



# Root Storage of Deep Learning Models in TMVA

Sub-Org: Root-Project

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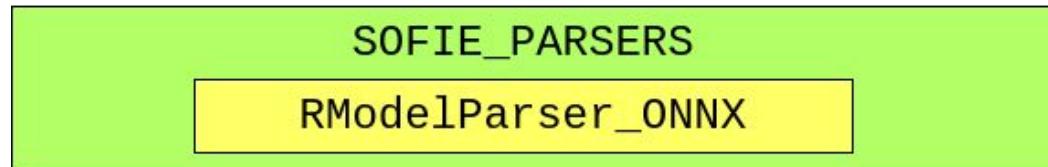
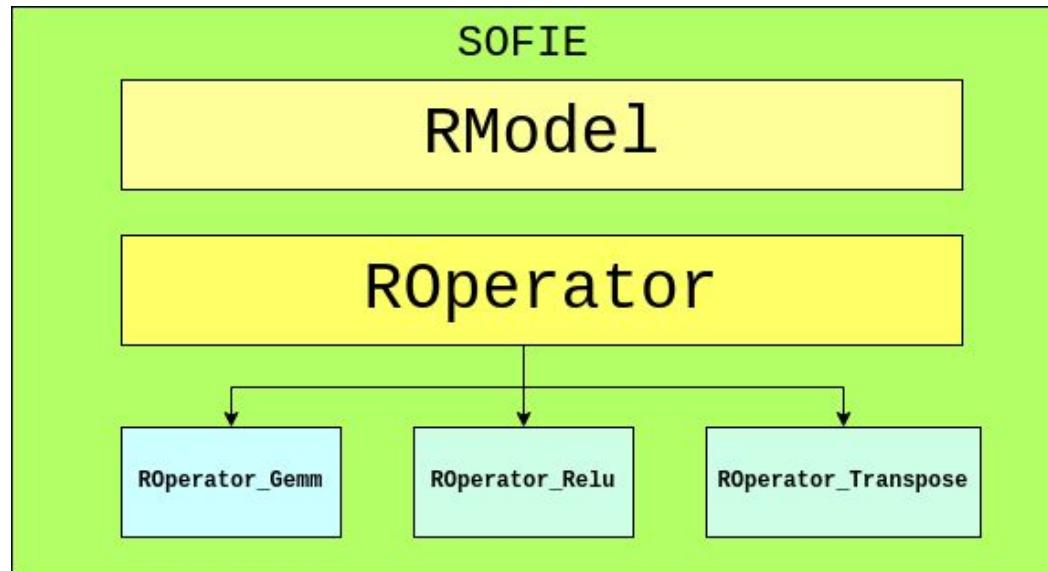
# About ROOT TMVA



## TMVA

- Toolkit for Multivariate Analysis
- Provides a Machine Learning environment for training, testing and evaluation of multivariate methods
- **Latest Development**
  - **SOFIE** (*System for Optimized Fast Inference code Emit*)
    - Intermediate Representation of trained deep learning models
      - Stores configuration & model weights of trained deep learning models following ONNX standards
    - Generation of Fast inference code having least latency and few dependencies.
      - Takes models as inputs and produces C++ header files containing easily invokable functions that can be included and utilized in a “plug-and-go” style.

# About TMVA SOFIE



# Project Description

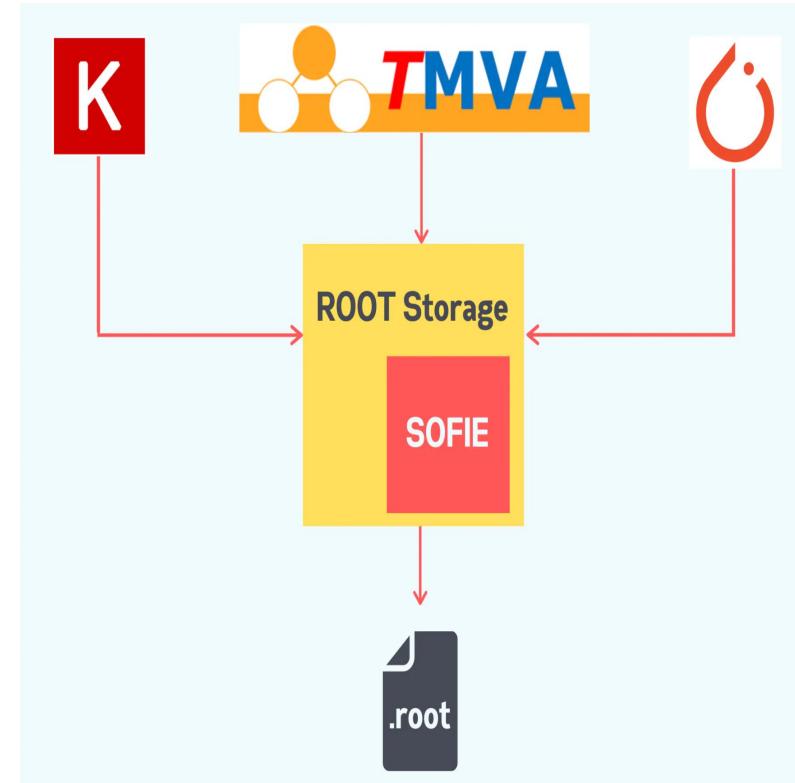
## Executed Tasks

- Serialization of RModel
- SOFIE Converter for Keras
- SOFIE Converter for PyTorch
- Tests & Tutorials

Serializing  
[+] Modified RModel, ROperator

Keras Converter  
[+] SOFIE::PyKeras::Parse()  
[+] SOFIE::PyKeras::ConvertToRoot()

PyTorch Converter  
[+] SOFIE::PyTorch::Parse()  
[+] SOFIE::PyTorch::ConvertToRoot()



# Serialization of RModel

Interface for writing root file

```
TFfile file("model.root","CREATE");
using namespace TMVA::Experimental;
SOFIE::RModelParser_ONNX Parser;
SOFIE::RModel model = Parser.Parse("./example_model.onnx");
model.Write("model");
file.Close();
```

Interface for reading root file

```
TFfile file("model.root","READ");
using namespace TMVA::Experimental;
SOFIE::RModel *model;
file.GetObject("model",model);
file.Close();
```

# SOFIE Keras Converter

## Interface

```
using TMVA::Experimental::SOFIE;

//Parser returns a RModel object
RModel model = PyKeras::Parse("trained_model_dense.h5");

//Converter writes a ROOT file directly
PyKeras::ConvertToRoot("trained_model_dense.h5");
```

# SOFIE PyTorch Converter

## Interface

```
using TMVA::Experimental::SOFIE;

//Building the vector for input shapes
std::vector<size_t> s1{120,1};
std::vector<std::vector<size_t>> inputShape{s1};

//Parser returns a RModel object
RModel model = PyTorch::Parse("trained_model_dense.pt",inputShape);

//Converter write3s a ROOT file directly
PyTorch::ConvertToRoot("trained_model_dense.pt",inputShape);
```

# ROOT Storage of BDT

## Expected Tasks

- Class for intermediate representation of TMVA trained BDT models
- Parse function for translating .xml files generated after training
- Mapping interface to TMVA Tree Inference

## Interface

```
using TMVA::Experimental;

RootStorage::BDT model;
bool usePurity = true;

//Parser loads the BDT model from .xml to RootStorage::BDT object
model.Parse("BDT_Model.weights.xml",usePurity);
```

# Conclusion

- Project Page  
[summerofcode.withgoogle.com/projects/#5424575602491392](https://summerofcode.withgoogle.com/projects/#5424575602491392)
- Final Report  
[github.com/sanjibansg/GSoC21-RootStorage/wiki](https://github.com/sanjibansg/GSoC21-RootStorage/wiki)
- Code Implementations  
[github.com/root-project/root/pulls?q=author:sanjibansg](https://github.com/root-project/root/pulls?q=author:sanjibansg)
- Documentation Blog  
[blog.sanjiban.ml/series/gsoc](https://blog.sanjiban.ml/series/gsoc)