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# Integration of Meta Machine Learning in GenoML

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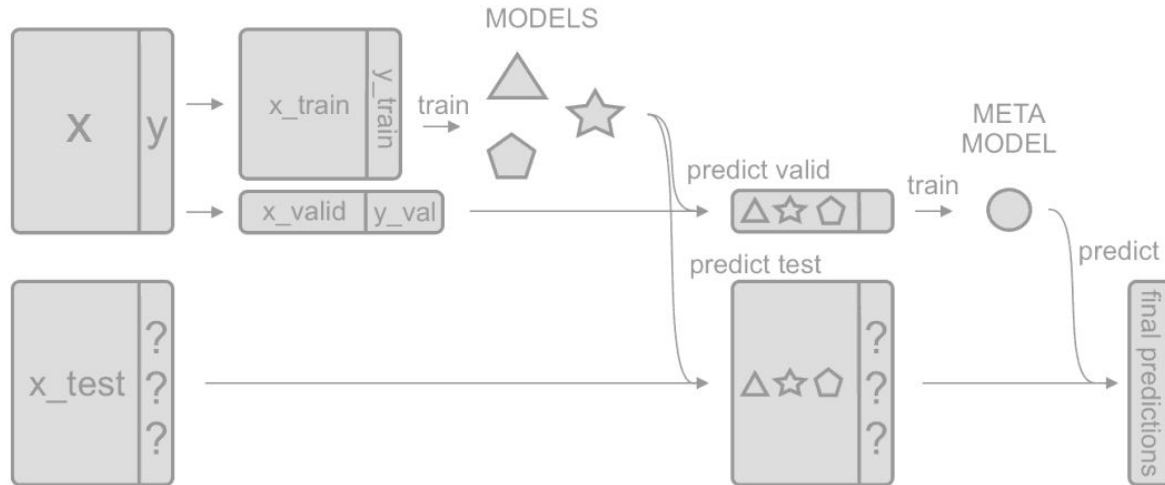
1. Meta Machine Learning.
2. Code.
3. Using the tool.

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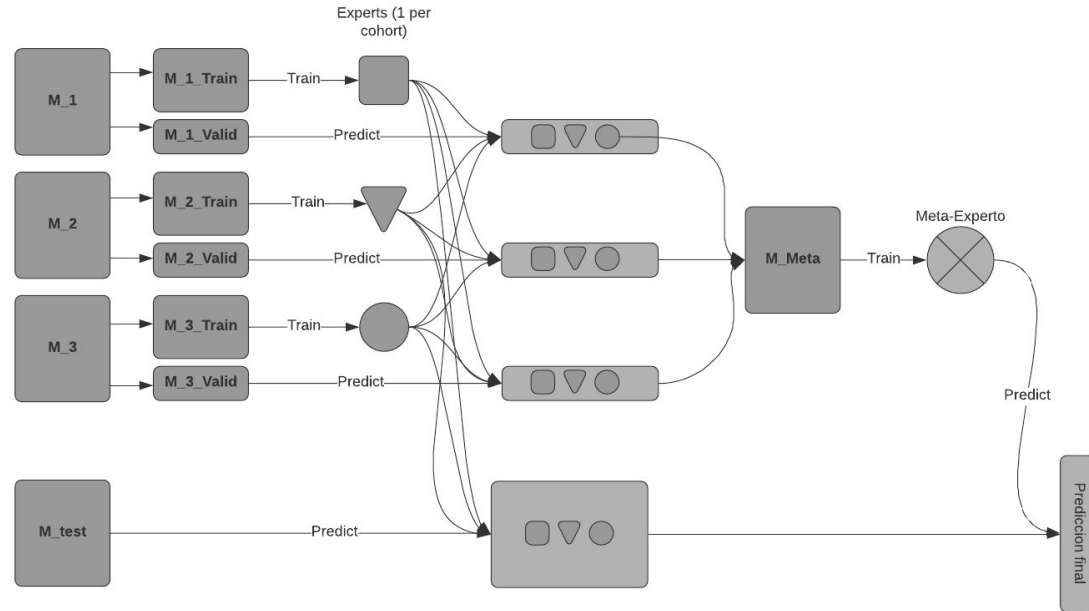
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# Meta-ml as a basic algorithm in GenoML

## Stacking



# Meta-ML as a multi-silo integration algorithm in GenoML





## Loss of accuracy for using a multi-silo approach with nSmE

Algorithm	Mean	Confidence interval
QuadraticDiscriminantAnalysis	50.3%	48.3 - 52.3
RandomForestClassifier	56.7%	54.5 - 58.9
MML nSmE	62.5%	58.7 - 66.2
LogisticRegression	71.7%	71.7 - 71.7
SGDClassifier	72.1%	68.5 - 75.7

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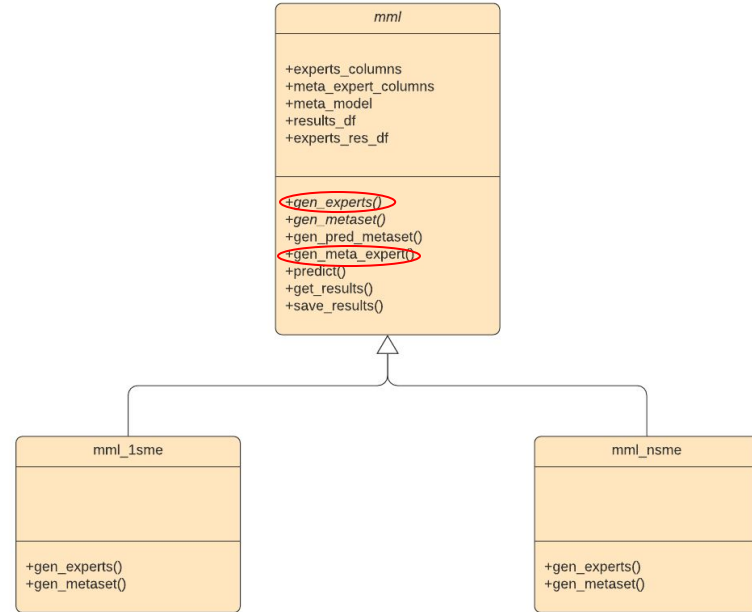
# Code

Class hierarchy:

- Abstract class mml
- Classes inheriting from mml

gen\_experts and gen\_meta\_expert use GenoML  
base functionality.

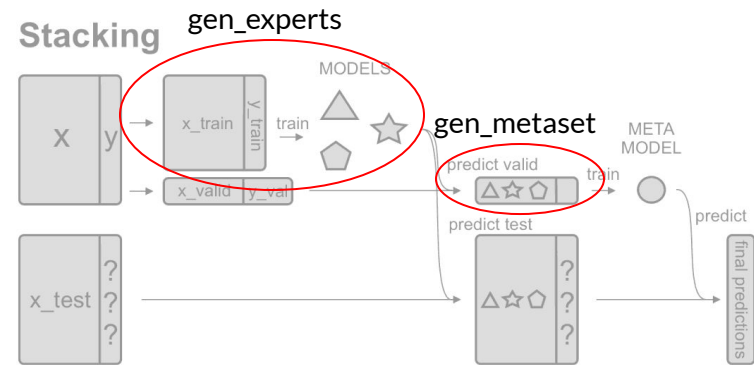
[https://github.com/edusalcas/TFG\\_MML\\_GenoML](https://github.com/edusalcas/TFG_MML_GenoML)





## Code - mml abstract methods

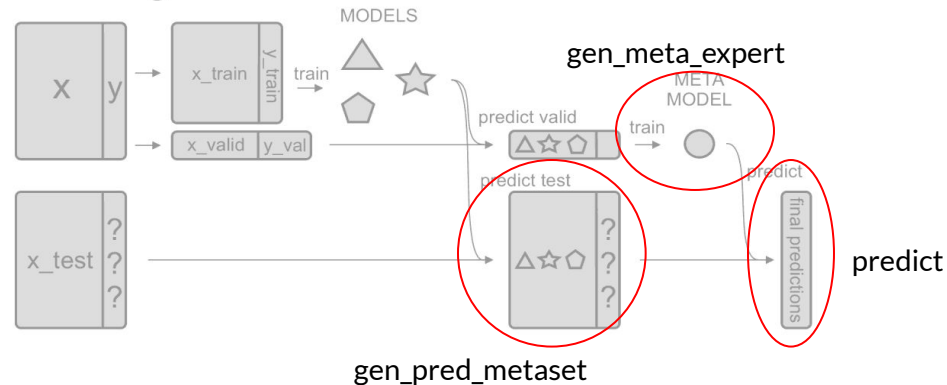
```
68
69     @abstractmethod
70     def gen_experts(self,
71                     path,
72                     expert_names=None,
73                     prefix=None,
74                     metric_max=None,
75                     seed=None,
76                     metric_tune=None,
77                     max_tune=None,
78                     algs=None):
79         pass
80
81     @abstractmethod
82     def gen_metaset(self,
83                     data,
84                     experts_path,
85                     experts_names):
86         pass
87
```



## Code - mml methods

```
87
88 def gen_pred_metaset(self, data, experts_path, experts_names, path, meta_prefix): ...
117
118 def gen_meta_expert(self, data, path, experts_names, prefix, metric_max, algs, seed, metric_tune, max_tune): ...
135
136 def predict(self, data, path, experts_names, meta_prefix, iteration=0): ...
152
```

### Stacking





## Code - mml\_1sme and mml\_nsme methods

```
12
13 class MML_1SmE(MML):
14
15     def gen_experts(self, path, expert_names=None, prefix=None, metric_max=None, se
28
29     def gen_metaset(self, data, experts_path, experts_names): ...
49
```

```
12
13 class MML_nSmE(MML):
14
15     def gen_experts(self, path, expert_names=None, prefix=None, metric_max=None, se
28
29     def gen_metaset(self, data, experts_path, experts_names): ...
71
```

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# Workflow

- |                                       |       |   |
|---------------------------------------|-------|---|
| 1. Munge data.                        |       | 1. Munging from GenoML.                 |
| 2. Split train-test.                  |       | 2. train_test_split from sklearn        |
| 3. <b>Generate level one experts.</b> | ----> | 3. <b>gen_experts from our code</b>     |
| 4. <b>Generate meta-expert.</b>       |       | 4. <b>gen_meta_expert from our code</b> |
| 5. <b>Predict.</b>                    |       | 5. <b>predict from our code</b>         |

In points 3 and 4, we use train and tune functions from GenoML.



## Example - Experiment with MML 1SmE

```
109
110     manager_mml = MML_1SmE(actual_path + prefix)
111
112     # Generate level 1 experts
113     manager_mml.gen_experts(path=actual_path,*
114                             expert_names=algorithms,*
115                             prefix=train_prefix,*
116                             metric_max=metric,*
117                             seed=seed,
118                             metric_tune=metric,*
119                             max_tune=tune_iterations)*
120
121     # Generate level 2 expert
122     manager_mml.gen_meta_expert(data=dataForML_test,
123                                path=actual_path,*
124                                experts_names=algorithms,
125                                prefix=meta_prefix,*
126                                metric_max=metric,*
127                                algs=algorithms_names,*
128                                seed=seed,
129                                metric_tune=metric,*
130                                max_tune=tune_iterations)*
131
132     # Predict test set
133     balacc = manager_mml.predict(data=test_df,
134                                 path=actual_path,
135                                 experts_names=algorithms,
136                                 meta_prefix=meta_prefix,
137                                 iteration=n)
```

\*: Parameters needed for base GenoML functions

\*: Parameters needed for modified GenoML Train Function.



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# End

Thanks for your attention