## CodeLabs - Scientific Machine Learning

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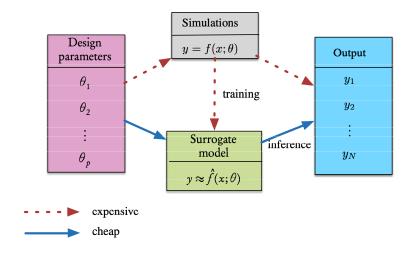
#### Program

- 1. Function approximation
- 2. Function learning
- 3. Parameter identification in a (P)DE
- 4. PINN for harmonic oscillator
- 5. DeepXDE tutorial and examples

## **SUMO**

### SUMO: Multiple, Nonlinear Regression

• Please recall the Surrogate Modelling principle:



- Multiple linear regression for predicting concrete strength
  - ⇒ 02Examples/SUMO/mlreg\_concrete.ipynb
- SVM regression for LIDAR data
  - ⇒ Olbasic-course/O2Examples/svm\_reg/svm\_reg.Rmd

- Nonlinear regression for cyclical/periodic data using feature engineering
  - $\Rightarrow$  02Examples/SUMO/cyclic\_data.ipynb

## **FUNCTIONS**

## Approximating and Learning Functions

- Learn a sine function
  - ⇒ 02Examples/PINN/pytorch\_NN\_fct\_approx.ipynb
- Learn a stepwise function
  - ⇒ 02Examples/PINN/pytorch\_NN\_single\_layer.ipynb

## PHYSICS CONSTRAINED LEARNING

#### Parameter Identification

- Constant parameter identification inverse problem for a (P)DE
  - $\Rightarrow$  02Examples/PINN/PCL\_1D\_param\_const.ipynb

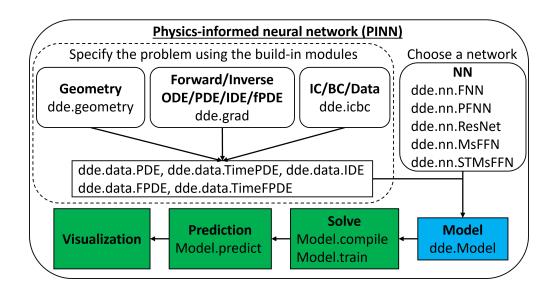
# PHYSICS INSPIRED NEURAL NETWORKS

#### PINN for ODE

- PINN for harmonic oscillator
  - $\Rightarrow$  02Examples/PINN/PINN\_harmonic.ipynb

#### PINN for PDEs with DeepXDE

- DeepXDE is a library for scientific machine learning and physics-informed learning. DeepXDE includes the following approaches:
  - ⇒ physics-informed neural network (PINN)
  - ⇒ (physics-informed) deep operator network (Deep-ONet)
  - → multifidelity neural network (MFNN)
- In this course, we will concentrate on PINN



- Installation is described on this page we will be using the PyTorch backend, which we have already installed...
  - ⇒ We recommend to create a new conda environment for DeepXDE and to install it, together with all its dependencies in this env

conda create -n deepxde23 python=3

```
conda activate deepxde23
conda install jupyter numpy matplotlib scipy
conda install scikit-learn scikit-optimize
conda install pytorch torchvision -c pytorch
conda install -c conda-forge deepxde
```

#### **DDE** Examples

- Learn a sine function
  - ⇒ 02Examples/DDE/dde\_fct\_learning.ipynb
- Learn solution to a very simple system of ODEs
  - ⇒ 02Examples/DDE/dde\_simpleODE.ipynb
- Learn solution to the Lotka-Volterra system of ODEs
  - ⇒ 02Examples/DDE/dde\_LK.ipynb
- Learn solution to the 1D Poisson equation with Dirichlet and Robin BCs
  - ⇒ 02Examples/DDE/dde\_Poisson1D.ipynb
- Learn solution to the 2D Poisson equation on an Lshaped domain
  - ⇒ 02Examples/DDE/dde\_Poisson2D..ipynb

#### References

1. Please consult the list provided on the website:

CODE REFERENCES