

About

The landscape of predictive toxicology has utterly changed after the completion of the FP7-funded EU research project **OpenTox** [1] which established new standards for systems of distributed toxicological computation. **JAQPOT** is a bundle of **web services**, compliant to the **OpenTox Application Programming Interface** [2] and provides access to Machine Learning algorithms and data processing routines particularly tailored to the needs of predictive toxicology. End-users may exploit its functionalities either through web interfaces or programmatically. Toxicologists, biologists and other scientists can make the best out of their data using a transparent, modular and interoperable computational platform on the web. **Confidential in-house data** can also be integrated securely by means of an access control infrastructure based on Single Sign-On.

JAQPOT is available online at <http://opentox.ntua.gr:8080> and is accessible through its REST interface, or can be downloaded from <https://github.com/alphaville/jaqpot3> and installed locally on one's LAN following the instruction found at <http://opentox.ntua.gr/blog/14-standalone-installation-jaqpot3>.

Machine Learning Algorithms

JAQPOT provides access to a number of algorithms for model training and data preprocessing. According to the OpenTox API v1.2 algorithms interface.

Description	Method	URI	Result
Get a list of the URIs of all available algorithms	GET	/algorithm	List of all algorithm URIs or RDF representation of specific types in presence of a query parameter.
Get the ontological representation of an algorithm	GET	/algorithm/{id}	Algorithm representation in one of the supported MIME types.
Apply the algorithm	POST	/algorithm/{id}	The result is either a model URI, a dataset URI or a feature URI depending on the specifications of the algorithm. Long-running processes return the URI of a Task.

This is an excerpt from the ontological representation of the SVM algorithm of JAQPOT:

```
<http://opentox.ntua.gr:8080/algorithm/svm>
  a ota:EagerLearning, ot:Algorithm, ota:Regression, ota:SingleTarget;
  rdfs:comment "Representation automatically generated by ToxOtis."^^xsd:string;
  dc:date "Mon Apr 29 16:50:25 EEST 2013"^^xsd:dateTime;
  dc:description "Algorithm for training ..."^^xsd:string;
  dc:identifier "http://opentox.ntua.gr:8080/algorithm/svm"^^xsd:anyURI;
  dc:publisher "http://opentox.ntua.gr:8080/"^^xsd:string;
```

The tuning parameters of an algorithm (e.g. the gamma parameter of an SVM algorithm) have an ontological representation as well. Here is an example:

```
<http://opentox.ntua.gr:8080/prm/svm_gamma>
  a ot:Parameter;
  rdfs:comment "Only strictly positive values are acceptable"^^xsd:string;
  dc:description "Gamma Parameter for the SVM kernel"^^xsd:string;
  dc:identifier "http://opentox.ntua.gr:8080/prm/svm_gamma"^^xsd:anyURI;
  dc:title "gamma"^^xsd:string;
  ot:paramScope "OPTIONAL"^^xsd:string;
  ot:paramValue "1.5"^^xsd:double;
```

The following algorithms are available in JAQPOT:

- Fast RBF Neural Networks:** The algorithm is based on the subtractive clustering technique and has a number of advantages compared to the traditional learning algorithms including faster training times and more accurate predictions. Due to these advantages the method proves suitable for developing models for complex nonlinear systems [3].
- Partial Least Squares:** PLS is a standard, widely used supervised algorithm for dimension reduction on datasets.
- Scaling:** This web service is intended to scale the numeric values of an OpenTox dataset within a specified range. If not otherwise specified by the client, this range is assumed to be [-1,1]. Scaling is necessary for algorithms like SVM and Neural Networks as it substantially improves the accuracy of the trained models.
- Support Vector Machines**
- Missing Value Replacer:** Replaces the missing values in a dataset using the means-and-modes technique.
- Leverage:** Algorithm for the estimation of the Domain of Applicability of a model.
- Multiple Linear Regression**

Train, Evaluate and Use (Q)SAR Models in JAQPOT

Before the users can use any of the services of JAQPOT they should authenticate their credentials against the SSO server of OpenTox and receive an **authentication token**: Here is an example cURL request:

```
curl -X POST http://opensso.in-silico.ch/opensso/identity/
authenticate?uri=service=openldap -k -d username=guest -d
password=guest
```

This request will return a token to the client (if the provided credentials are correct). For instance:

```
token.id=AQIC5wM2LY4sf..b79U80jM.*AAJTSQACMDE.*
```

This token is passed to the algorithm service using the Header **subjectid** along with the tuning parameters of the algorithm, the URI of the dataset and the URI of the target feature.

```
curl -X POST http://opentox.ntua.gr:8080/algorithm/fastRbfNn
-d dataset_uri=http://apps.ideaconsult.net:8080/ambit2/dataset/R545
-d prediction_feature=http://apps.ideaconsult.net:8080/ambit2/
feature/22200 -d a=1.0 -d b=0.86 -d e=0.6
-H "subjectid:AQIC5wM2L..CMDE.*" -H Accept:text/uri-list
```

This will return the URI of a task which upon completion will return the URI of a model.

Train a model

Specify the dataset that will be used for the training and the prediction feature URI from this dataset. Provide your preferred feature service (it is suggested to use the default one).

Dataset URI

Prediction Feature

Feature Service

Parameters

A simple **HTML interface** has also been setup for easier consumption of the web services.

Task Status	RUNNING
HTTP Status	202.0
Completed	84.1886
Created by	guest@opensso.in-silico.ch

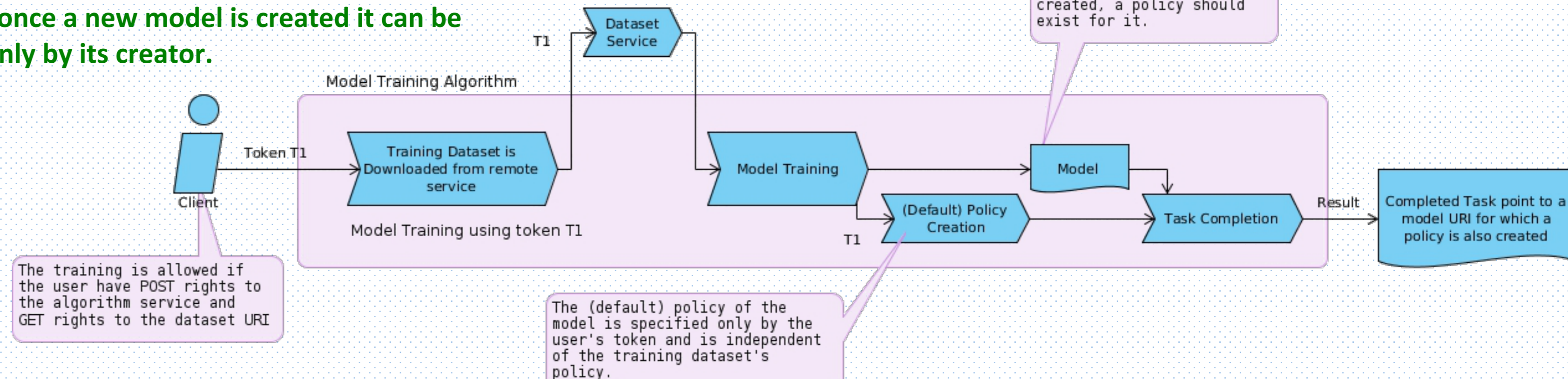
Task Status	COMPLETED
HTTP Status	200.0
Result URI	http://opentox.ntua.gr:8080/model/005cb503-30ed-4792-9de6-3b0e948969de
Duration	2234ms
Created by	guest@opensso.in-silico.ch

Dependent Feature(s)	1. http://apps.ideaconsult.net:8080/ambit2/feature/22200
Predicted Feature(s)	1. http://apps.ideaconsult.net:8080/ambit2/feature/9056226
Independent Features	1. http://apps.ideaconsult.net:8080/ambit2/feature/22127 2. http://apps.ideaconsult.net:8080/ambit2/feature/22137 3. http://apps.ideaconsult.net:8080/ambit2/feature/22147 4. http://apps.ideaconsult.net:8080/ambit2/feature/22157
Training Algorithm	http://opentox.ntua.gr:8080/algorithm/parameter/4488127855727681952
Training Dataset	http://apps.ideaconsult.net:8080/ambit2/dataset/parameter-5623115906601829592

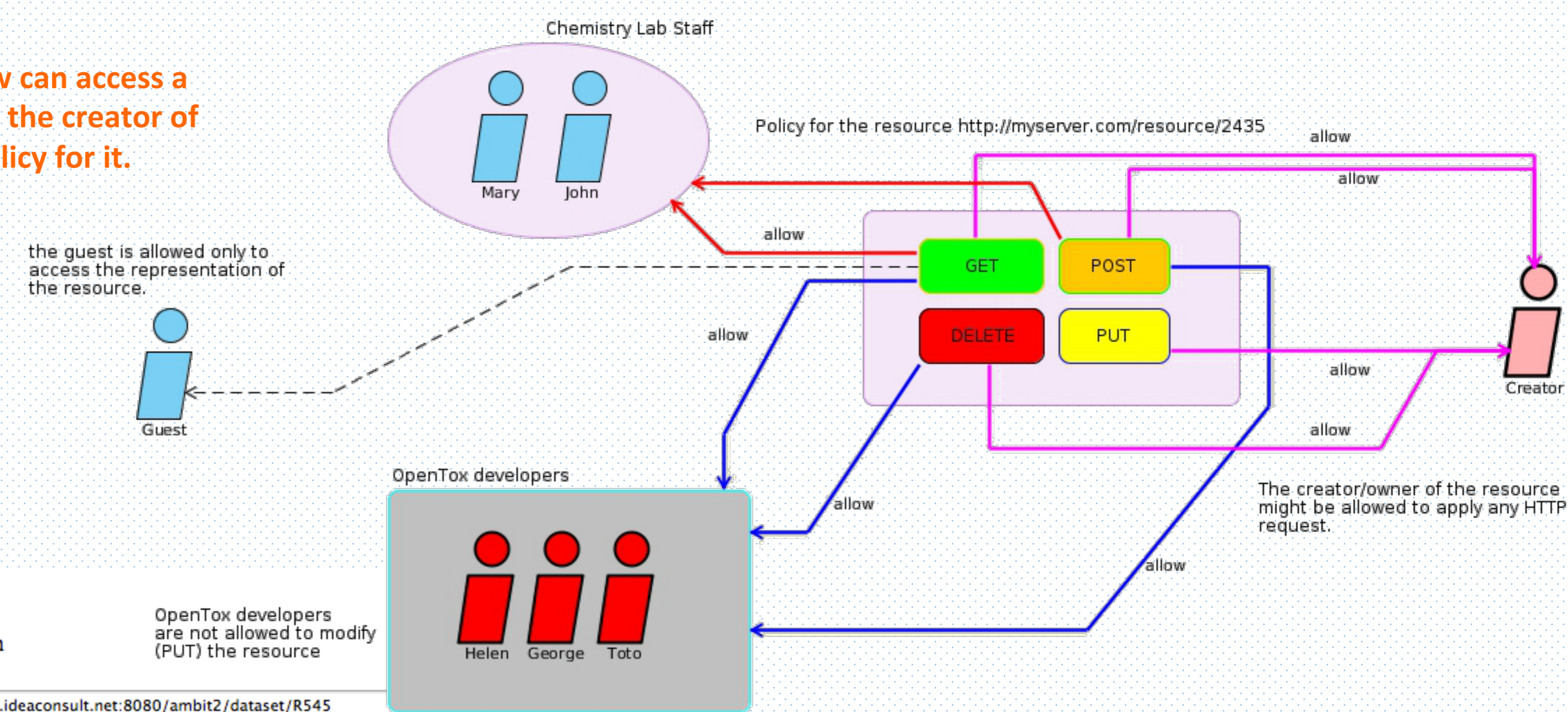
Parameter URI	Parameter Name	Value
/parameter/4488127855727681952	e	0.6
/parameter-5623115906601829592	b	0.9
/parameter-3787369480800473005	a	1.0

The client can monitor the progress of a running task through the Task interface.

DEFAULT POLICY: Unless otherwise specified by the client, once a new model is created it can be accessed only by its creator.



POLICIES define who and how can access a resource (e.g. a Model). Only the creator of a resource can modify the policy for it.



Use the model

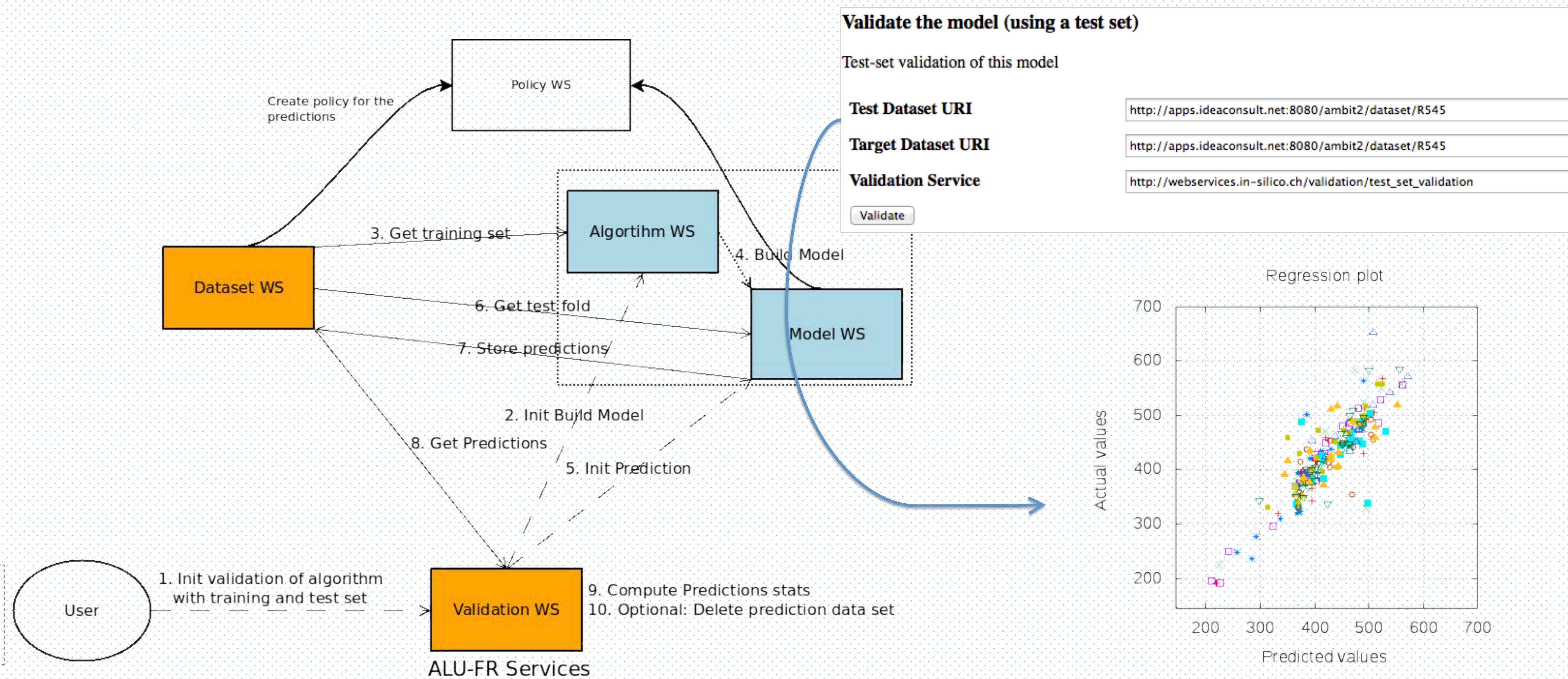
Specify the dataset you want to submit for prediction

Dataset URI

Dataset Service

Use a (Q)SAR model to perform a prediction (This will create a new dataset with the estimated properties and the corresponding experimental values – if any – are stored):

```
curl -X POST opentox.ntua.gr:8080/model/005cb503-30ed-4792-9de6-3b0e948969de-d dataset_uri=
apps.ideaconsult.net:8080/ambit2/dataset/R545 -H
"subjectid:AQIC5wM2L..CMDE.*" -H Accept:text/uri-list
```



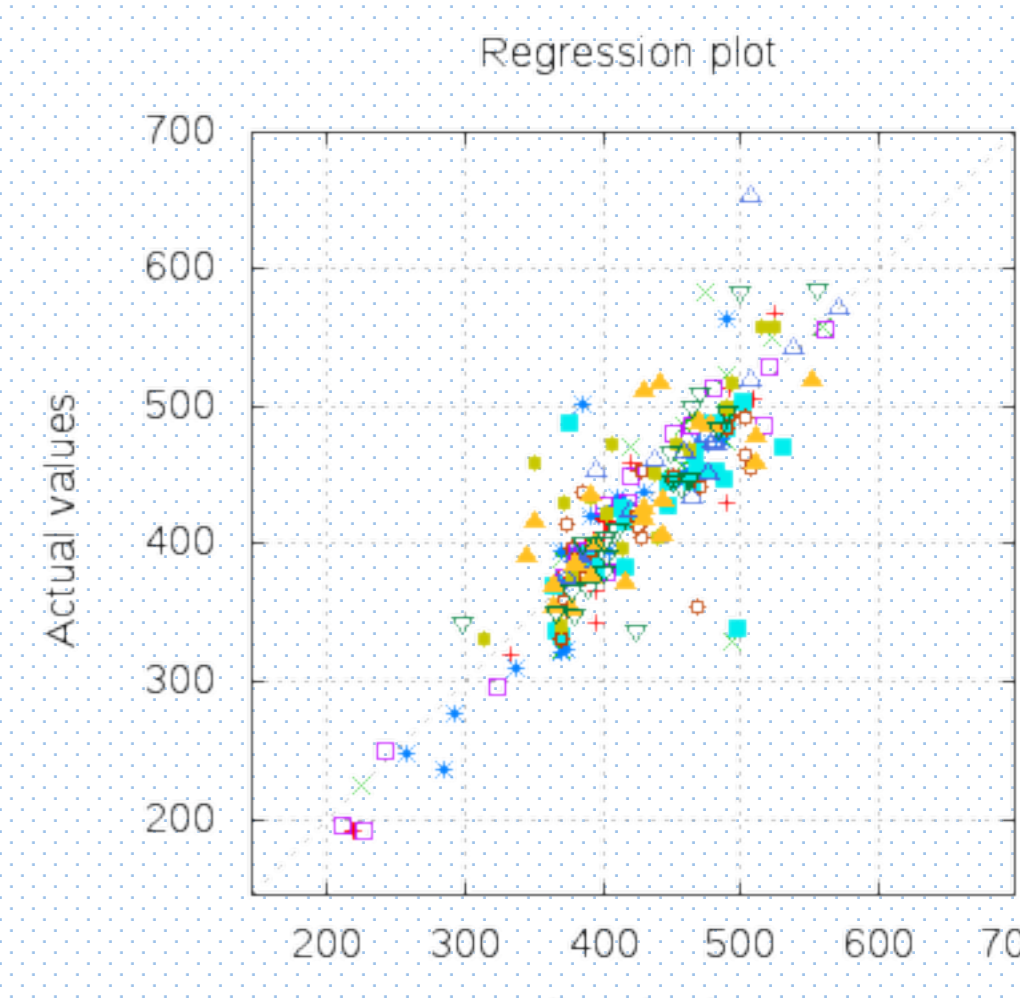
Validate the model (using a test set)

Test-set validation of this model

Test Dataset URI

Target Dataset URI

Validation Service



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References

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