

#### Workshop



Demo and tutorial

Annual AMIDST meeting Trondheim, June 28 2016





# Introduction

Downloading and setting up material for the tutorial



#### System Requirements





Check your java version:

\$ java -version

 http://www.oracle.com/technetwork/ja va/javase/downloads/



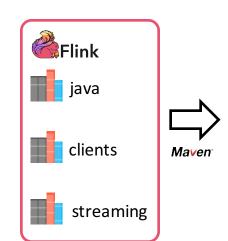
https://www.jetbrains.com/idea/

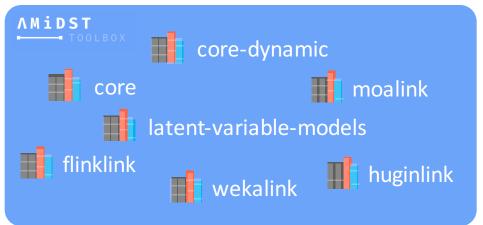


#### Overview













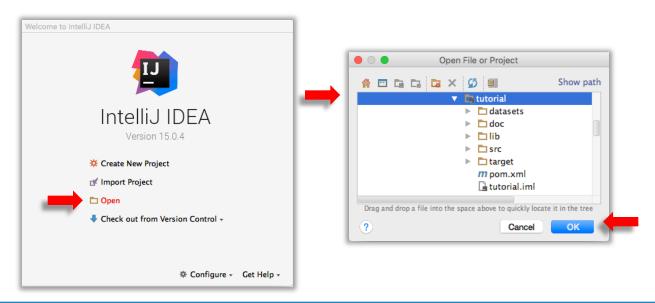
#### Setting up



Step 1: Download the example project

\$ git clone https://github.com/amidst/tutorial.git

Step 2: Open the downloaded project with IntelliJ:

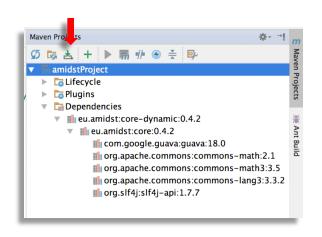


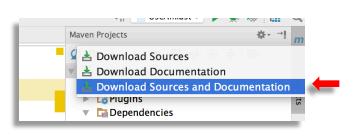


#### Setting up



Step 3: Download source code and javadoc







#### **Project Structure**



The downloaded project contains:

datasets: ARFF files used in the tutorial

doc: these slides

lib: hugin library

src/main/java: code examples using AMiDST

m pom.xml: maven dependencies definition



#### Latent-variable-models



- The module latent-variable-models contains a large set of classes for easily learning some of the models in the literature.
  - - ▼ classifiers

      - 6 6 Classifier
      - 🕏 🚡 GaussianDiscriminantAnalysis
      - ☑ B HODE
      - ☑ ७ LatentClassificationModel
      - ☑ ७ NaiveBayesClassifier
      - ☑ TAN
    - exceptions
      - ு BayesianLinearRegression

        □ BayesianLinearRegressio
      - 😅 🚡 FactorAnalysis
      - 😅 🖰 GaussianMixture
      - ு ™ MixtureOfFactorAnalysers
      - 🐿 🚡 Model

- dynamicmodels
  - ▼ classifiers
    - **b** DynamicClassifier
    - © DynamicLatentClassificationModel
    - ☑ ቕ AutoRegressiveHMM
    - 📵 🕫 DynamicModel
    - 😅 🖥 FactorialHMM
    - ☑ ቕ HiddenMarkovModel

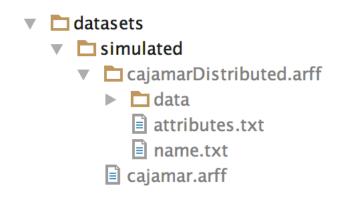
    - ♂ ъ SwitchingKalmanFilter



#### **Datasets**



We will see some examples using two datasets:



The data can be generated with CreateCajamarDataContinuous.java



10

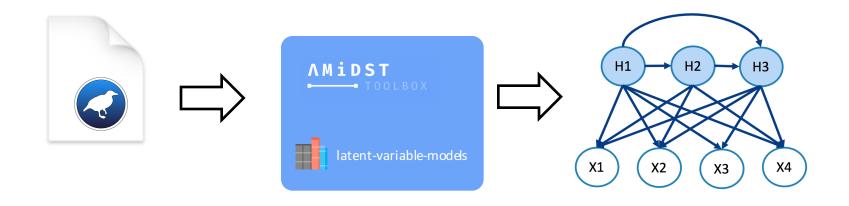
# **Static Models**

A set of code examples for **easily** learning and making inference with static PGMs



# Static models (learning)





ARFF file Static BN



#### Static models (learning)



```
//Load the datastream
String filename = "datasets/simulated/cajamar.arff";
DataStream<DataInstance> data = DataStreamLoader.open(filename);

//Learn the model
Model model = new FactorAnalysis(data.getAttributes());
model.updateModel(data);
BayesianNetwork bn = model.getModel();

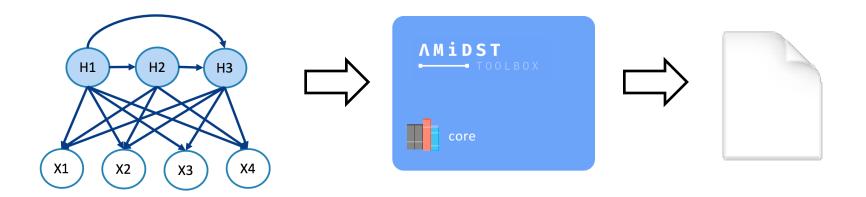
System.out.println(bn);
```



StaticModelLearning.java

# Static models (save to disk)





Static BN

.bn file .net file



#### Static models (save to disk)



```
// Save with .bn format
BayesianNetworkWriter.save(bn, "networks/simulated/exampleBN.bn");

// Save with hugin format
BayesianNetworkWriterToHugin.save (bn, "networks/simulated/exampleBN.net");
```

- Note: make sure that you have the following files in your classpath:
  - hgapi83\_amidst-64.jar
  - libhgapi83\_amidst-64.jnilib
- For adding folders to your class path:

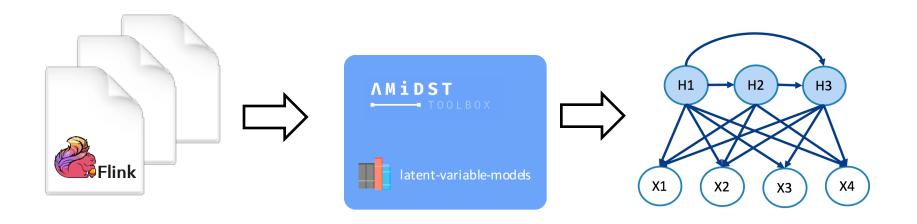
-Djava.library.path="...."





### Static models (learning from flink)





ARFF folder Static BN



#### Static models (learning from flink)



```
//Load the datastream
String filename = "datasets/simulated/cajamarDistributed.arff";
final ExecutionEnvironment env = ExecutionEnvironment.getExecutionEnvironment();
DataFlink<DataInstance> data = DataFlinkLoader.loadDataFromFolder(env, filename, false);

//Learn the model
Model model = new FactorAnalysis(data.getAttributes());
model.updateModel(data);
BayesianNetwork bn = model.getModel();

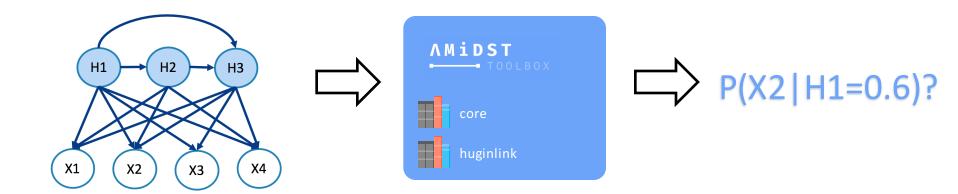
System.out.println(bn);
```



StaticModelFlink.java

# Static models (Inference)





Static BN

Answer to a query



### Static models (inference)



Add the following code after learning the model

```
//Variables of interest
Variable varTarget = bn.getVariables().getVariableByName("LatentVar1");
Variable varObserved = null;

//we set the evidence
Assignment assignment = new HashMapAssignment(2);
varObserved = bn.getVariables().getVariableByName("Income");
assignment.setValue(varObserved,0.0);

//we set the algorithm
InferenceAlgorithm infer = new VMP();
infer.setModel(bn);
infer.setEvidence(assignment);
new HuginInference();
new ImportanceSampling();
```

//query

infer.runInference();
Distribution p = infer.getPosterior(varTarget);
System.out.println("P(LatentVar1 | Incomce=0.0) = "+p);



Static Model Inference. java



# Parallel TAN (Hugin/AMIDST)



- Hugin: learn the structure with a subsample of the data
- AMIDST: learn the parameters in AMIDST using the whole data.

```
ParallelTAN tan = new ParallelTAN();
tan.setNumCores(4);
tan.setNumSamplesOnMemory(1000);
tan.setNameRoot(var01);
tan.setNameTarget(classVar);
BayesianNetwork model = tan.learn(data);
```



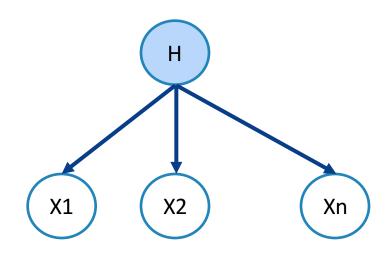
ParallelTANExample.java



# Static models (practice)



Create your custom model: gaussian mixture



Discrete hidden variable

Continuous variables

Assume that observed variables are not connected



# Static models (practice)



Some tips:

```
public class CustomGaussianMixture extends Model{
   public CustomGaussianMixture(Attributes attributes) throws WrongConfigurationException {
        super(attributes);
        //TODO: Write the contructor code here
   }

@ Override
   protected void buildDAG() {
        //TODO: Write the code building a DAG for your custom model
   }
}
```

Useful methods:

```
public Variable Variables::newMultinomialVariable(String name, int nOfStates)
public List<ParentSet> DAG::getParentSets()
```





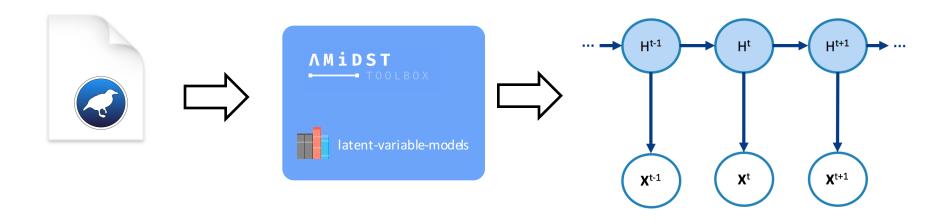
# **Dynamic Models**

A set of code examples for **easily** learning and making inference with dynamic PGMs



# Static models (learning)





ARFF file Dynamic BN



# Dynamic models (learning)



```
//Load the datastream
String filename = "datasets/simulated/cajamar.arff";
DataStream<DynamicDataInstance> data = DynamicDataStreamLoader.loadFromFile(filename);

//Learn the model
DynamicModel model = new HiddenMarkovModel(data.getAttributes());
model.updateModel(data);
DynamicBayesianNetwork dbn = model.getModel();

System.out.println(dbn);
```

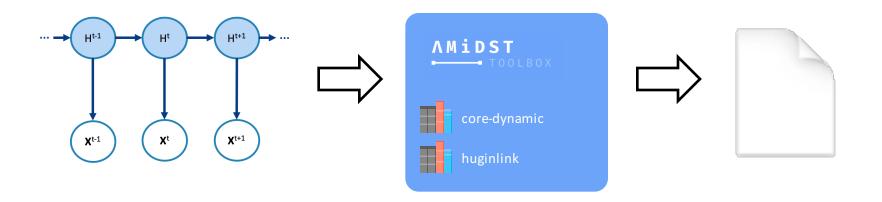


DynamicModelLearning.java



# Static models (save to disk)





Dynamic BN

.dbn file .net file



#### Dynamic models (save to disk)



```
// Save with .bn format
DynamicBayesianNetworkWriter.save (bn, "networks/simulated/exampleDBN.dbn");
// Save with hugin format
DynamicBayesianNetworkWriterToHugin.save(bn, "networks/simulated/exampleDBN.net");
```

- Note: make sure that you have the following files in your classpath:
  - hgapi83\_amidst-64.jar
  - libhgapi83\_amidst-64.jnilib
- For adding folders to your class path:

-Djava.library.path="...."

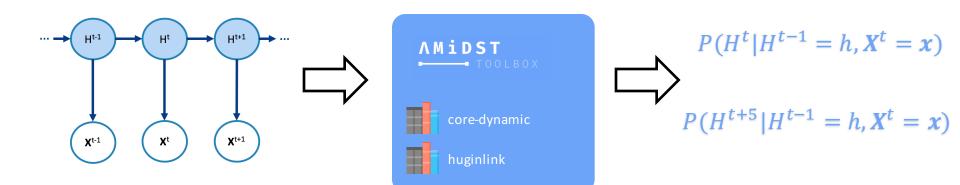


Dynamic Model Save To Disk. java



#### Static models (save to disk)





Dynamic BN querry



# Dynamic models (inference)



Add the following code after learning the process

```
//Testing dataset
String filenamePredict = "datasets/simulated/cajamar.arff";
DataStream<DynamicDataInstance> dataPredict = DynamicDataStreamLoader.loadFromFile(filenamePredict);
//Select the inference algorithm
Inference Algorithm For DBN \ infer = {\color{red} new} \ Factored Frontier For DBN ({\color{red} new} \ VMP ());
infer.setModel(dbn);
Variable varTarget = dbn.getDynamicVariables().getVariableByName("discreteHiddenVar");
UnivariateDistribution posterior = null;
//Classify each instance
                                                                                    new HuginInference();
int t = 0;
                                                                                new ImportanceSampling();
for (DynamicDataInstance instance : dataPredict) {
  infer.addDynamicEvidence(instance);
  infer.runInference();
  posterior = infer.getFilteredPosterior(varTarget);
  System. out. println("t="+t+", P(discreteHiddenVar | Evidence) = " + posterior);
```

Dynamic Model Inference. java



# Dynamic models (inference)



For predicting 5 steps ahead, replace:

posterior = infer.getFilteredPosterior(varTarget);



posterior = infer.getPredictivePosterior(varTarget, 5);



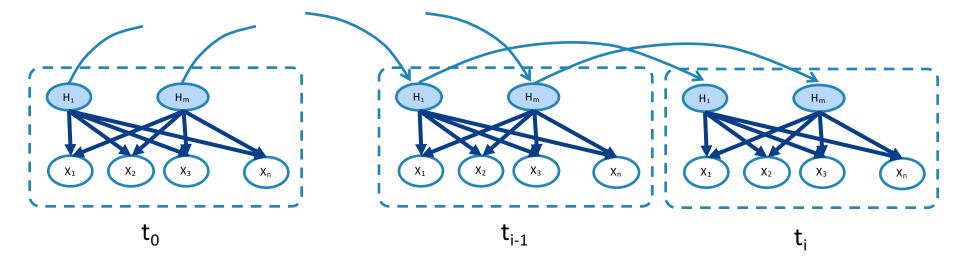
DynamicModelInference.java



# Dynamic models (practice)



Create your custom dynamic model: Kalman filter



- Assume that hidden variables are not connected among them
- All the variabels are continuous



### Dynamic models (practice)

public class CustomKalmanFilter extends DynamicModel {



Some tips:

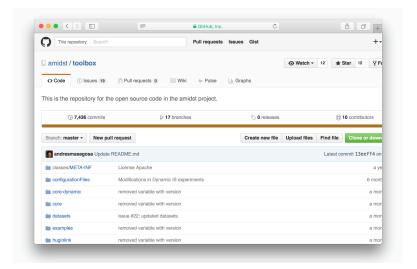
```
public CustomKalmanFilter(Attributes attributes) throws WrongConfigurationException {
 super(attributes);
 //TODO: Write the constructor code here
@Override
protected void buildDAG() {
  Useful methods:
public DynamicVariable DynamicVariables::newGaussianDynamicVariable (String name)
public Variable DynamicVariable ::getInterfaceVariable()
public ParentSet DynamicDAG::getParentSetTimeT(Variable var)
```

#### Important URLs





http://amidst.github.io/toolbox/
(Documentation, tutorials and more)



https://github.com/amidst/toolbox
(source code)



# Thanks for your attention

