

Problem definition (physics + discretization)

<u>Category</u>	<u>Setting / Value</u>
<i>Problem type</i>	<i>2D plane-strain Neo-Hookean elasticity (square domain)</i>
<i>Domain</i>	$([0, L] \times [0, L])$, with ($L = 1.0$)
<i>Mesh type</i>	<i>Structured quadrilateral mesh (2D square)</i>
<i>Mesh resolution</i>	$(N = 42)$ (42×42 grid; used by <code>create_2D_square_mesh(L, N)</code>)
<i>FE element</i>	<i>4-node quad, Neo-Hookean (NeoHookeMechanicalLoss2DQuad)</i>
<i>Gauss integration</i>	<i>num_gp = 2</i> (2×2 Gauss points per element)
<i>Material model</i>	<i>Neo-Hookean, isotropic</i>
<i>Young's modulus</i>	$(E = 1.0)$
<i>Poisson's ratio</i>	$(\nu = 0.3)$
<i>BC type</i>	<i>Dirichlet on left/right boundaries for (U_x, U_y)</i>
<i>BC – left edge</i>	$(U_x = 0.0), (U_y = 0.0)$
<i>BC – right edge</i>	$(U_x = 0.1), (U_y = 0.1)$
<i>Control type</i>	<i>FourierControl (spatially varying stiffness field ($K(x,y)$))</i>
<i>Fourier x-frequencies</i>	$([2, 4, 6])$
<i>Fourier y-frequencies</i>	$([2, 4, 6])$

PI-FNO

<u>Category</u>	<u>Setting / Value</u>
<i>Fourier z-frequencies</i>	<code>([0]) (effectively 2D)</code>
<i>Fourier amplitude scale</i>	<code>beta = 20</code>
<i>K field range</i>	<code>min = 1e-1, max = 1.0 (clamp of heterogeneity field)</code>
<i>Samples in dictionary</i>	<code>200 Fourier coefficient vectors (when generated via create_random_fourier_samples)</code>

PI-FNO model & training hyperparameters (parametric/otf/transfer)

<u>Category</u>	<u>Setting / Value</u>
<i>Operator model</i>	<code>FourierNeuralOperator2D</code>
<i>FNO modes (x)</i>	<code>modes1 = 6</code>
<i>FNO modes (y)</i>	<code>modes2 = 6</code>
<i>Channel width</i>	<code>width = 8</code>
<i>Network depth</i>	<code>depth = 4 residual blocks</code>
<i>Last projection channels</i>	<code>channels_last_proj = 32</code>
<i>Output channels</i>	<code>out_channels = 2 (displacement (u_x, u_y))</code>

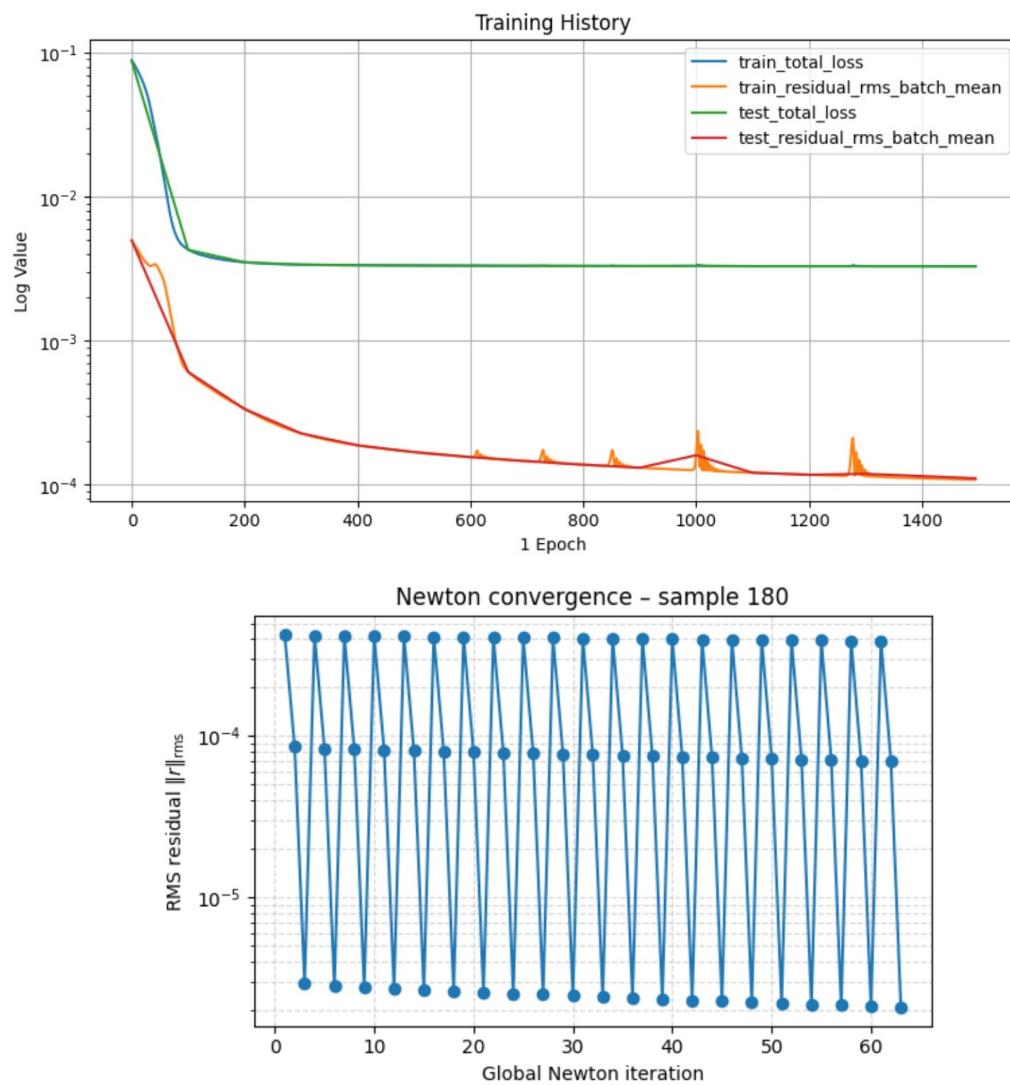
<u>Category</u>	<u>Setting / Value</u>
<i>Output scaling</i>	<code>output_scale = 0.1</code>
<i>Total number of params</i>	$\approx 37,538$ (printed in log)
<i>FOL wrapper</i>	<code>PhysicsInformedFourierParametricOperatorLearning</code>
<i>Loss</i>	<code>Physics-informed Neo-Hookean FE residual (NeoHookeMechanicalLoss2DQuad)</code>
<i>Optimizer</i>	<code>Optax Adam, learning rate 1e-3</code>
<i>LR scheduler (unused here)</i>	<code>linear_schedule(1e-4 → 1e-5, transition_steps = 5000)</code>
<i>Max epochs</i>	<code>num_epochs = 5000</code>
<i>Convergence settings</i>	<code>relative_error = 1e-100, absolute_error = 1e-100</code> (effectively “epoch-based”)
<i>Train batch size (param.)</i>	<code>batch_size = 5</code>
<i>Train indices</i>	<code>0-179 → 180 samples</code>
<i>Test indices</i>	<code>181-199 → 19 samples</code> (sample 180 reserved for OTF)
<i>Training plots</i>	<code>total_loss, residual_rms_batch_mean</code> (physics residual RMS)
<i>Train checkpoint</i>	<code>Least-loss checkpoint every 100 epochs → . . . /flax_train_state</code>
<i>Final state save</i>	<code>flax_final_state</code> in the parametric output folder

OTF fine-tuning & FE solver hyperparameters (slide 3: “OTF from param”)

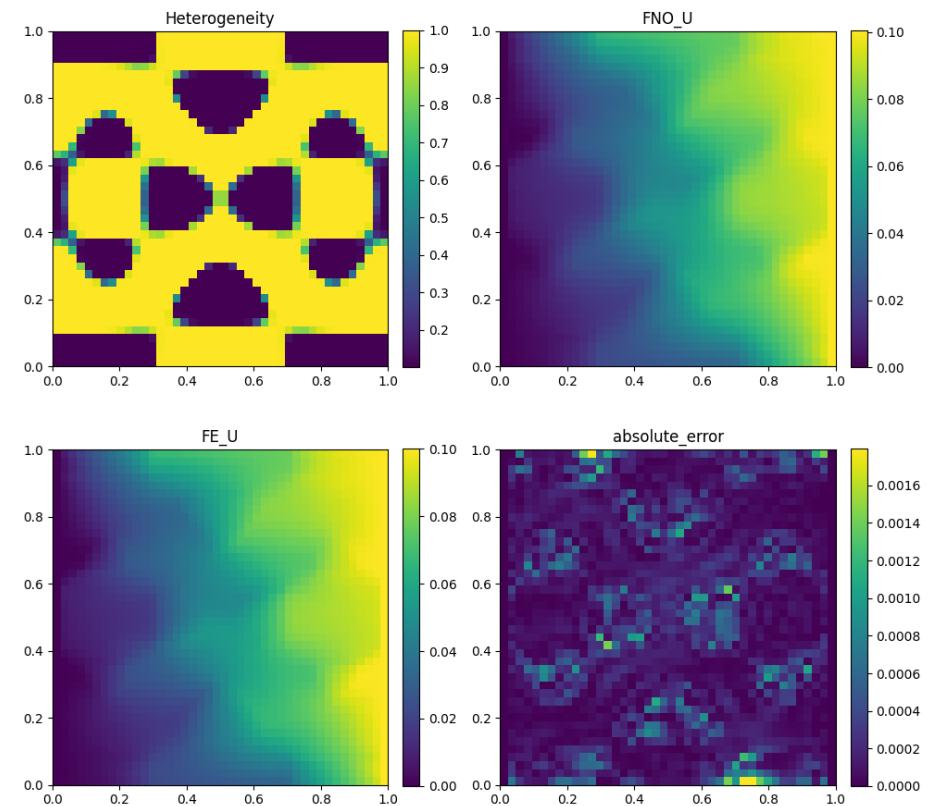
OTF PI-FNO (starting from parametric weights)

Category	Setting / Value
<i>Initial weights</i>	<i>Restored from parametric run:</i> <code>./nn_output_mechanical_2D_neohooke_pi_fno_param/flax_train_state</code>
<i>OTF sample ID</i>	<code>otf_id = 180</code>
<i>Train set (OTF)</i>	<i>Only coefficient vector of sample 180 (shape (1 \times n_coeff))</i>
<i>Test set (OTF)</i>	<i>Same as train: sample 180</i>
<i>parametric_learning flag</i>	<i>False (enables true on-the-fly mode)</i>
<i>Eval cases</i>	<code>eval_cases = [180]</code>
<i>Batch size (OTF)</i>	<code>batch_size = 1</code>
<i>Max epochs (OTF)</i>	<code>num_epochs = 5000</code>
<i>Convergence settings</i>	<i>Same: relative_error = 1e-100, absolute_error = 1e-100</i>
<i>Plots during OTF</i>	<i>total_loss, residual_rms_batch_mean saved in nn_output_mechanical_2D_neohooke_pi_fno_otf_from_param</i>
<i>Checkpoint directory (OTF)</i>	<code>./nn_output_mechanical_2D_neohooke_pi_fno_otf_from_param/flax_train_state</code>

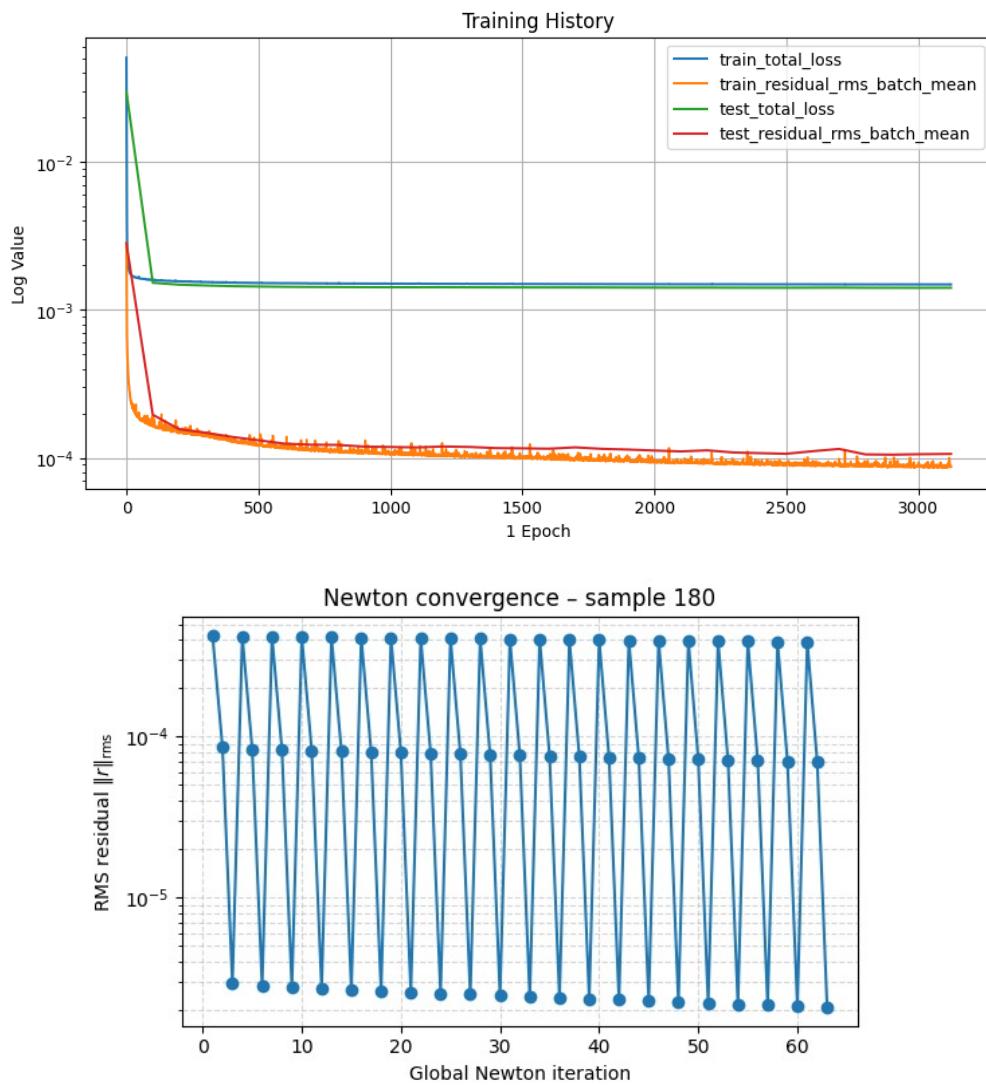
OTF- SLIDE 1



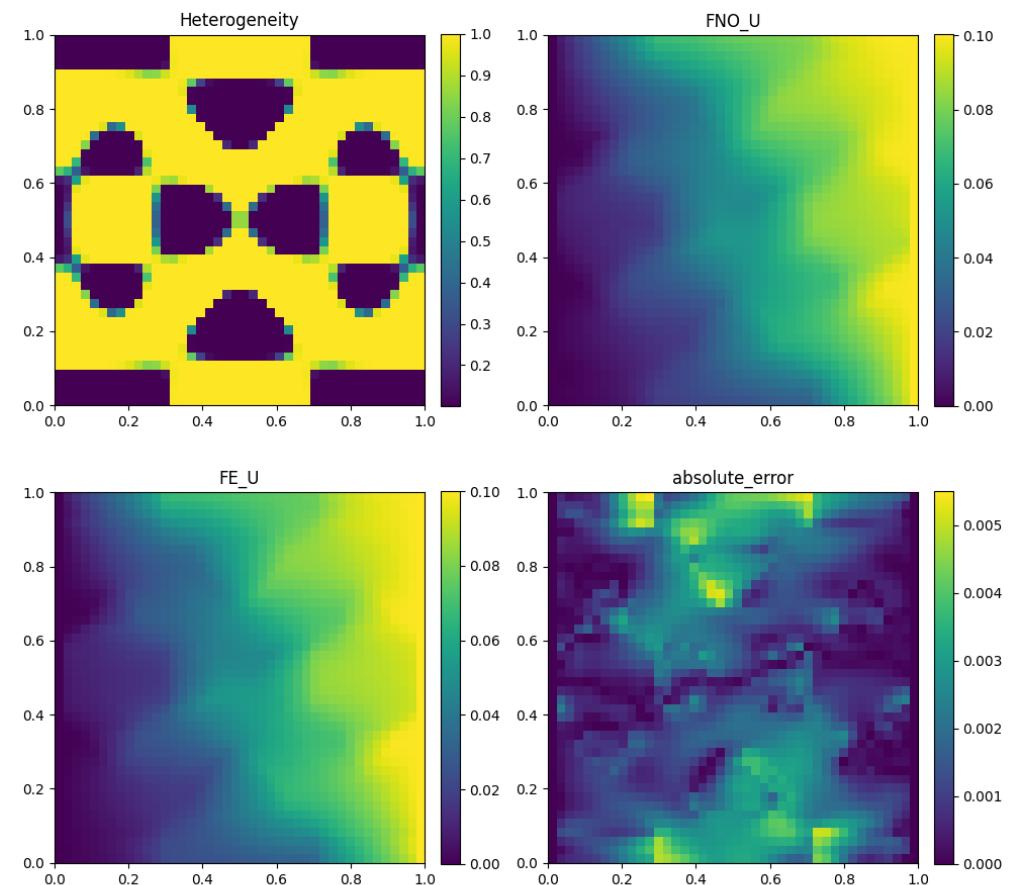
10 mins for training -2000 epochs



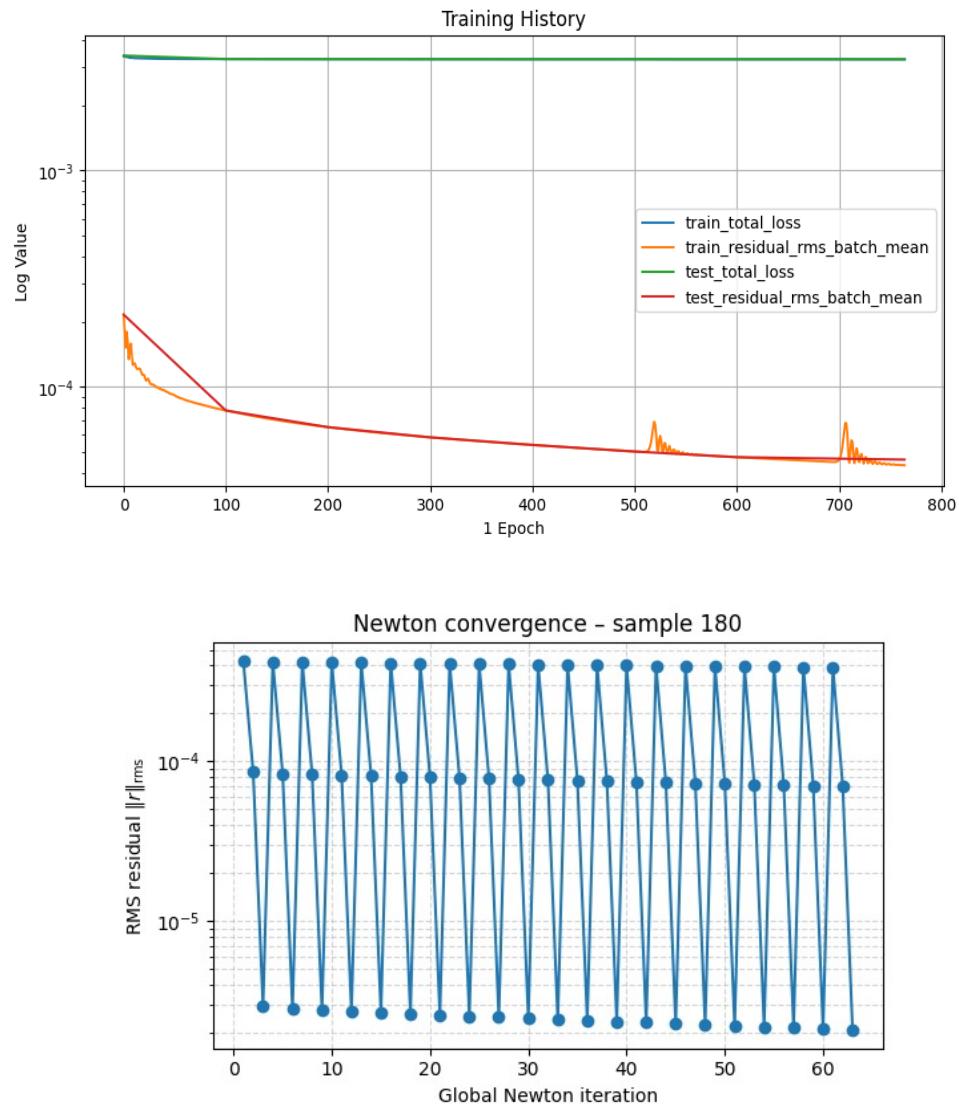
PARAMETRIC- SLIDE 2



30 mins for training –Auto Stopped between 3000-3500 epochs



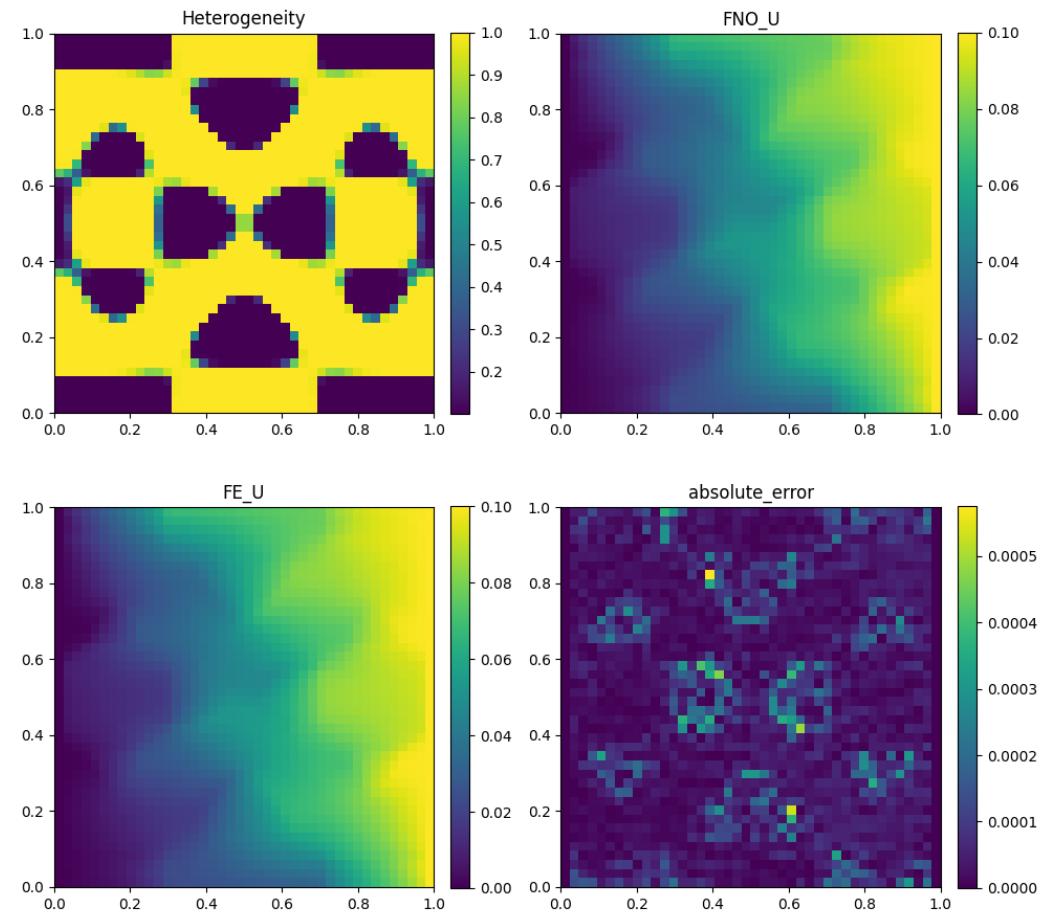
PARAMETRIC TRANSFER LEARN- SLIDE 3.1



5 mins for training – Auto Stopped between 700-800 epochs

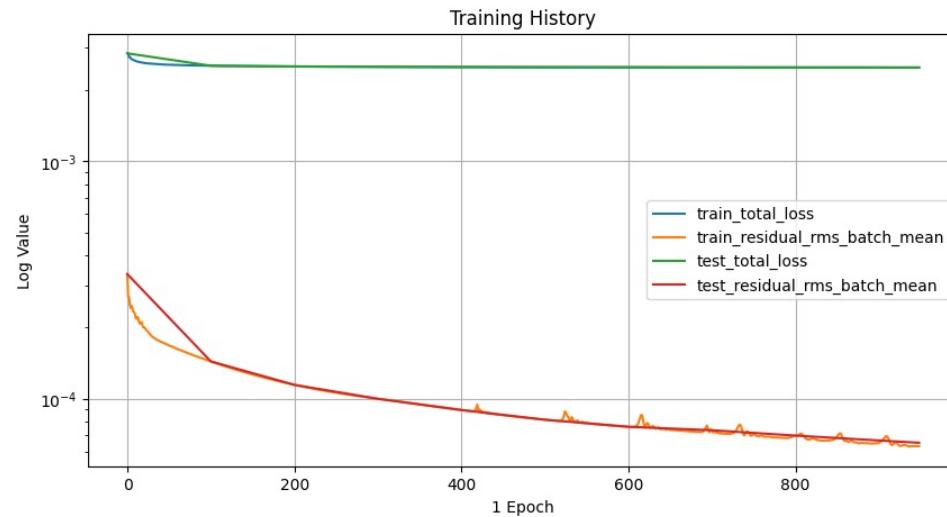
Absolute Error reduction = $0.005 - 0.0005 = 0.0045$

Relative improvement = $0.0045 / 0.005 = 0.9 = 90\%$

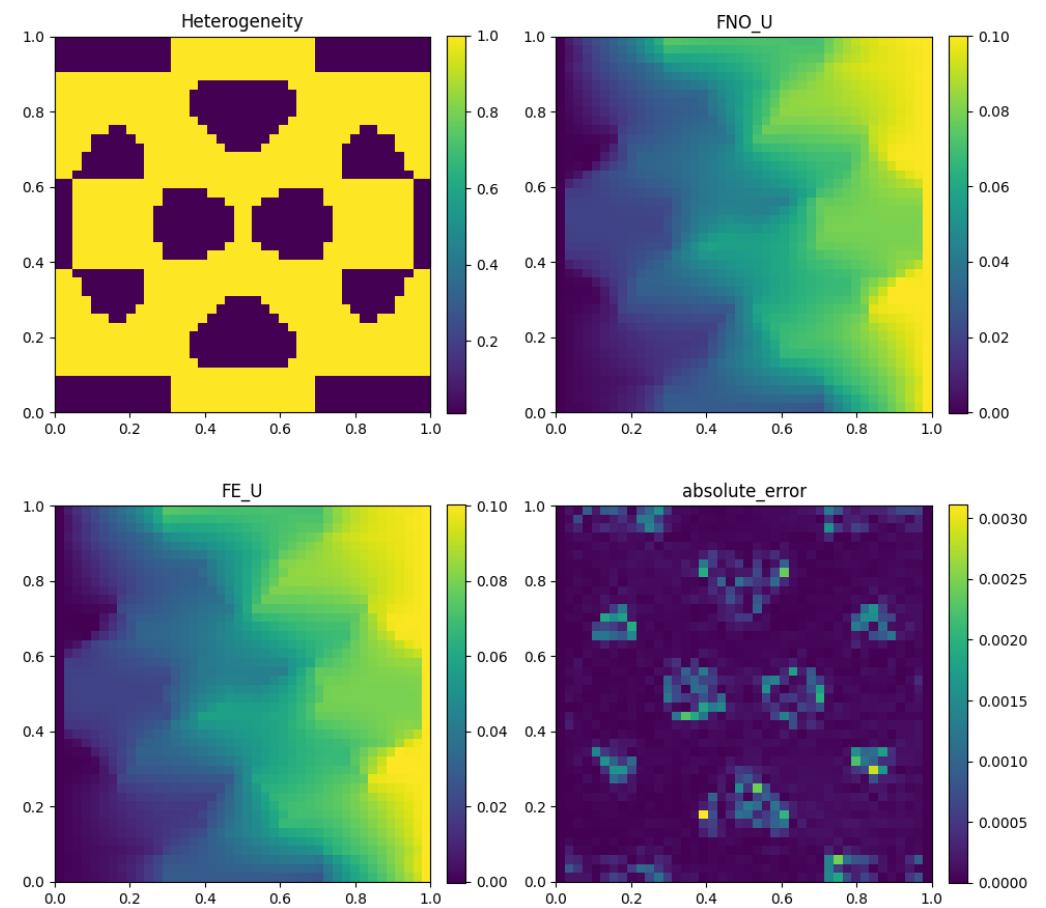
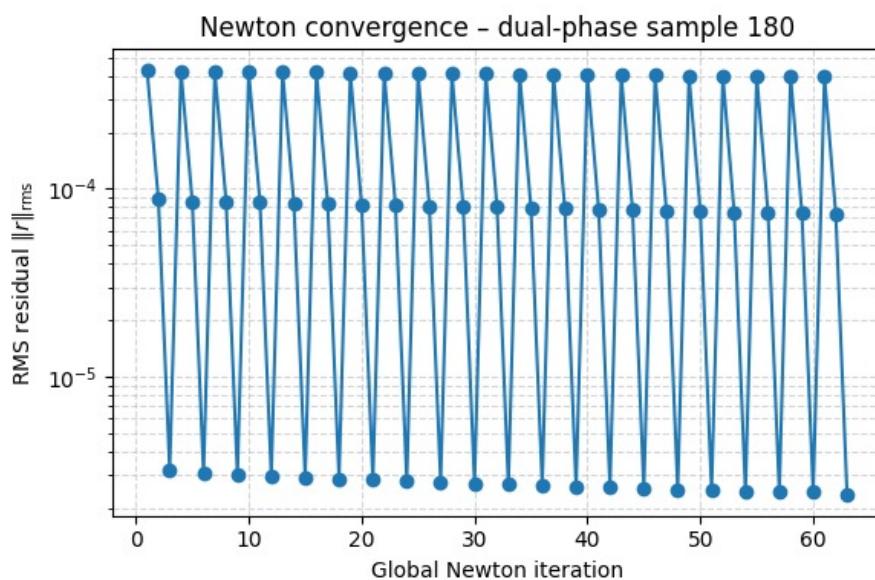


PARAMETRIC - TRANSFER LEARN - SLIDE 3.2

-Dual phase heterogeneous sample

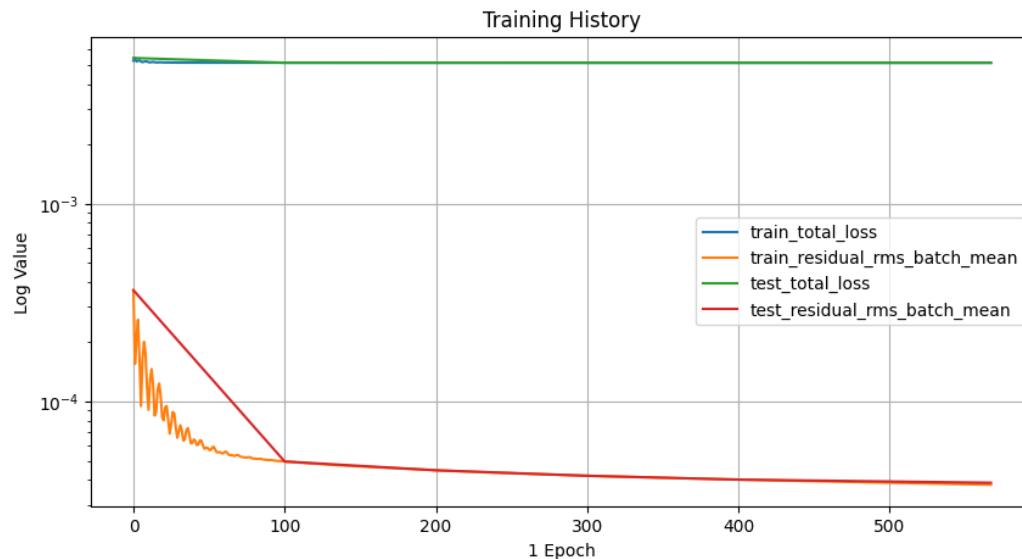


7 mins for training —Auto-Stopped between 700-800 epochs



PARAMETRIC TRANSFER LEARN- SLIDE 3.3

-Dual phase heterogeneous sample with Circular inclusion



4 mins for training —Auto-Stopped between 500-600 epochs

