# Parallelization of TMVA High Level Algorithms in ROOT



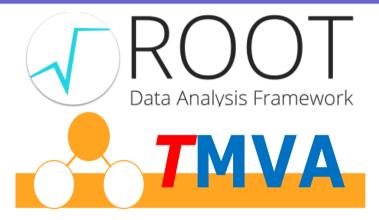
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## Outline



- TMVA
  - Motivation
  - Current status
  - New architecture
  - Parallelization
- Future outlook
- Conclusions



### Motivation

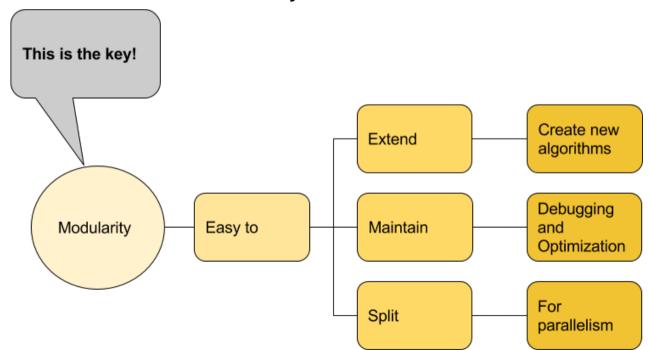
Some new developments in parallel computing in TMVA is growing without a global structure or design with differents paradigms that can to produce an unmaintenable software condensing all in some few classes with alot of dependecies.

The idea with this proposal is to implement a clear archquitecture for multiples parallel paradigms in TMVA that lets extend the differents algorimths with the differents paradigms.



## New architecture for TMVA

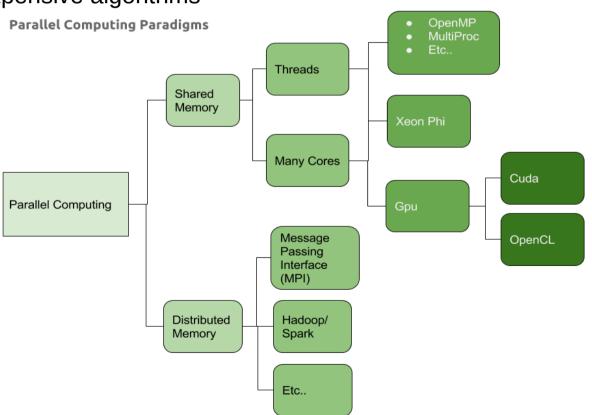
- Why?
  - Need to:
    - Parallelize the algorithms
    - Create more algorithms
    - Modularize the Factory





- Why parallel computing
  - Huge amount of data
  - Expensive algorithms

- Which paradigm
  - Many



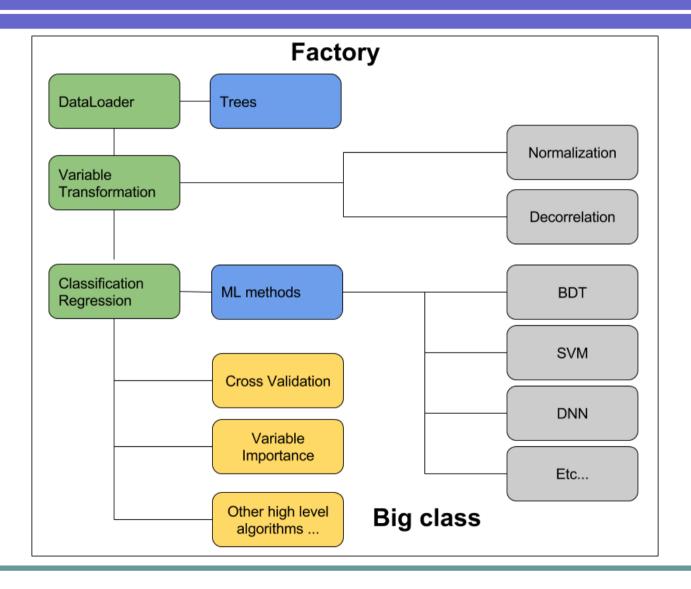


## Algorithms

- We divide the machine learning algoritms in two parts
  - The low level algorithms are the methods to Train/Tests a model like (Boosted Decision Trees, Multilayer Percepton, Support Vector Machine etc..)
  - High level algorithms are algorithms to do exploratory analysis or validation, like cross validation, variable importance, hyper parameter optimization etc..
- This proposal describe the architecture for high level algoritms.

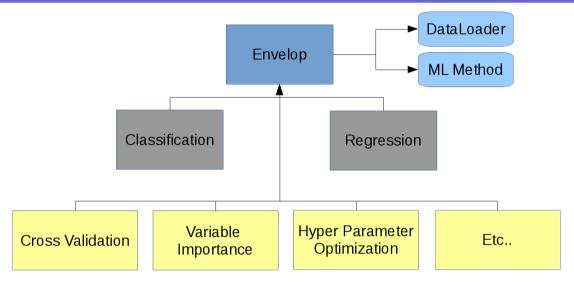


## Current status





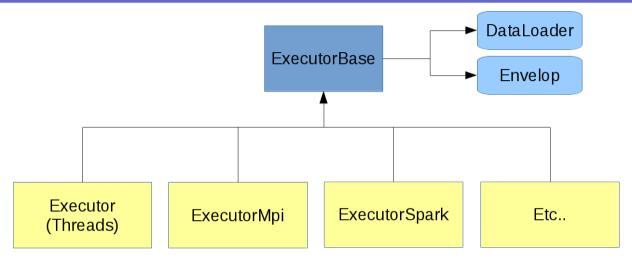
### Current status



https://github.com/root-project/root/blob/master/tmva/tmva/inc/TMVA/Envelope.h
https://github.com/root-project/root/blob/master/tmva/tmva/inc/TMVA/CrossValidation.h
https://github.com/root-project/root/blob/master/tmva/tmva/inc/TMVA/VariableImportance.h
https://github.com/root-project/root/blob/master/tmva/tmva/inc/TMVA/HyperParameterOptimisation.h
TODO:

- \* Create a class Classification and Regression that inherit from Envelop
- \* Deprecate Factory to move to the new architecture or rewirte factory that in the new architecture dont require the huge amount of code that is using.

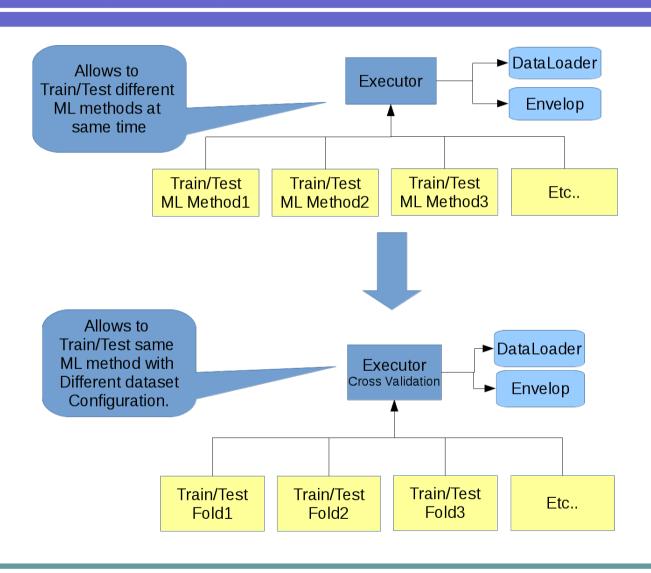




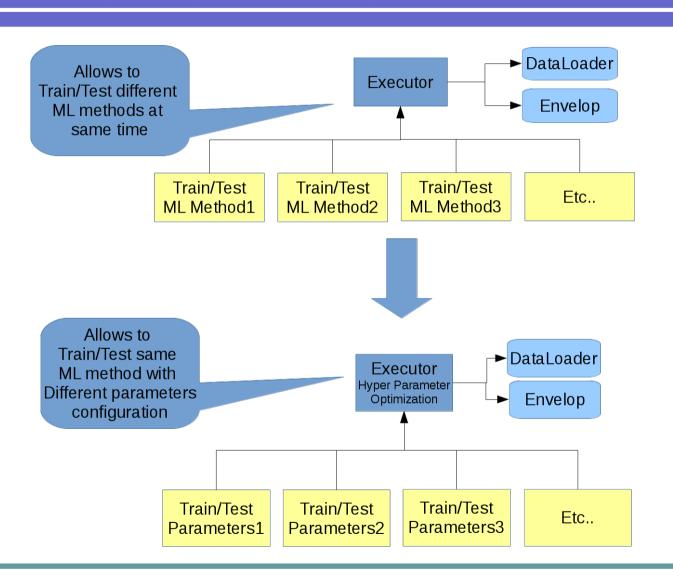
#### Prototype

https://github.com/oprojects/root/blob/master-tmva-pexecutor/tmva/ptmva/inc/TMVA/ParallelExecutorBase.h https://github.com/oprojects/root/blob/master-tmva-pexecutor/tmva/ptmva/inc/TMVA/ParallelExecutor.h https://github.com/oprojects/root/blob/master-tmva-pexecutor/tmva/ptmva/inc/TMVA/ParallelExecutorMpi.h

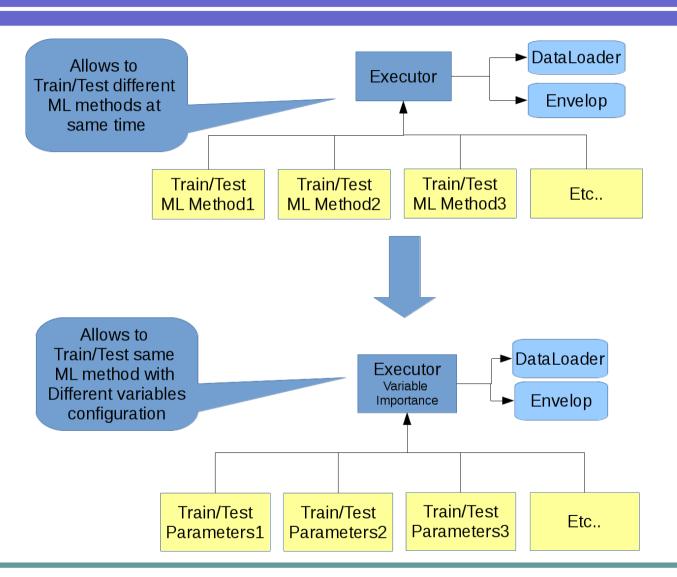














### Future outlook

- In general TMVA needs
  - Finish the new architecture
    - create the classes Classficiation and Regression
  - Integrate TMVA to ROOT plugins system
  - Doxygen documentation
  - More tests for ctest
  - New features from new c++ standards
  - To update de users guide
  - Deprecate the old website http://tmva.sourceforge.net/ and may to create a new one with updated documentation.
- Parallelization
  - Implement the design of the architecture for high level algorithms
  - Create a design to parallelize low level algorithms in a standart way.
  - Serialize more needed classes.
- Integrate new TMVA features.

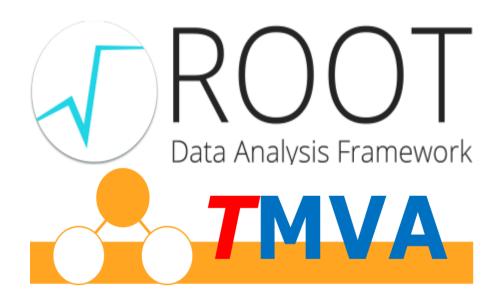


### Conclusions

- Modularity in TMVA
- Parallel architectures
  - Theads
  - MultiProc
  - Spark
  - Mpi
  - Gpu
- We need restructure TMVA according the new C++ standarts and we need to think in the future of TMVA with the new architecture for ROOT 7 to rewrite it using modern architectures.



### More Information



Website

http://oproject.org



# To finish

Thanks!

## BackUp

 A possible design for low level algorithms can be to specify in the booking options with parallel architecture do you want to use, in a similar way that the current DNN method.

```
factory->BookMethod(dl, TMVA::Types::kDNN,"DNN","Architecture=GPU:..."); factory->BookMethod(dl, TMVA::Types::kBDT,"BDTG","Architecture=CPU:..."); factory->BookMethod(dl, TMVA::Types::kBDT,"SVM","Architecture=Spark:..."); ....
```