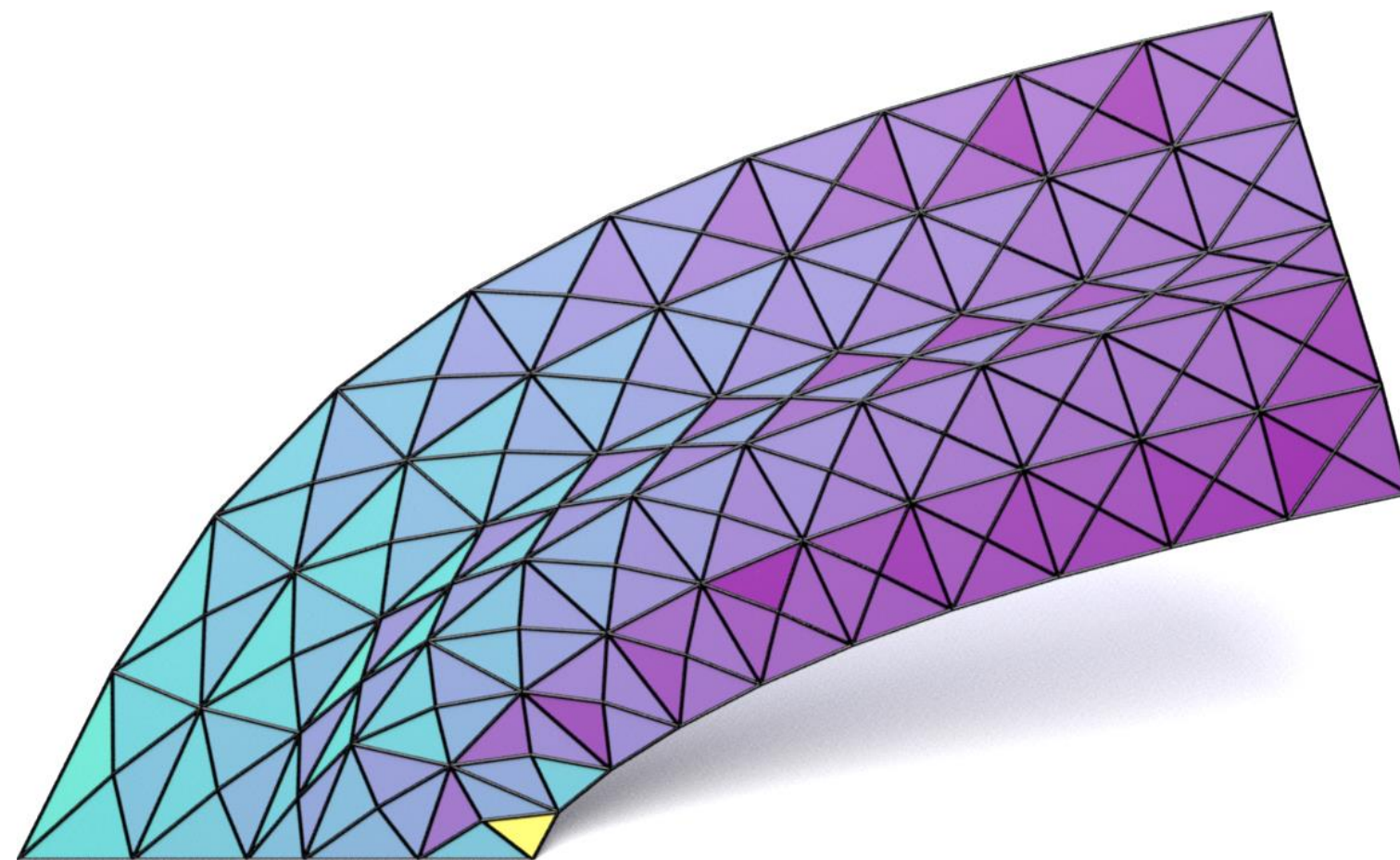


# Laplace



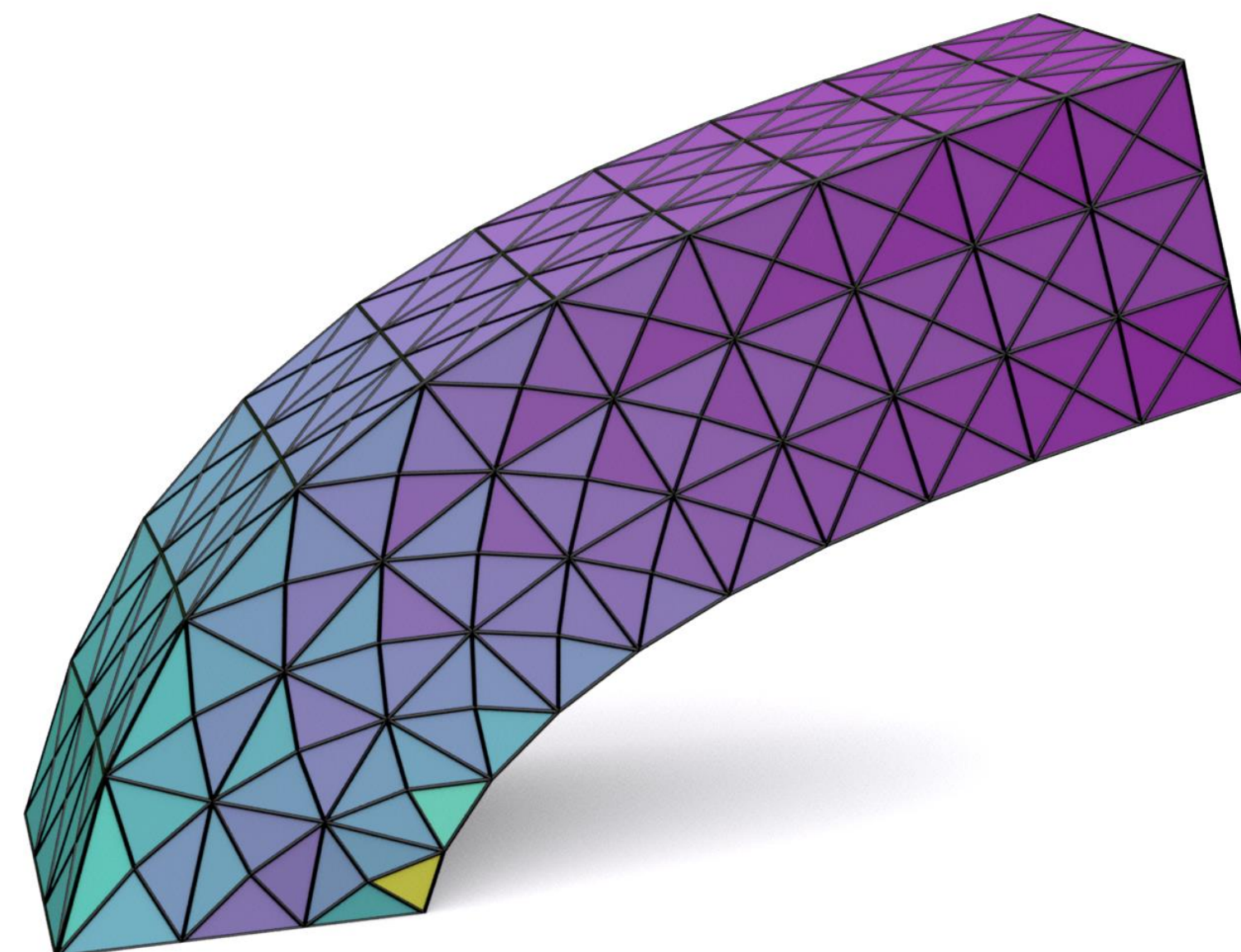
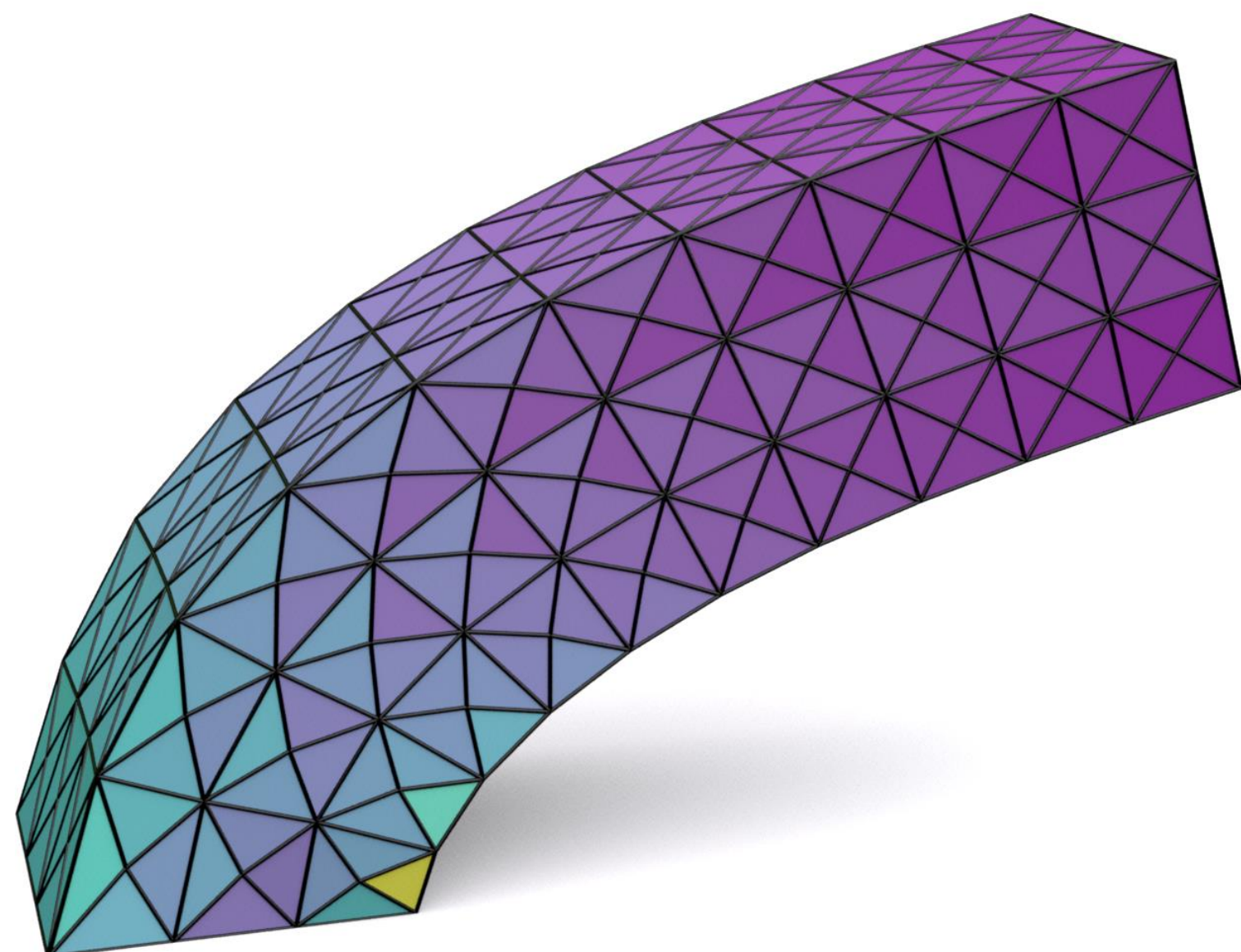


# Neo-Hookean Elasticity



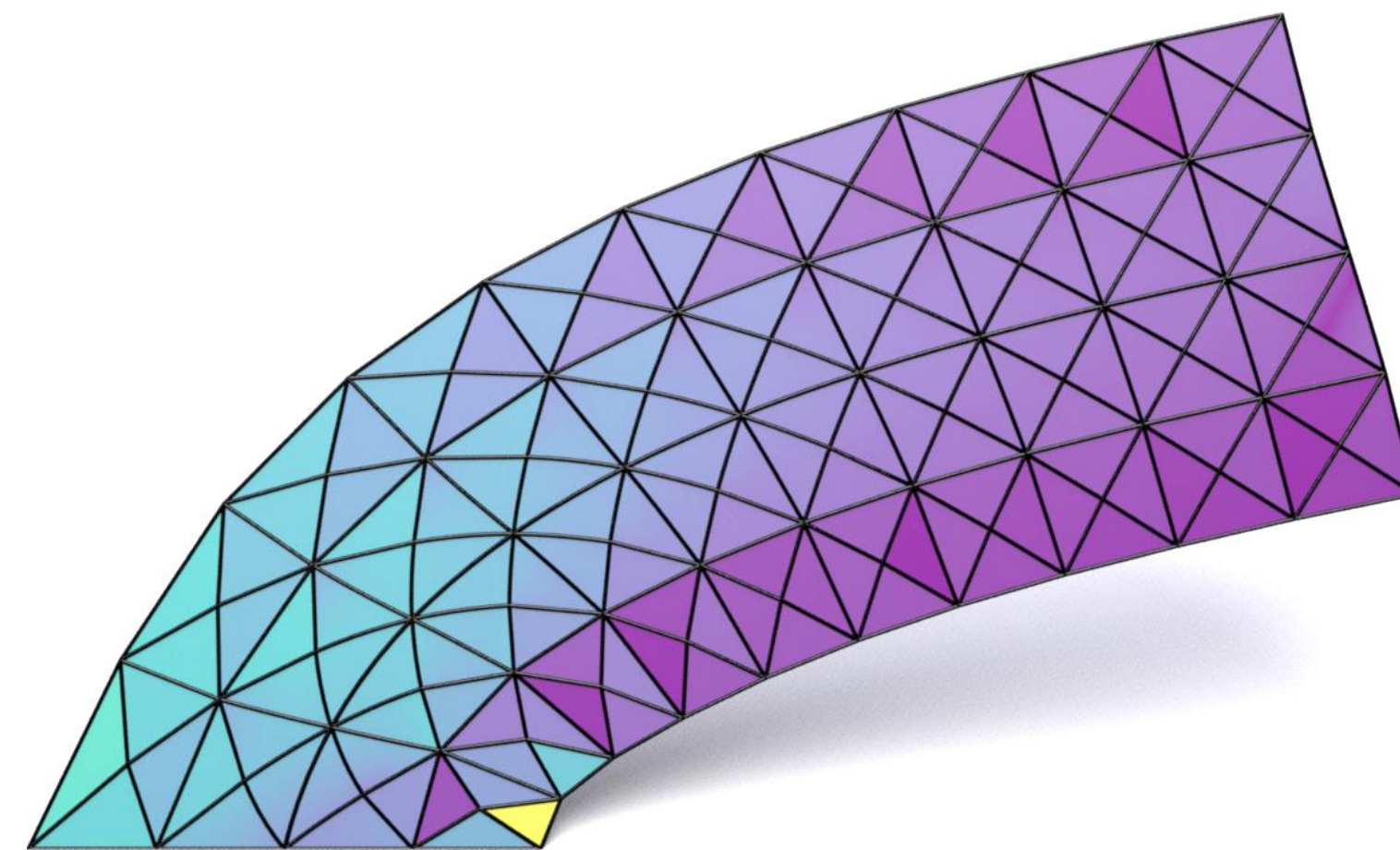
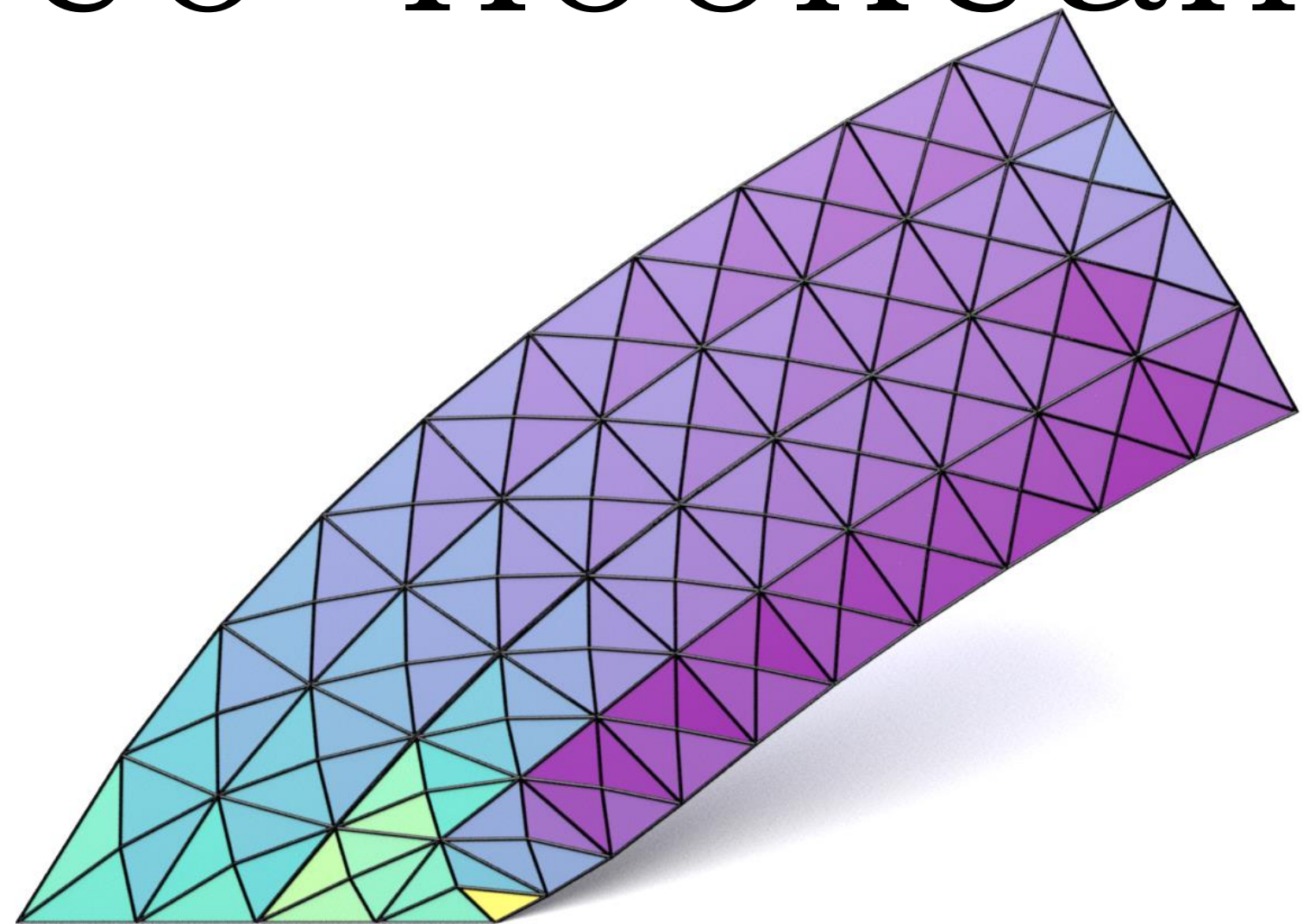
Standard

Ours

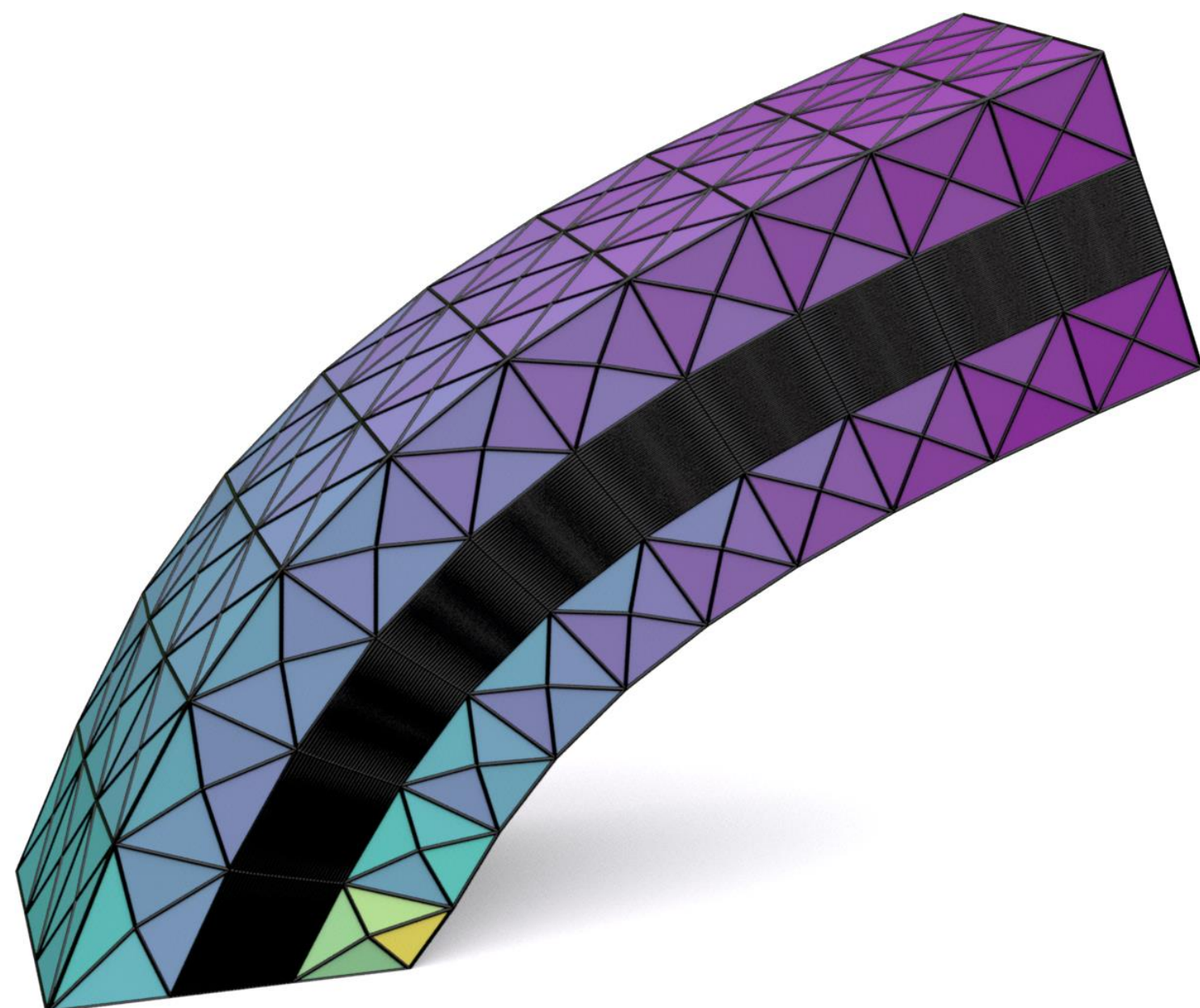




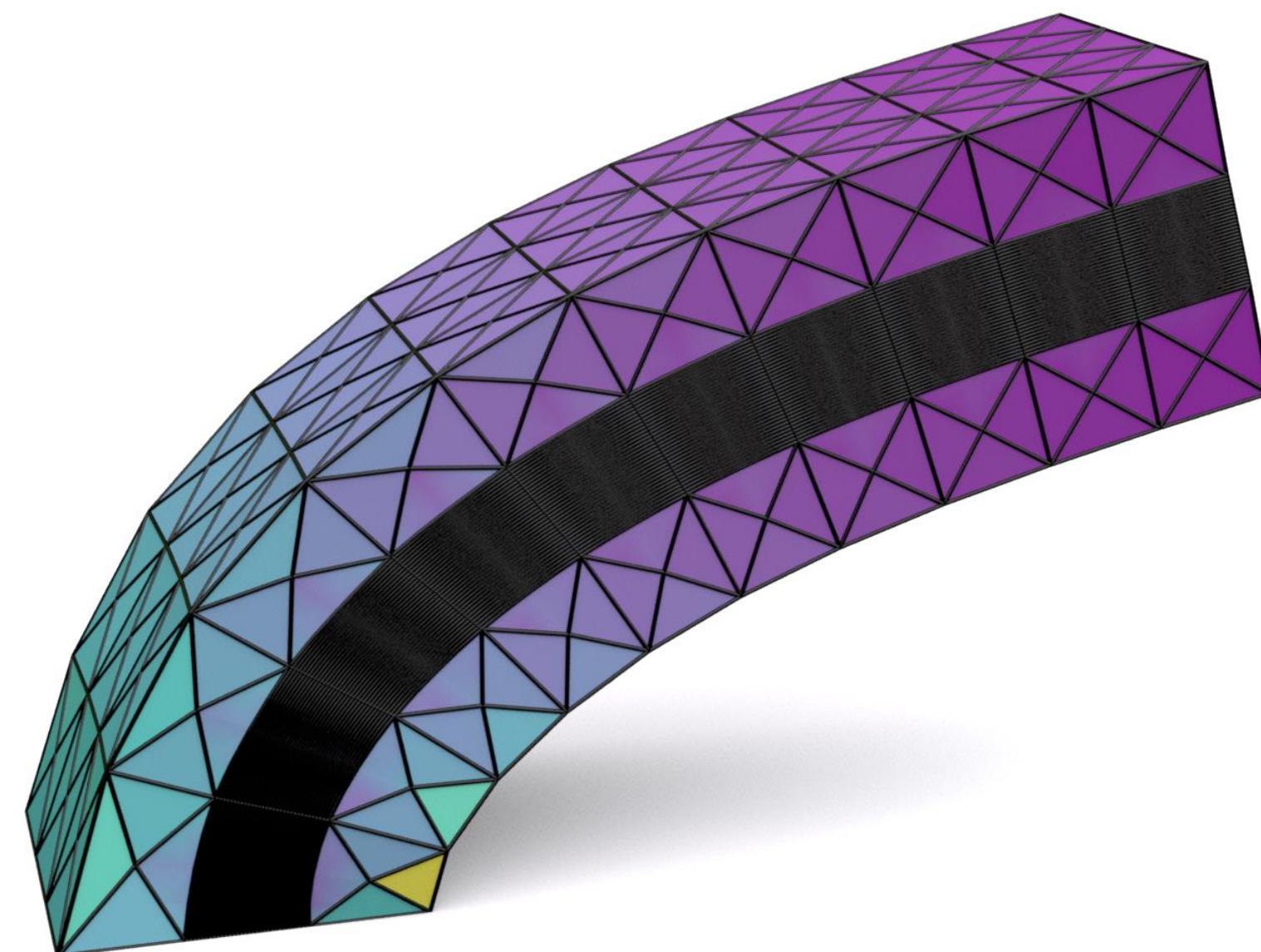
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Standard



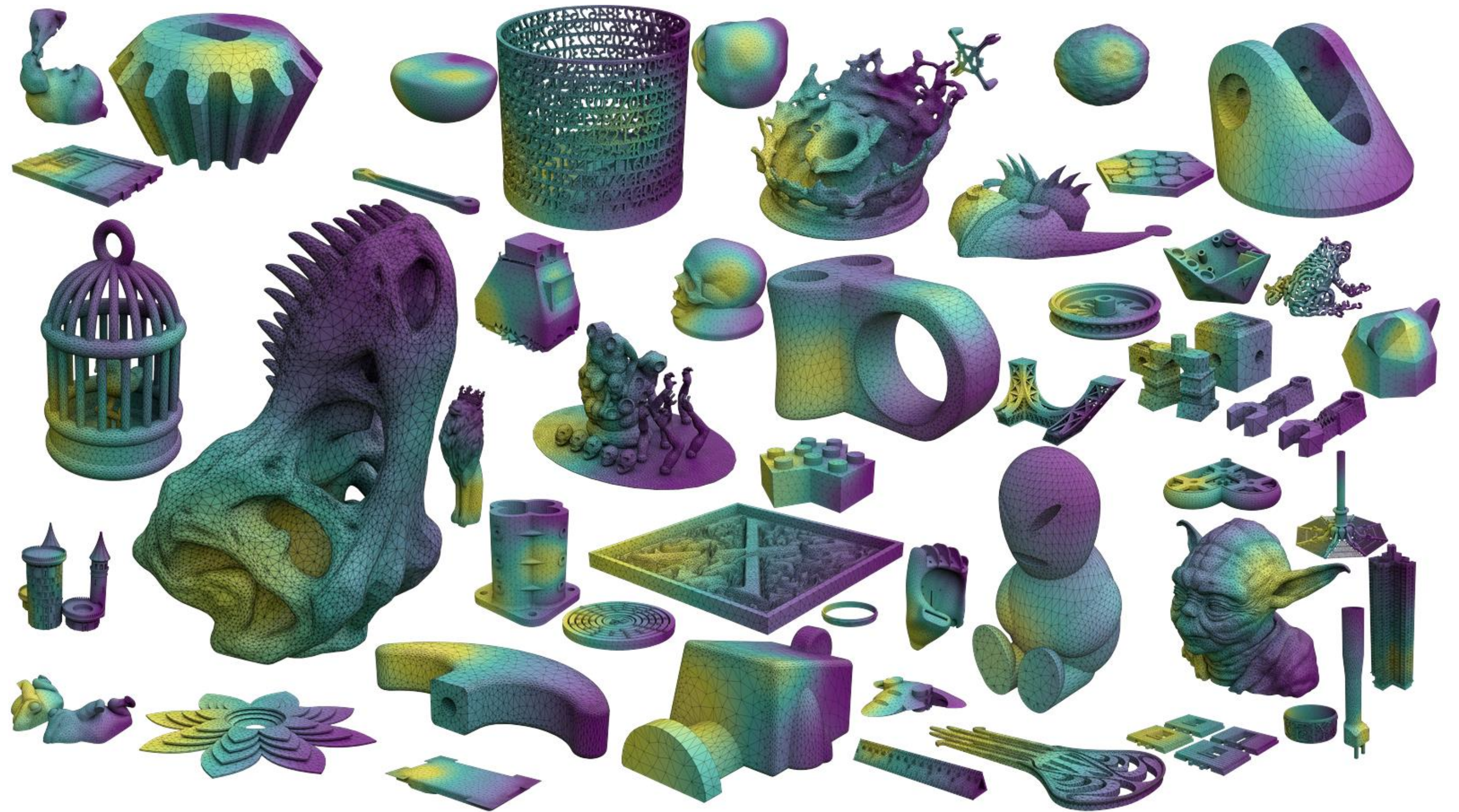
Ours





# Large Dataset

- Thingi10k  
[Zhou 17]
- Tetwild  
[Hu 18]
- $\sim 10k$  Optimized
- $\sim 10k$  Not Optimized





# How to Measure Errors?

- Standard  $L_2$  error estimate for linear elements

$$e_h = \|u - u_h\|_0 \leq Ch^2 \|u\|_2$$

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$L_2$  norm or average error

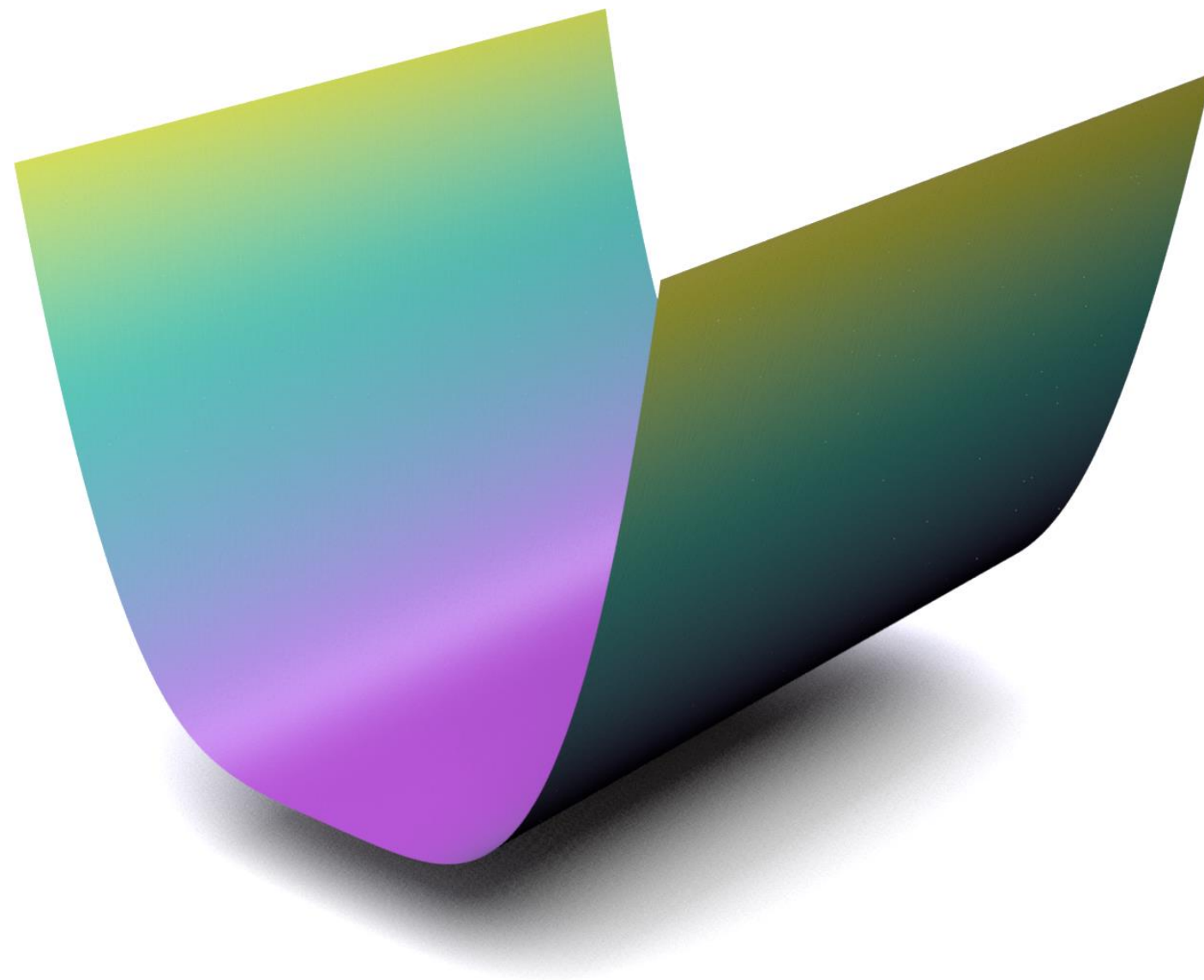


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$$e_h = \|u - u_h\|_0 \leq Ch^2 \|u\|_2$$

Exact solution

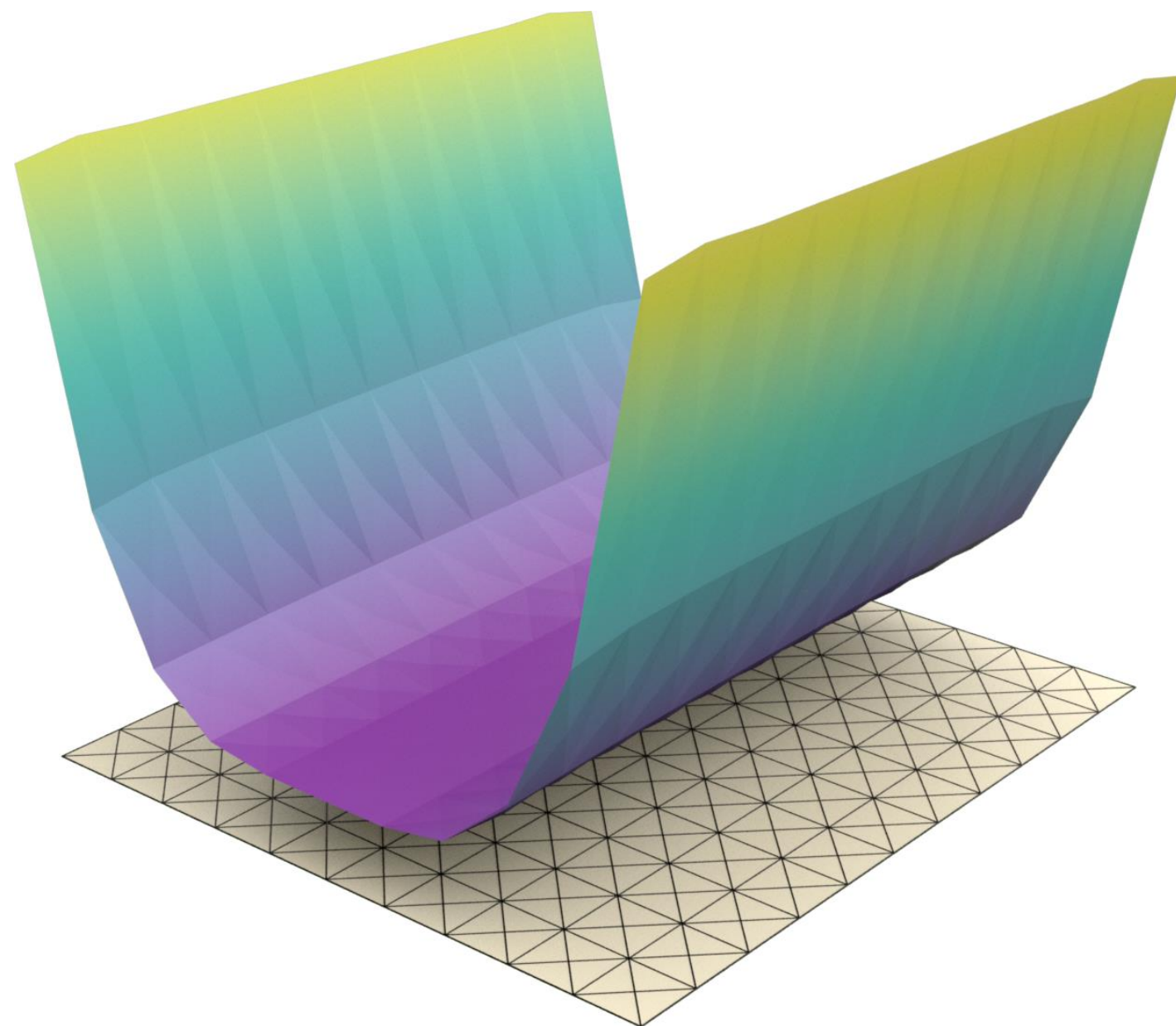


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Approximated solution





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$$e_h = \|u - u_h\|_0 \leq C h^2 \|u\|_2$$

- Different  $h$  for every model!

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$$E_{L_2} = \frac{\|u - u_h\|_0}{h^2}$$



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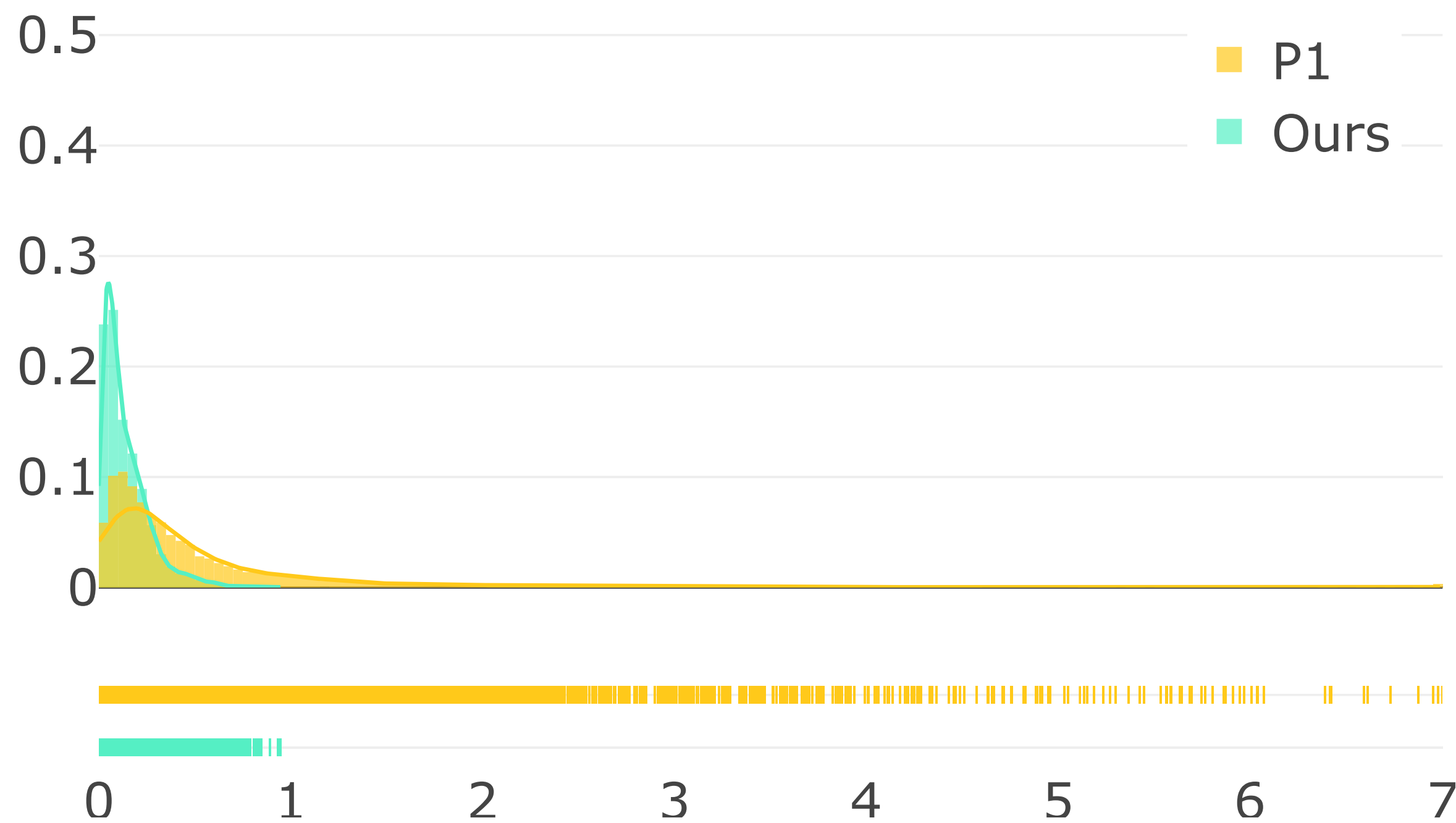
$$E_{L_2} = \frac{\|u - u_h\|_0}{h^2}$$

Small values are good!

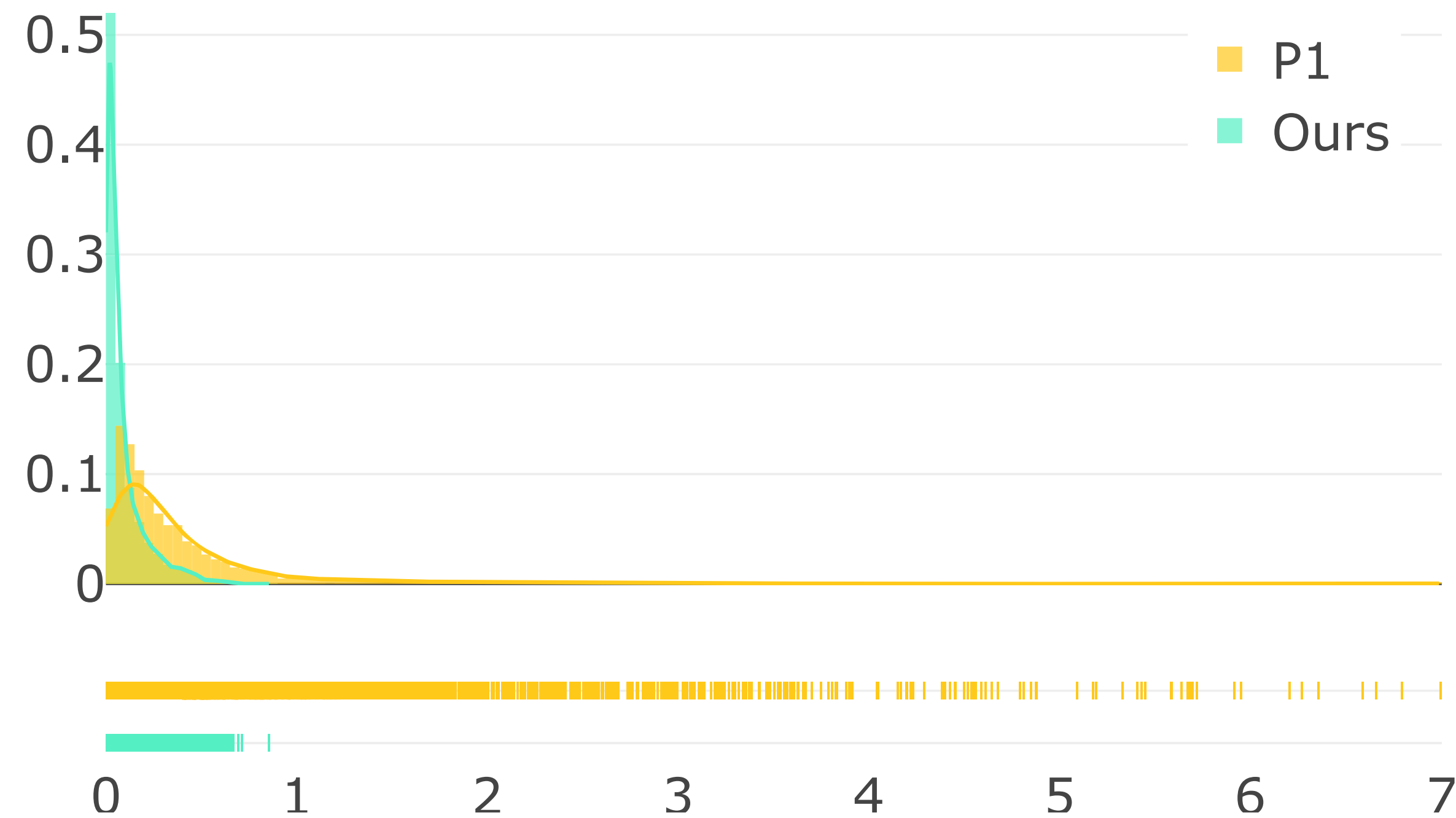
- Independent from  $h$



# Efficiency



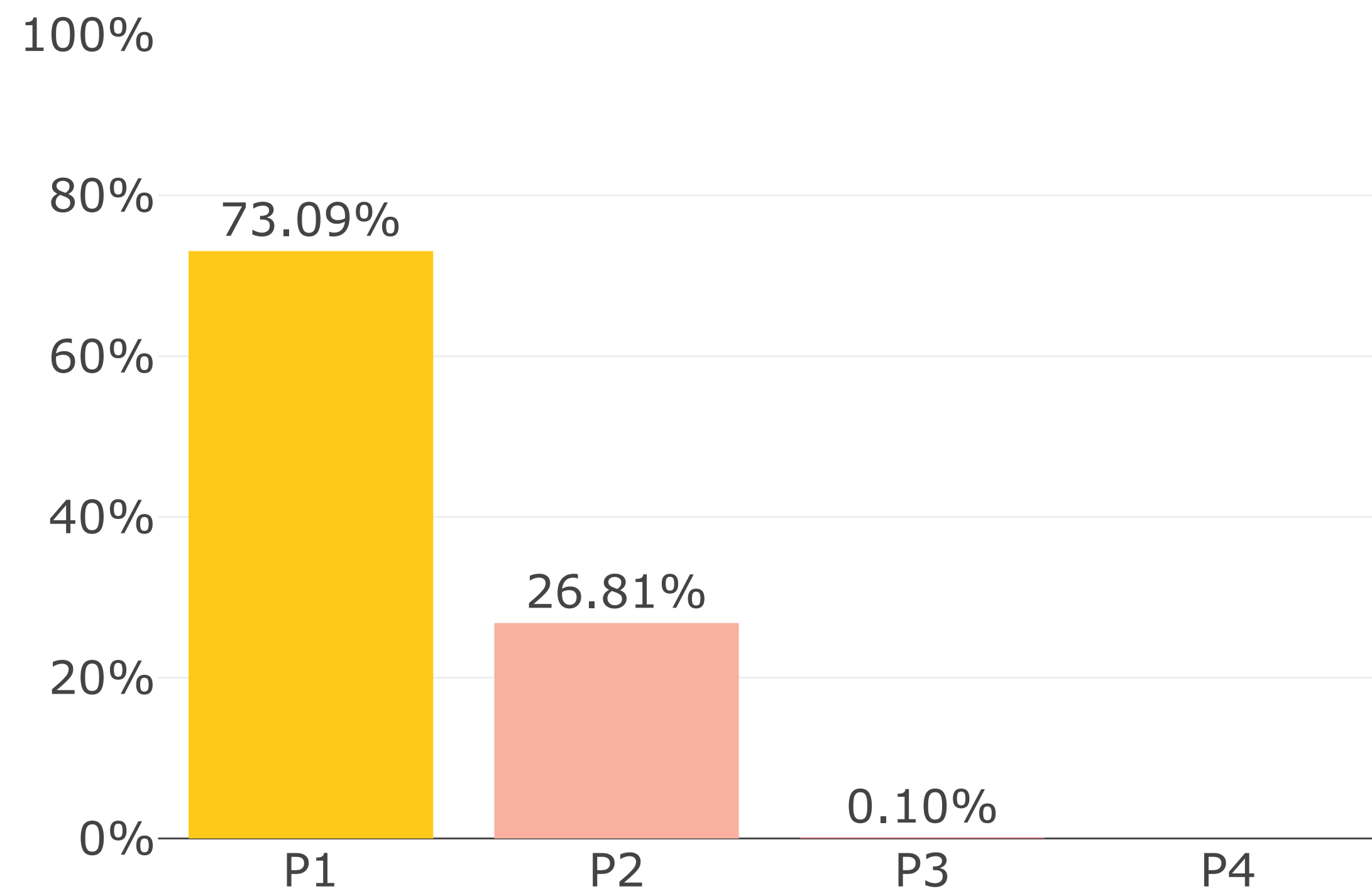
Optimized



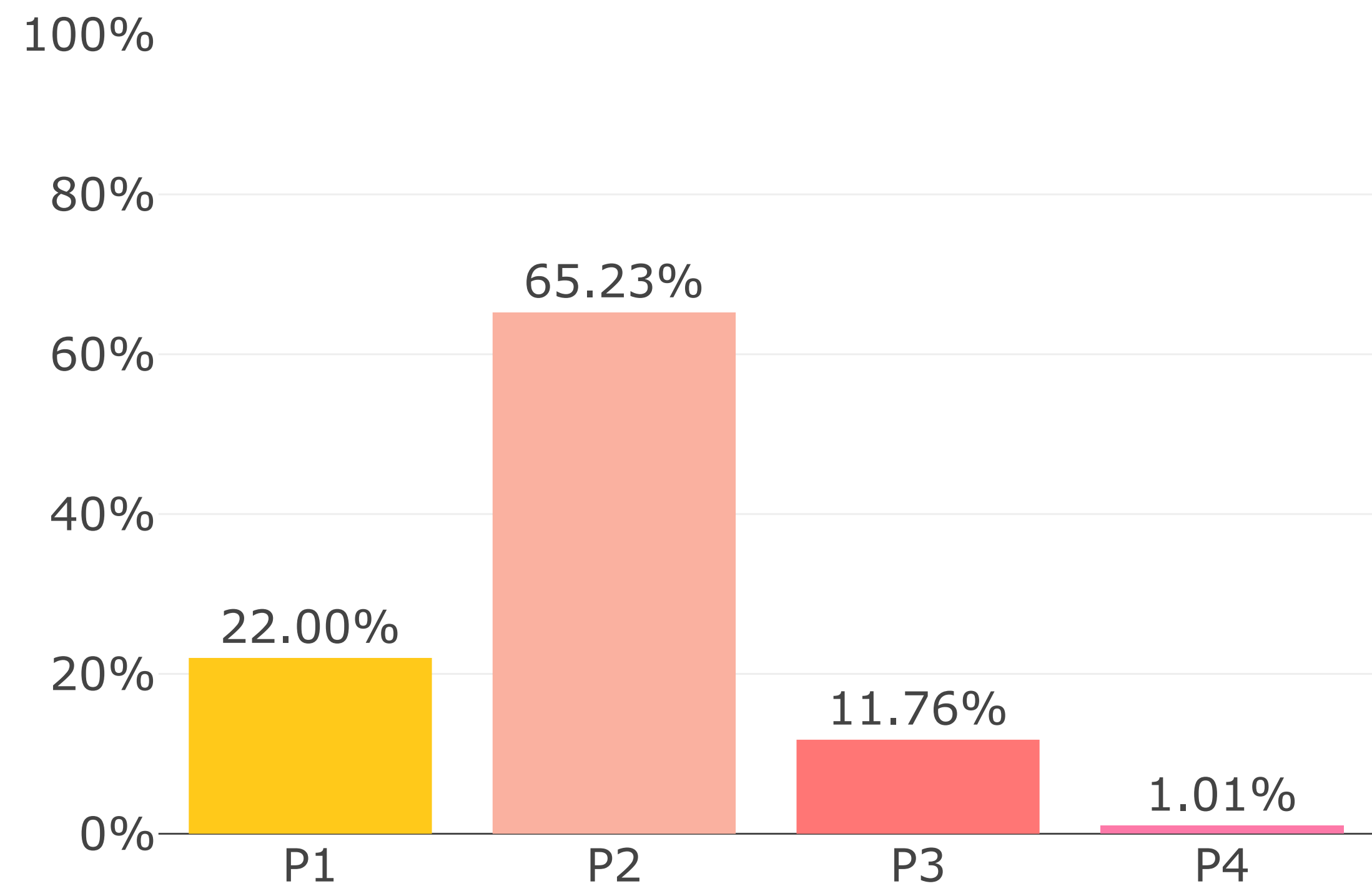
Not Optimized

$L_2$  efficiency

# Degree Distribution



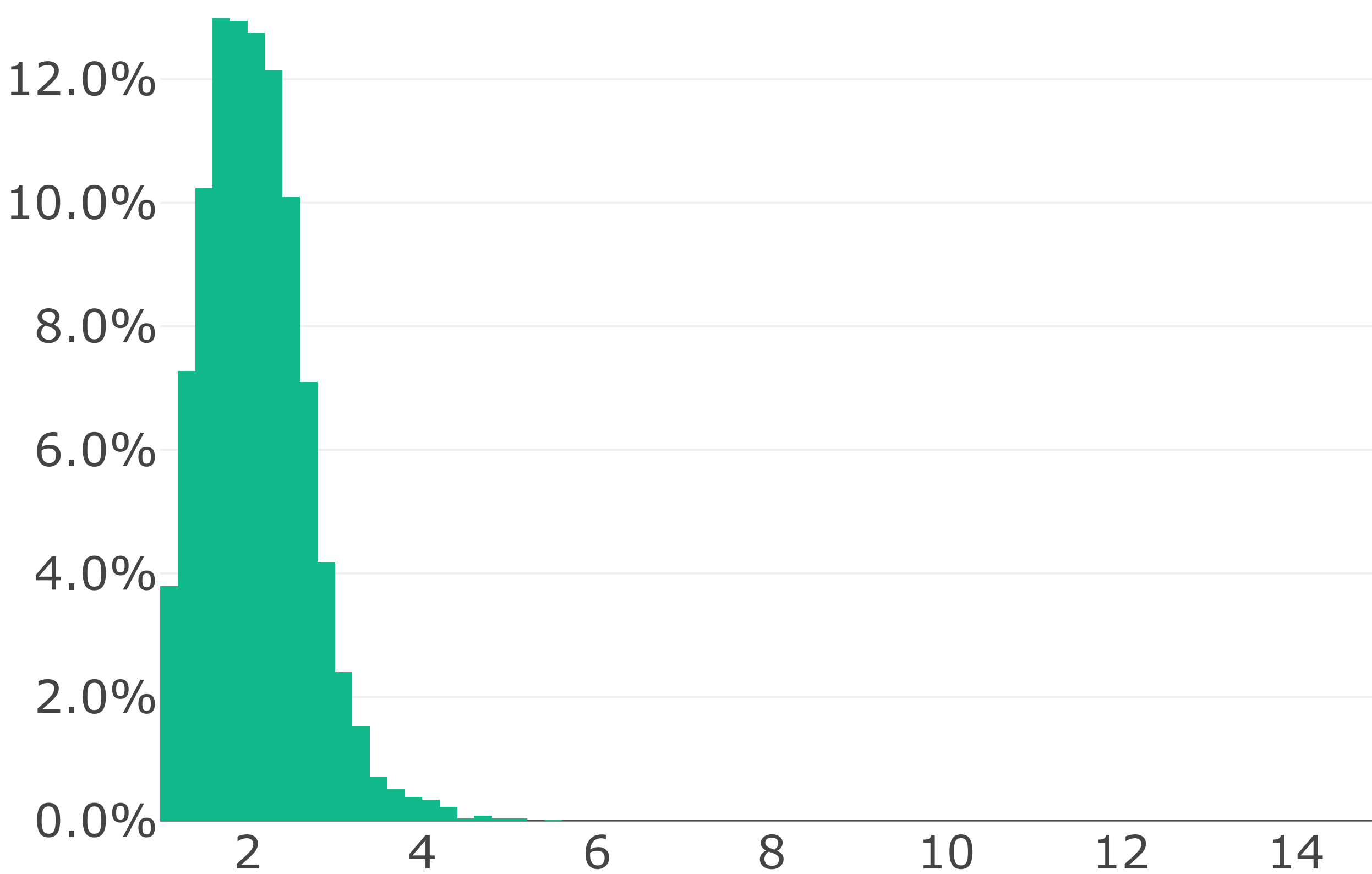
Optimized



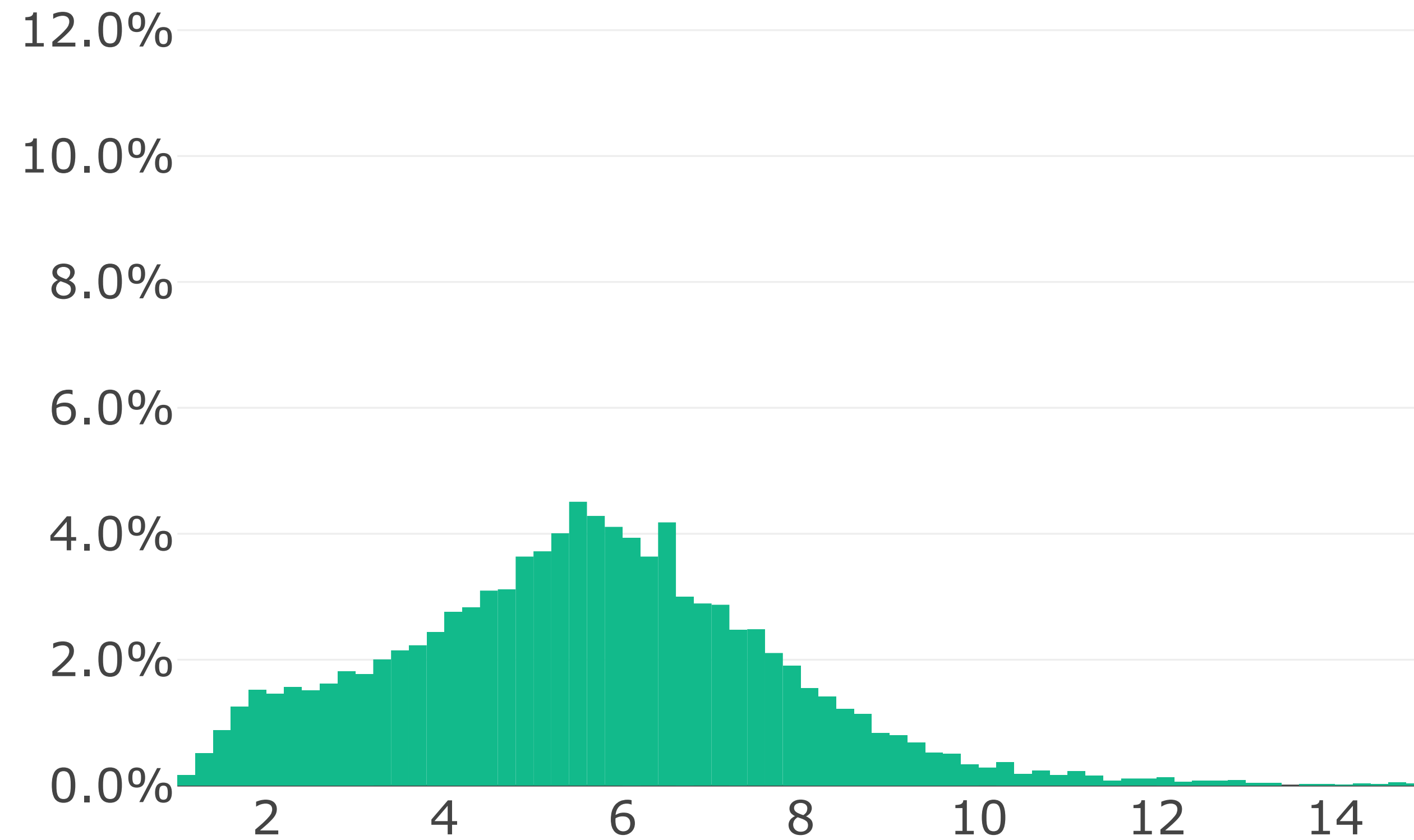
Not Optimized



# Number of DOF



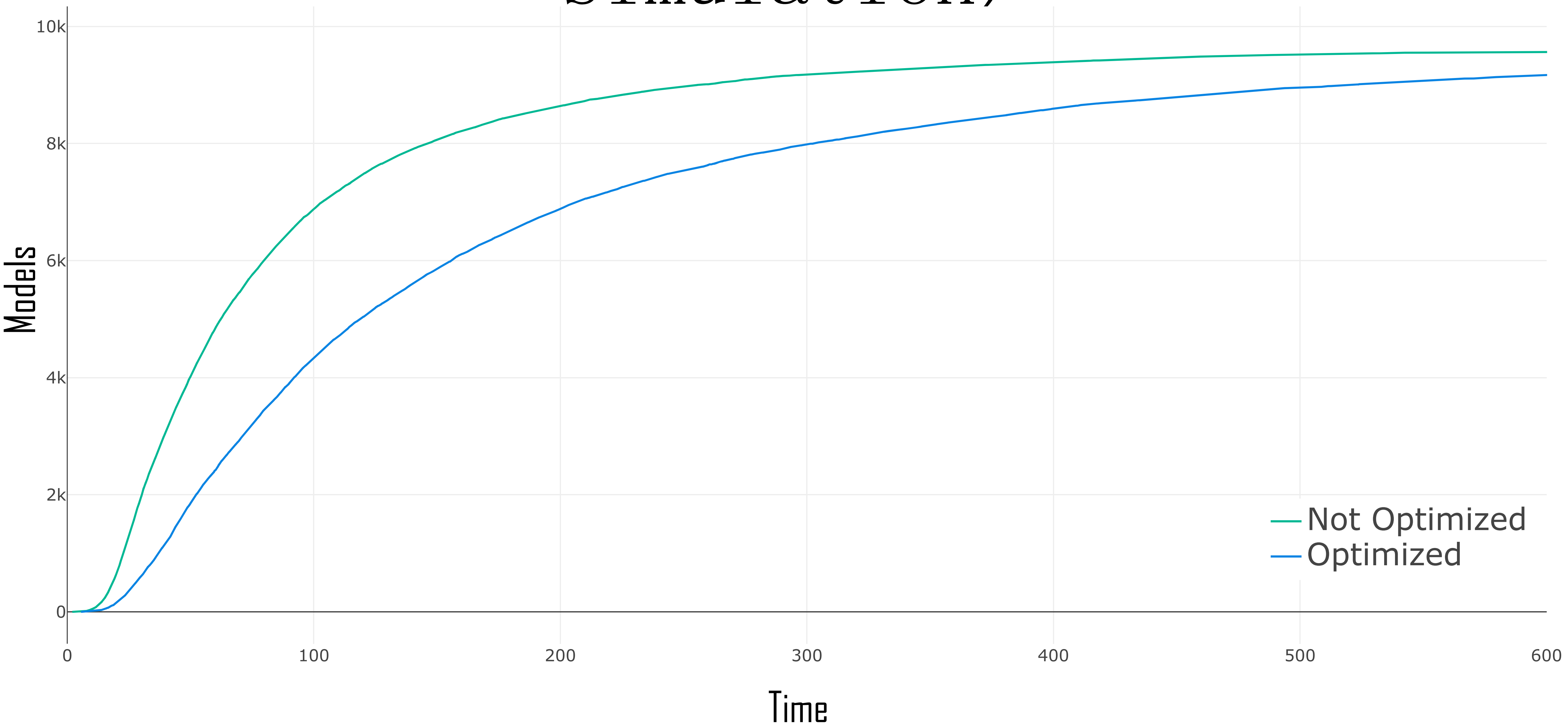
Optimized



Not Optimized

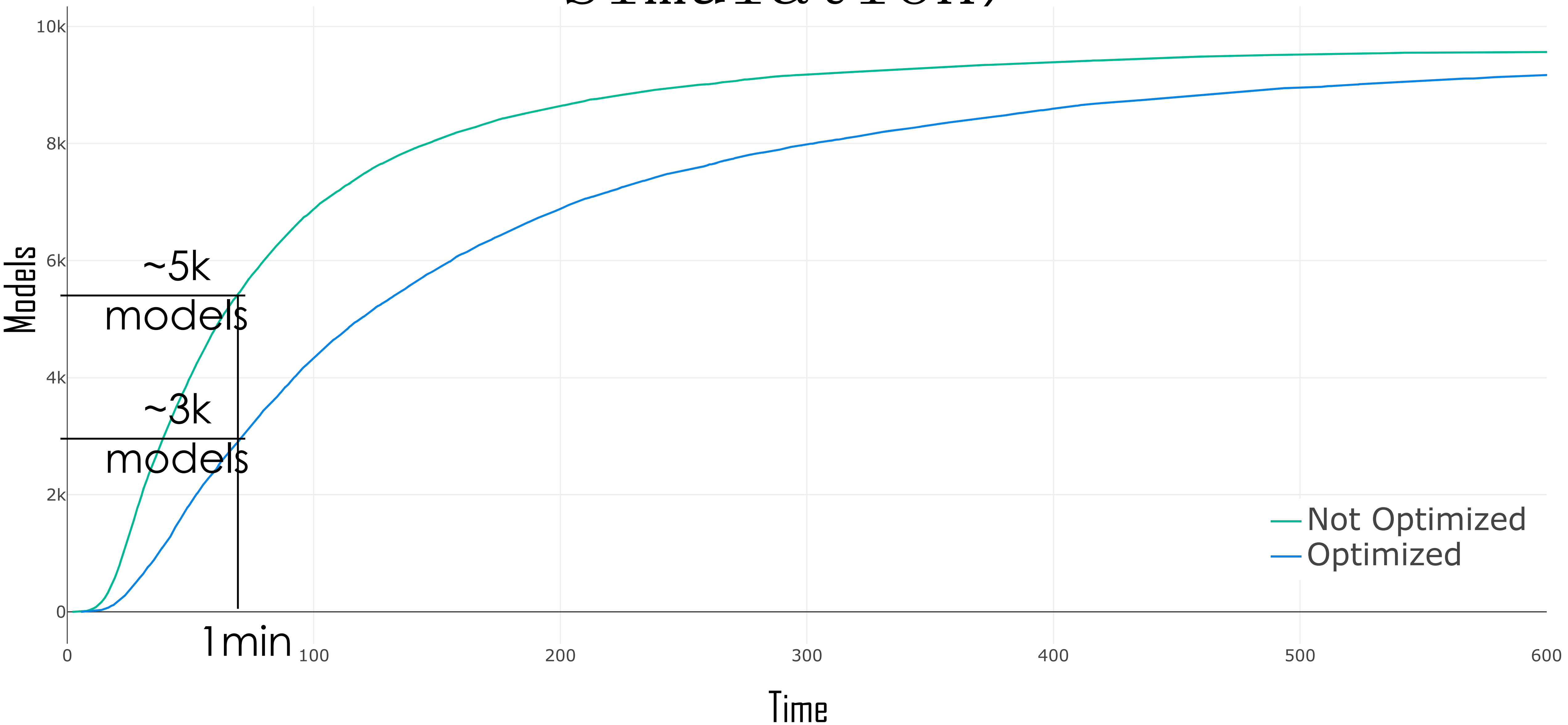
Increase in DOFs

# Overall Time (Meshing + Simulation)





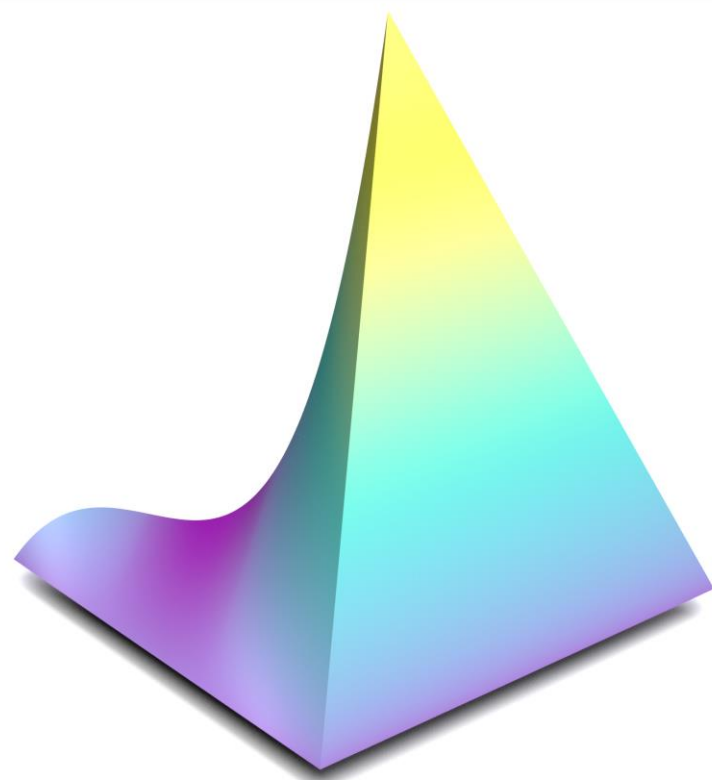
# Overall Time (Meshing + Simulation)



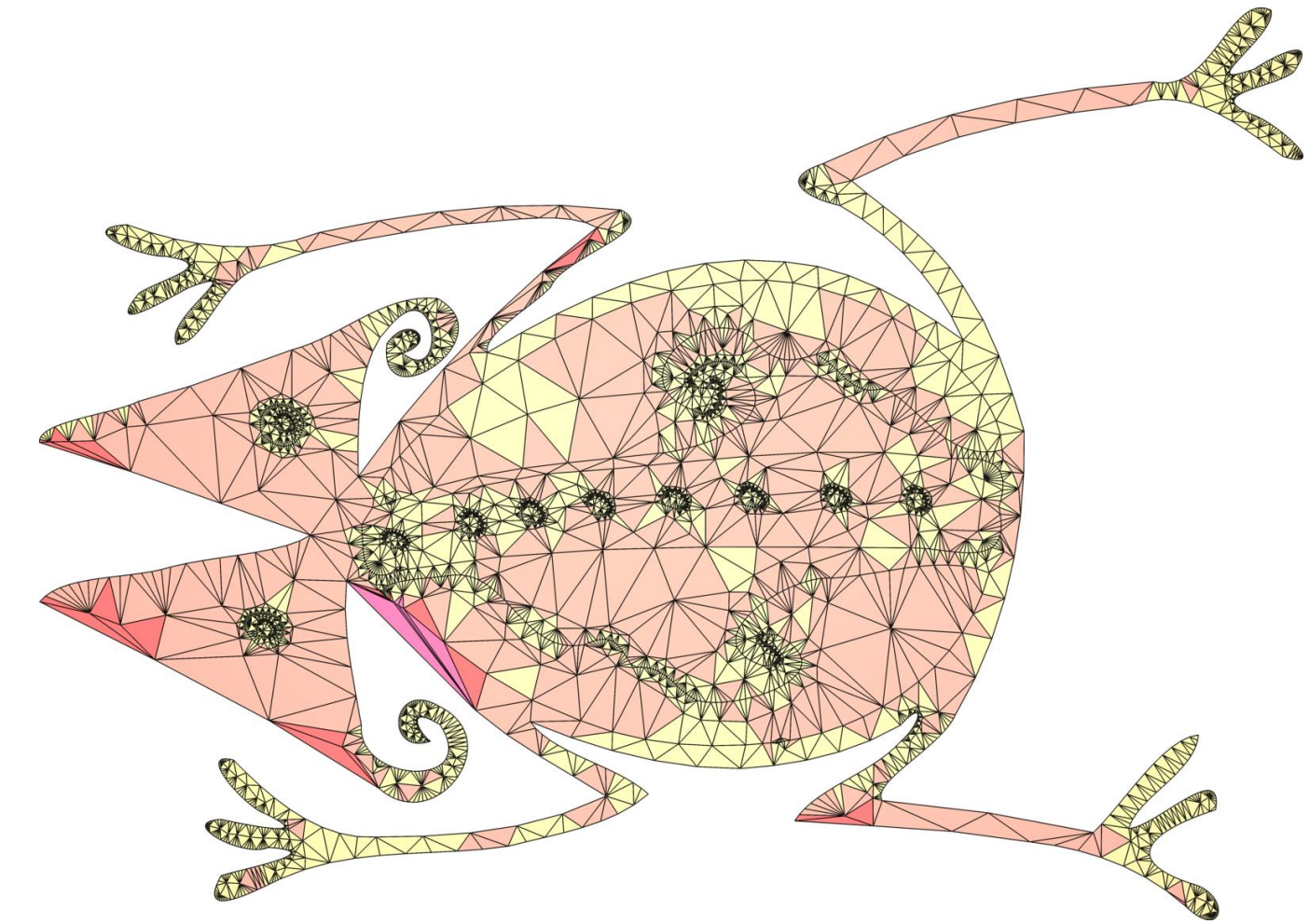
# Summary

$$k = \frac{\ln \left( B \hat{h}^{\hat{k}+1} \frac{\sigma_E^2}{\hat{\sigma}^2} \right) - \ln h_E}{\ln h_E}$$

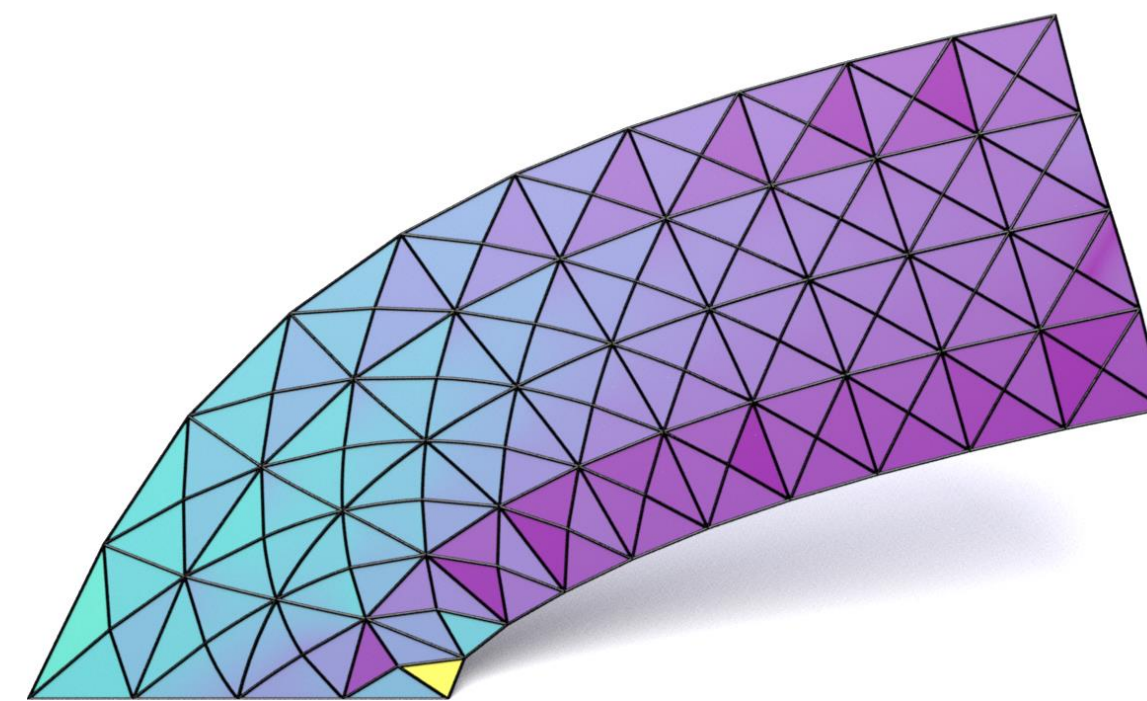
1. Use formula



3. Construct  $C^0$  basis



2. Propagate degrees



4. Simulate!





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# Thank you!

Code available

<http://www.github.com/polyfem>