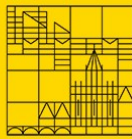




OME ANIME



- Modular open source data analysis environment
- Used in pharmaceutical companies, life science, research
- > 3,000 active users
- Development was started 2004
- Current Version: KNIME 2.1.2



The KNIME platform

The screenshot displays the KNIME Analysis Flow interface. The main workspace shows a workflow with the following nodes: File Reader (iris train data) -> Color Manager (class colored) -> Interactive Table (iris table view), Scatter Plot (iris plot), Parallel Coordinates (iris view), and J48 (Weka) (iris tree model). A second File Reader (iris test data) connects to a Decision Tree Predictor (predict test data), which then connects to a Scorer (score prediction). The Scorer node is selected, and its description is shown in the right-hand pane.

Scorer

Compares two columns by their attribute value pairs and shows the confusion matrix, i.e. how many rows of which attribute and their classification. Additionally, it is possible to highlight cells of this matrix to determine the data rows that have been predicted wrongly. The dialog allows you to select two columns to compare; the values from the first selected column are represented in the confusion matrix's rows and the values from the second column by the confusion matrix's columns. The output of the node is the confusion matrix.

Ports

Data Input

- Table containing at least two columns to compare.

Data Output

- The confusion matrix.

Views

Confusion Matrix Displays the confusion matrix

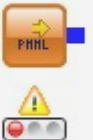


KNIME

File Reader



PMML Reader



Database Reader



...

KNIME loads and integrates data from diverse data sources:

- Different data bases
- Various file formats (CSV, XML, SDF, etc.)
- Images (**using Bio-Formats**)



KNIME

File Reader



PMML Reader



Database Reader



...

Data Loading

Column Filter



Normalizer



Pivoting

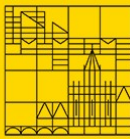


...

Data Processing

KNIME provides huge repository of modules for easy-to-use, modular

- Data preprocessing
- Data fusion
- Data transformation



KNIME

File Reader



PMML Reader



Database Reader



...

Data Loading

Column Filter



Normalizer



Pivoting



...

Data Processing

Decision Tree Learner



k-Means



SVM Learner



...

Data Mining

In addition to standard data mining techniques, KNIME adds cutting edge data analysis algorithms. (...thanks to its academic roots)



KNIME

File Reader



Column Filter



Decision
Tree Learner



Interactive views provide data overviews
and insights into the learned models.

Interactive linking & brushing techniques
allow for powerful exploration of models
and data.



Histogram



Pie chart



Box Plot



Data Loading

Data Processing

Data Mining

Visualization



KNIME

Due to its open API and “node-in-a-sandbox”-approach additional (also external) tools are easily integrated, e.g.

- Access to the statistics tool R
- Complete integration of the machine learning library WEKA
- Application area specific integration, e.g. CDK (Chemical Development Kit)
- **Inclusion of almost all ImageJ functionalities**

KNIME is Eclipse-based: Integrating other Eclipse projects such as BIRT, DTP, etc. provides even more functionality

Weka Predictor



R Snippet (Local)



ImageJ Macro



...

Data Loading

Data Processing

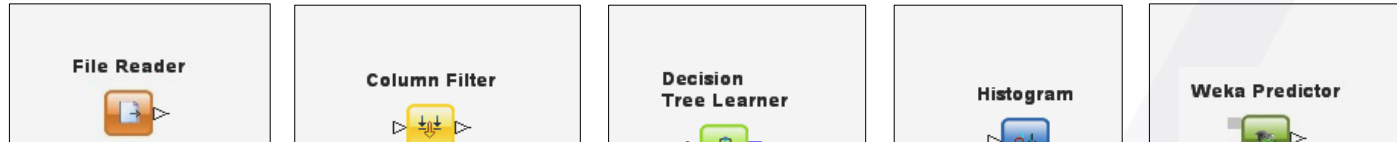
Data Mining

Visualization

External Tools

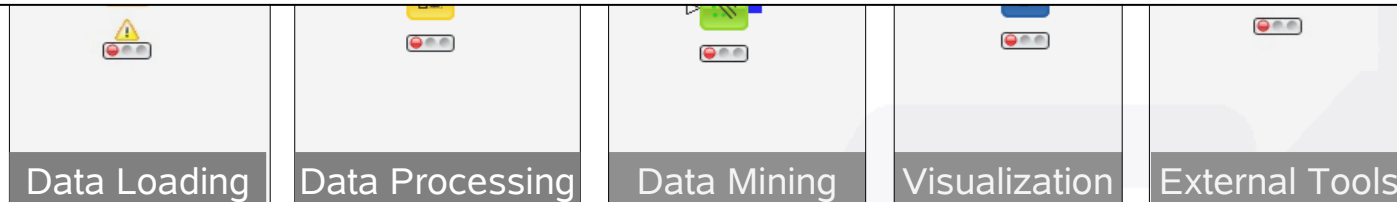


KNIME



Commercial Partners (especially in Chemistry Space)
integrate their proprietary tools

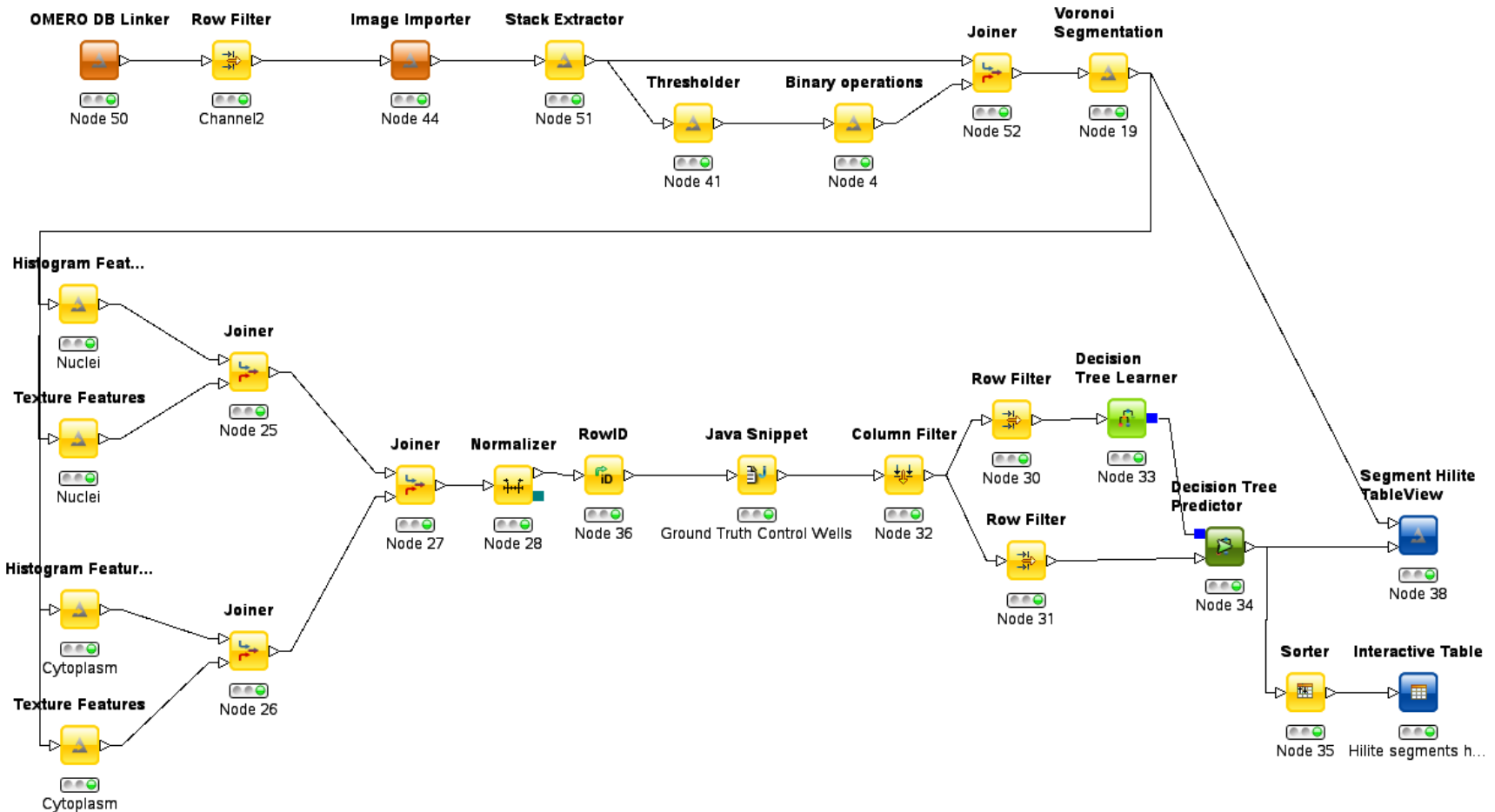
⇒ KNIME serves as an integration platform for tools of
various vendors

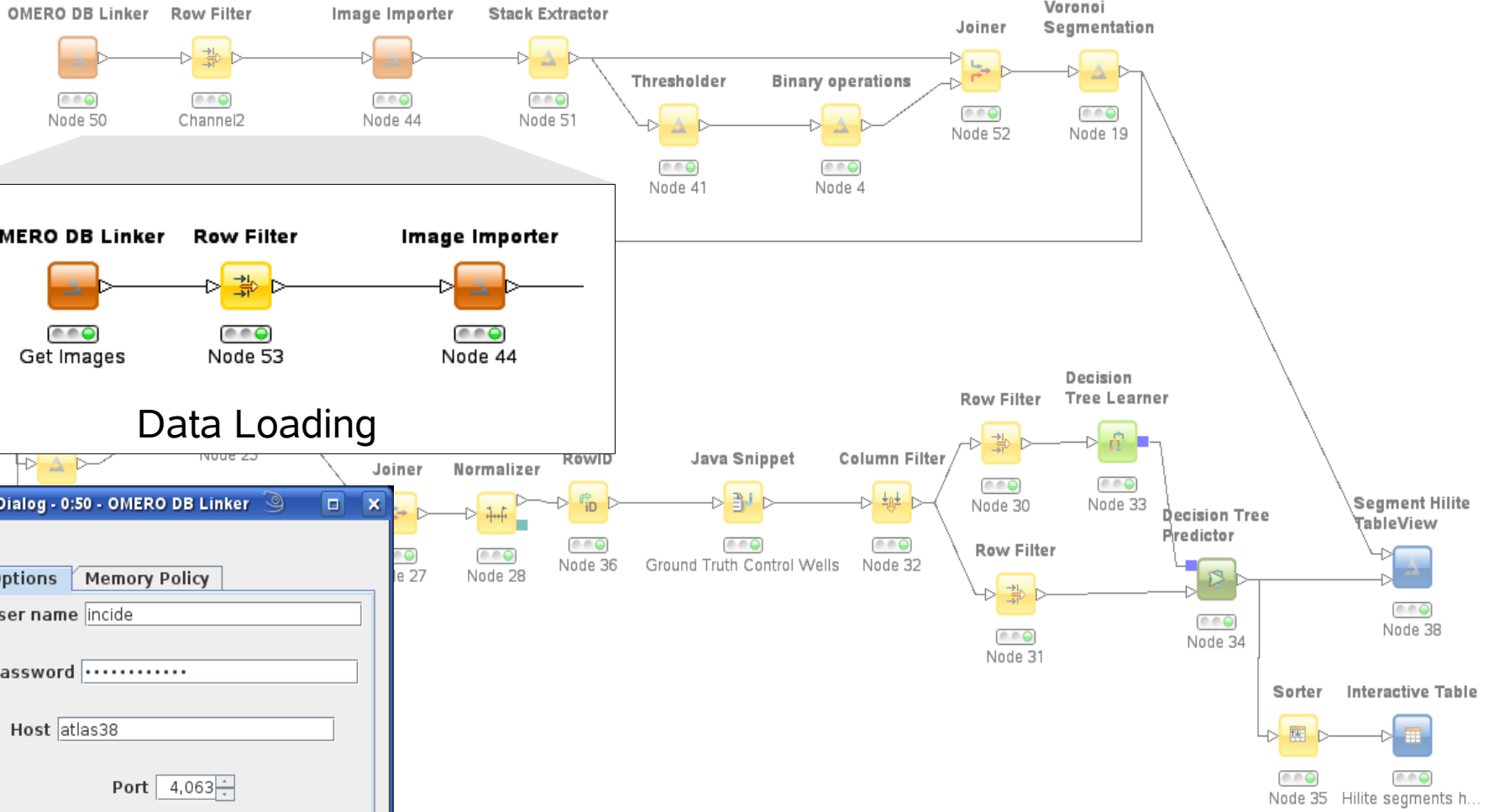


3rd Party Tools



An Exemplary Workflow





Dialog - 0:50 - OMERO DB Linker

File

Options Memory Policy

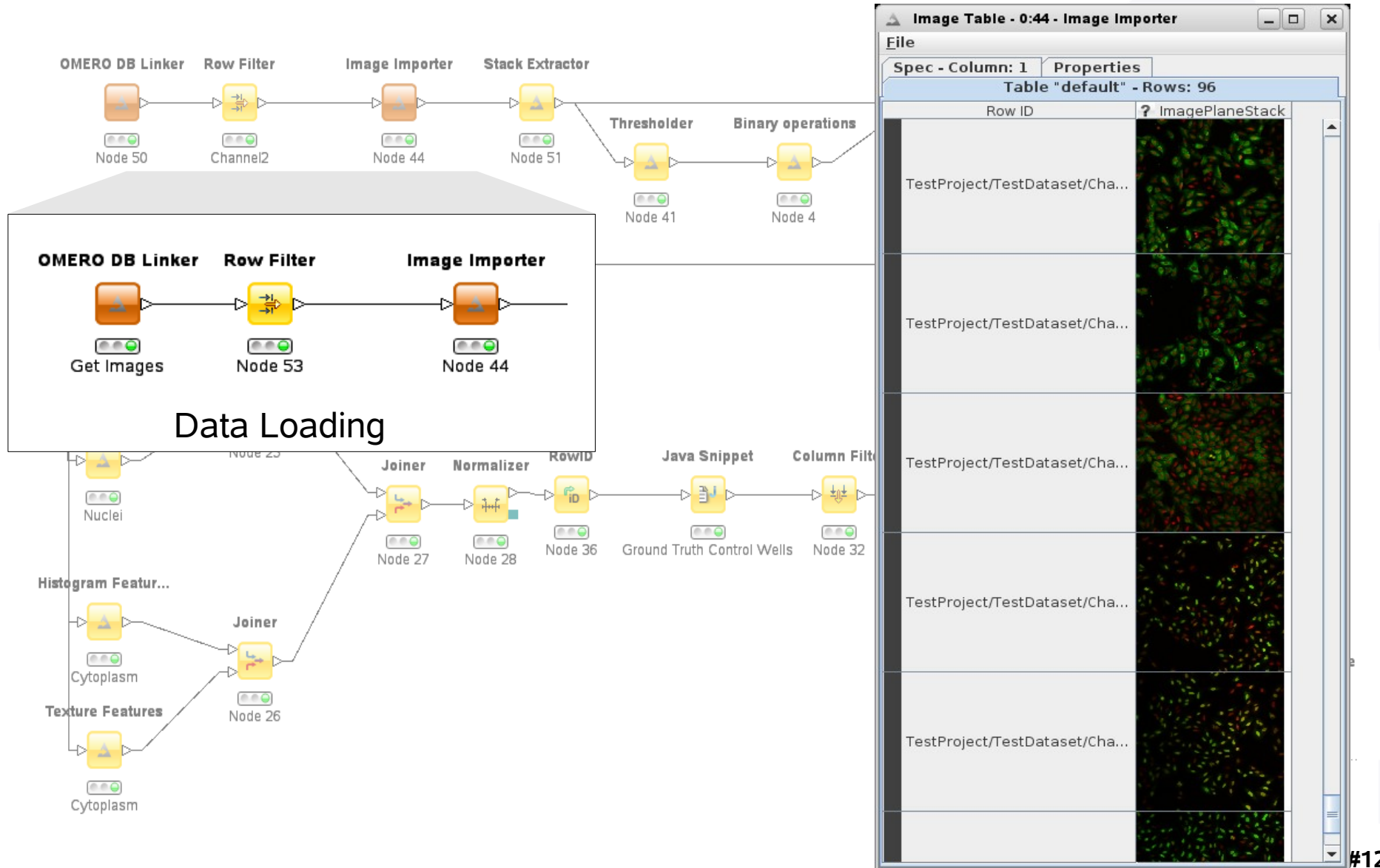
User name

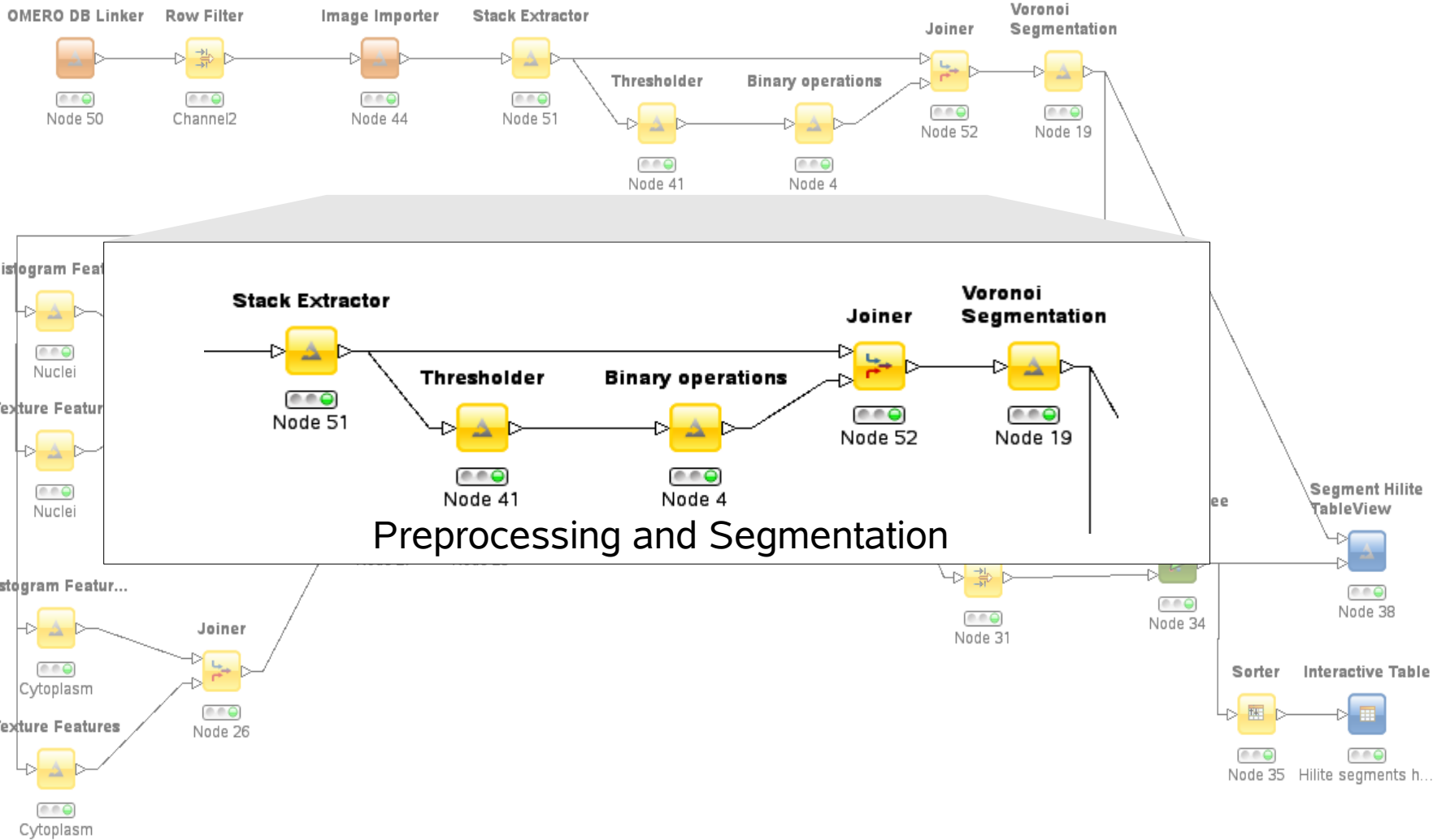
Password

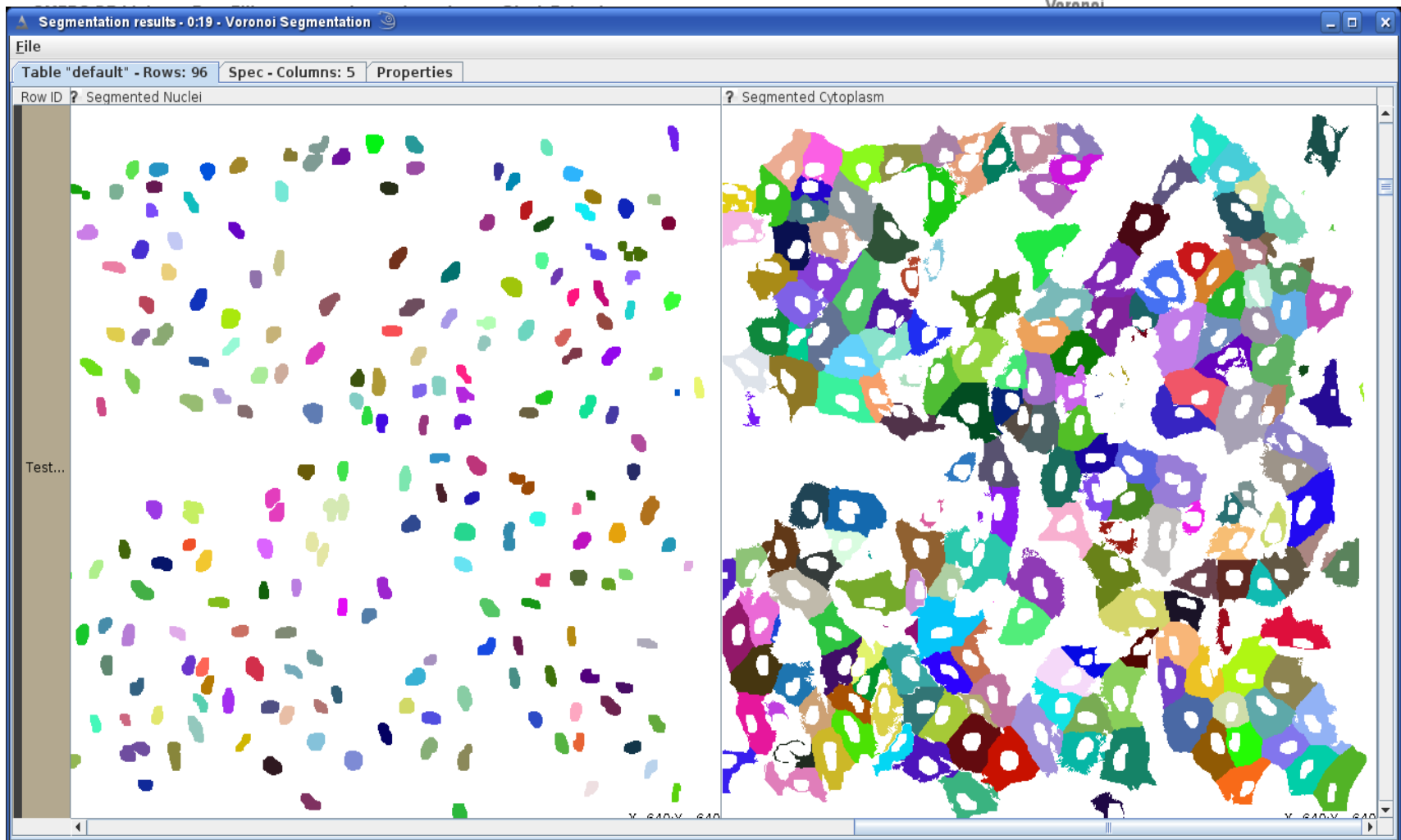
Host

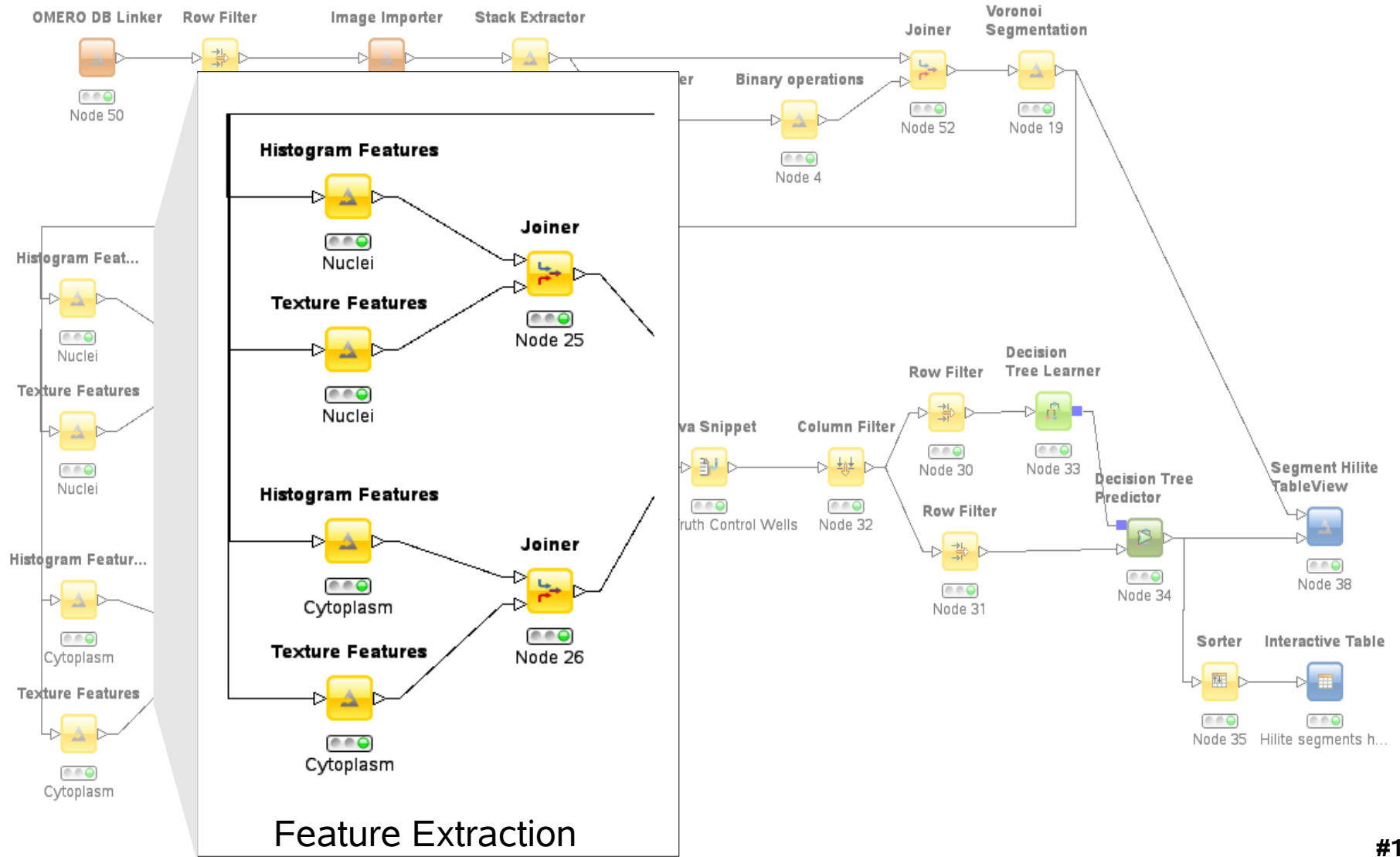
Port

OK Apply Cancel











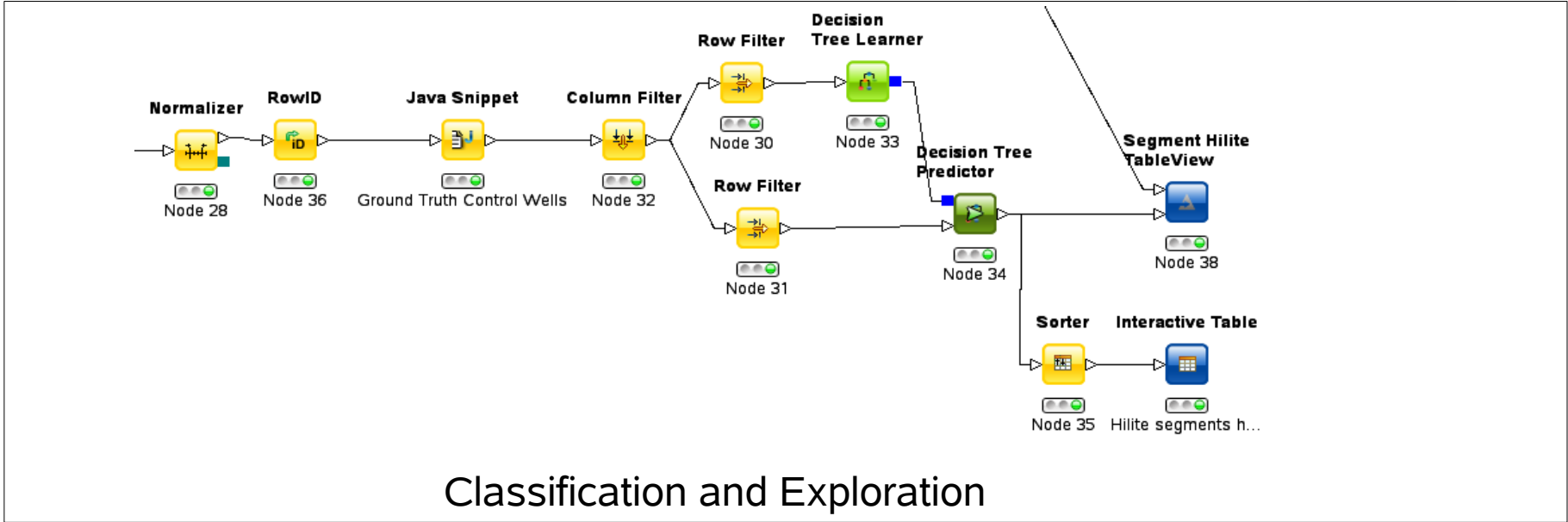
Joined table - 0:27 - Joiner

File

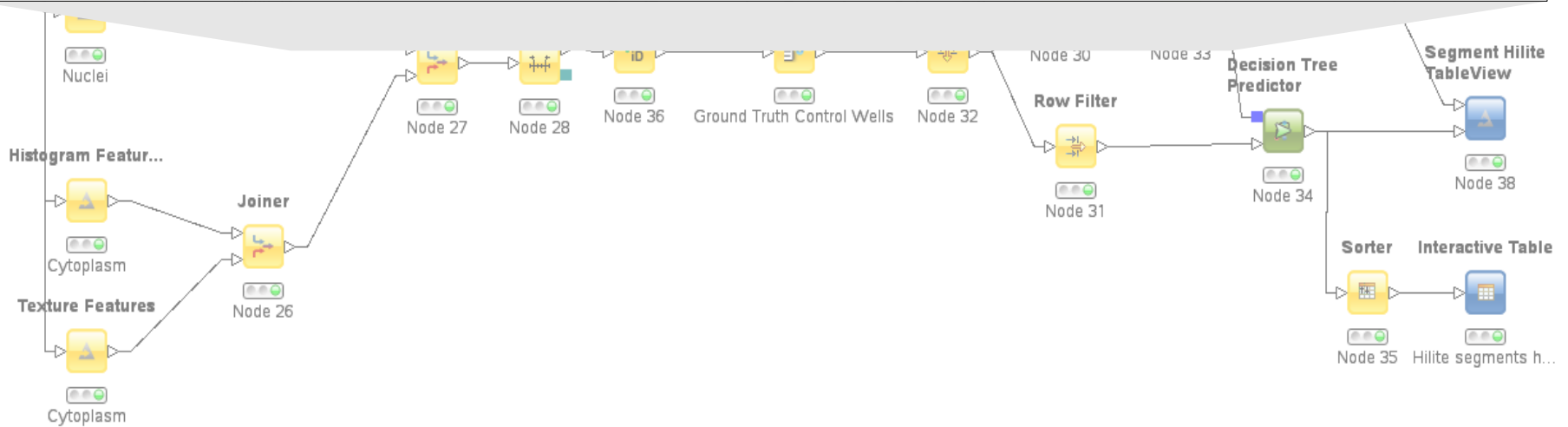
Table "default" - Rows: 14977 Spec - Columns: 42 Properties

| Row ID | D ImagePlane [Z0;C1;T0] mean | D Imag... | D Imag... | D Image... | D Image... | D Image... | D Image... | D Image... | D Image... | D Image... |
|---------------|------------------------------|-----------|-----------|------------|------------|------------|------------|------------|------------|------------|
| TestProjec... | 11.087 | 0.536 | 0.287 | 0.033 | 0.014 | 2.931 | 4 | 15 | 0.336 | 0.329 |
| TestProjec... | 152.807 | 1.745 | 3.045 | 0.92 | 1.026 | 3.761 | 90 | 162 | 0.403 | 3.279 |
| TestProjec... | 83.12 | 1.99 | 3.961 | 0.199 | 0.675 | 5.437 | 42 | 112 | 0.03 | 4.267 |
| TestProjec... | 24.301 | 0.961 | 0.924 | 0.02 | 0.078 | 4.149 | 13 | 34 | 0.172 | 0.4 |
| TestProjec... | 81.57 | 1.942 | 3.771 | 0.294 | 0.702 | 5.339 | 53 | 111 | 0.029 | 2.833 |
| TestProjec... | 71.199 | 1.449 | 2.1 | 0.226 | 0.266 | 4.897 | 38 | 87 | 0.091 | 1.444 |
| TestProjec... | 83.786 | 2.257 | 5.093 | 0.136 | 0.97 | 5.844 | 33 | 121 | 0.022 | 3.766 |
| TestProjec... | 115.124 | 6.167 | 38.036 | 154.365 | 830.606 | 4.12 | 49 | 132 | 0.266 | 5.056 |
| TestProjec... | 76.815 | 1.397 | 1.953 | 0.044 | 0.169 | 5.066 | 54 | 95 | 0.064 | 1.612 |
| TestProjec... | 10.062 | 0.44 | 0.194 | 0.024 | 0.015 | 2.058 | 7 | 12 | 1 | 0 |
| TestProjec... | 54.376 | 1.307 | 1.709 | 0.215 | 0.225 | 4.579 | 30 | 66 | 0.108 | 1.031 |
| TestProjec... | 34.12 | 0.877 | 0.77 | -0.128 | 0.078 | 4.098 | 25 | 50 | 0.231 | 0.371 |
| TestProjec... | 33.46 | 0.909 | 0.827 | -0.104 | 0.109 | 4.06 | 24 | 48 | 0.291 | 0.346 |
| TestProjec... | 6.311 | 0.318 | 0.101 | 0.009 | 0.004 | 1.659 | 4 | 8 | 0.276 | 0.371 |
| TestProjec... | 41.25 | 1.138 | 1.294 | 0.224 | 0.135 | 4.642 | 11 | 54 | 0.128 | 0.661 |
| TestProjec... | 17.336 | 0.58 | 0.337 | 0.023 | 0.013 | 3.367 | 9 | 23 | 0.449 | 0.24 |
| TestProjec... | 17.558 | 0.594 | 0.353 | 0.015 | 0.016 | 3.225 | 12 | 23 | 0.461 | 0.21 |
| TestProjec... | 15.786 | 0.689 | 0.475 | 0.006 | 0.045 | 3.189 | 10 | 21 | 0.703 | 0.15 |
| TestProjec... | 116.058 | 2.408 | 5.796 | -0.451 | 1.447 | 5.509 | 58 | 152 | 0.032 | 5.028 |
| TestProjec... | 93.94 | 3.226 | 10.405 | 11.624 | 23.178 | 5.167 | 36 | 112 | 0.059 | 6.541 |
| TestProjec... | 97.219 | 3.631 | 13.184 | 22.322 | 58.305 | 5.598 | 40 | 123 | 0.029 | 4.46 |
| TestProjec... | 13.361 | 0.683 | 0.466 | -0.009 | 0.042 | 2.845 | 10 | 17 | 0.346 | 0.242 |
| TestProjec... | 99.012 | 1.552 | 2.41 | 0.029 | 0.271 | 5.423 | 60 | 125 | 0.043 | 1.842 |
| TestProjec... | 35.791 | 1.166 | 1.359 | 0.086 | 0.141 | 4.399 | 23 | 46 | 0.146 | 0.402 |
| TestProjec... | 8.568 | 0.493 | 0.243 | -0.008 | 0.016 | 2.554 | 5 | 17 | 0.833 | 0.081 |
| TestProjec... | 47.746 | 1.19 | 1.416 | -0.119 | 0.143 | 4.78 | 30 | 66 | 0.105 | 0.614 |
| TestProjec... | 30.151 | 0.898 | 0.806 | -0.118 | 0.069 | 3.998 | 21 | 48 | 0.237 | 0.45 |
| TestProjec... | 164.083 | 5.061 | 25.612 | 77.39 | 343.68 | 5.028 | 95 | 189 | 0.041 | 6.156 |
| TestProjec... | 114.401 | 3.323 | 11.044 | 0.756 | 3.483 | 6.299 | 26 | 168 | 0.013 | 13.897 |
| TestProjec... | 14.329 | 0.506 | 0.256 | 0.007 | 0.012 | 2.85 | 8 | 19 | 0.727 | 0.097 |
| TestProjec... | 3.736 | 0.295 | 0.087 | -0.006 | 0.003 | 1.387 | 2 | 5 | 1 | 0 |

Feature Extraction



Classification and Exploration





Row Filter Decision Tree Learner

Table View - 0:39 - Interactive Table (Hilite segments here)

File Hilite Navigation View Output

| Row ID | ... | D Image... | D Image... | D Image... | D Image... | S class | S Prediction (DecTree) |
|---------------|-----|------------|------------|------------|------------|---------|------------------------|
| TestProjec... | | -0.175 | -0.029 | 0.403 | 0.030 | ? | n |
| TestProjec... | | -0.217 | -0.626 | -0.67 | 0.325 | ? | n |
| TestProjec... | | -0.22 | -2.18 | -0.882 | -2.461 | ? | n |
| TestProjec... | | -0.22 | -0.907 | -1.456 | -0.353 | ? | n |
| TestProjec... | | -0.22 | -2.18 | -0.882 | -2.461 | ? | n |
| TestProjec... | | -0.141 | -0.196 | 0.322 | 0.61 | ? | n |
| TestProjec... | | -0 | 0.649 | 0.674 | 0.428 | ? | n |
| TestProjec... | | -0.22 | -2.18 | -0.882 | -2.461 | ? | n |
| TestProjec... | | -0.105 | 0.139 | 0.645 | 0.631 | ? | n |
| TestProjec... | | -0.095 | 0.788 | 1.387 | 0.769 | ? | n |
| TestProjec... | | -0.136 | 0.777 | 0.9 | 0.663 | ? | n |
| TestProjec... | | -0.205 | -0.499 | -0.487 | 0.466 | ? | n |
| TestProjec... | | -0.219 | -0.961 | -1.476 | -0.163 | ? | n |
| TestProjec... | | -0.199 | -0.459 | -0.687 | -0.114 | ? | n |
| TestProjec... | | -0.192 | -0.223 | 0.213 | 0.629 | ? | n |
| TestProjec... | | -0.22 | -1.204 | -2.139 | -1.245 | ? | p |
| TestProjec... | | -0.22 | -0.624 | -1.658 | -1.778 | ? | p |
| TestProjec... | | 0.223 | 1.556 | 1.183 | 0.482 | ? | p |
| TestProjec... | | -0.037 | 1.397 | 0.62 | 0.413 | ? | p |
| TestProjec... | | -0.162 | 0.387 | -0.622 | 0.101 | ? | p |
| TestProjec... | | -0.179 | 0.489 | -0.026 | 0.412 | ? | p |
| TestProjec... | | -0.202 | 0.028 | -0.434 | 0.342 | ? | p |
| TestProjec... | | -0.111 | 0.848 | -0.642 | -0.092 | ? | p |
| TestProjec... | | -0.184 | 0.298 | -0.124 | 0.425 | ? | p |

- Nuclei
- Histogram Feat...
- Cytoplasm
- Texture Featur...
- Cytoplasm

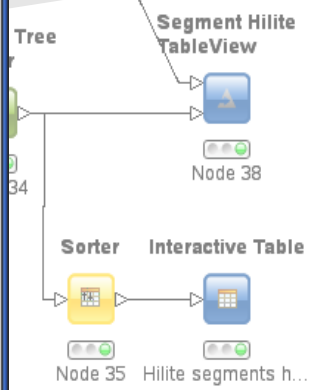




Table View - 0:39 - Interactive Table

File Hilite Navigation View Outp

| Row ID | ... | D Image... | D Image.. |
|---------------|-----|------------|-----------|
| TestProjec... | | -0.175 | -0.029 |
| TestProjec... | | -0.217 | -0.626 |
| TestProjec... | | -0.22 | -2.18 |
| TestProjec... | | -0.22 | -0.907 |
| TestProjec... | | -0.22 | -2.18 |
| TestProjec... | | -0.141 | -0.196 |
| TestProjec... | | -0 | 0.649 |
| TestProjec... | | -0.22 | -2.18 |
| TestProjec... | | -0.105 | 0.139 |
| TestProjec... | | -0.095 | 0.788 |
| TestProjec... | | -0.136 | 0.777 |
| TestProjec... | | -0.205 | -0.499 |
| TestProjec... | | -0.219 | -0.961 |
| TestProjec... | | -0.199 | -0.459 |
| TestProjec... | | -0.192 | -0.223 |
| TestProjec... | | -0.22 | -1.204 |
| TestProjec... | | -0.22 | -0.624 |
| TestProjec... | | 0.223 | 1.556 |
| TestProjec... | | -0.037 | 1.397 |
| TestProjec... | | -0.162 | 0.387 |
| TestProjec... | | -0.179 | 0.489 |
| TestProjec... | | -0.202 | 0.028 |
| TestProjec... | | -0.111 | 0.848 |
| TestProjec... | | -0.184 | 0.298 |

TableView - 0:38 - Segment Hilite TableView <2>

File

Row ID

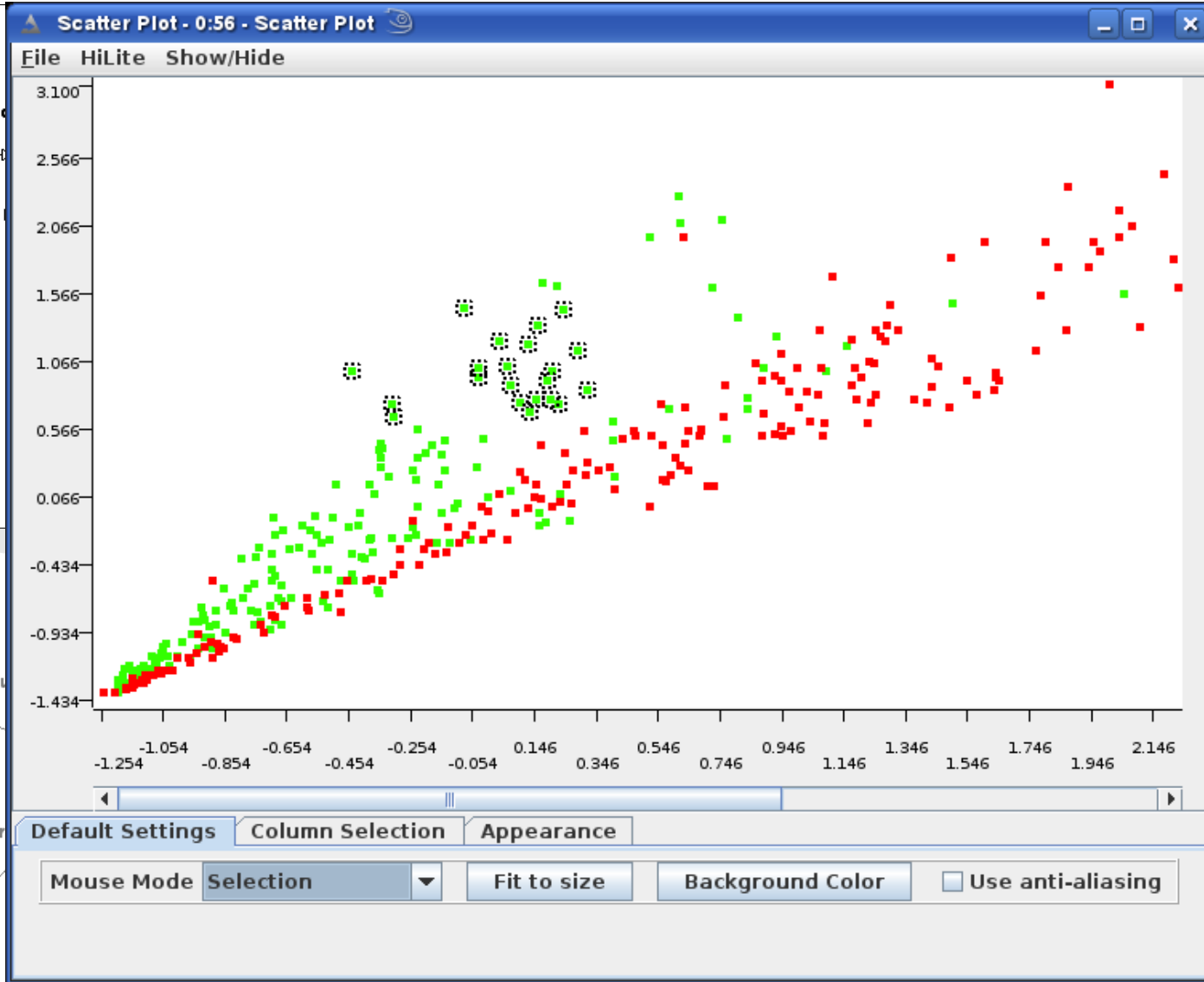
TestProjec...

X=640;Y= 640;C= 2

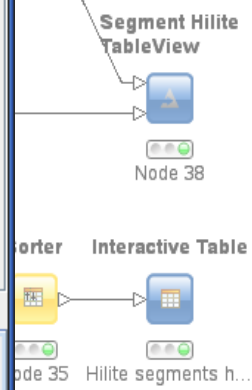
Creating hilited segments... 100%

- Nuclei
- Histogram Featur
- Cytoplasm
- Texture Featur
- Cytoplasm

- Hilite
- View
- 38
- Table
- ents h...



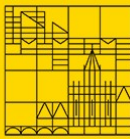
- Nuclei
- Histogram Feature
- Cytoplasm
- Texture Feature
- Cytoplasm





Some technical remarks

- KNIME takes care of caching and swapping the data rows → able to process huge data tables
- Images are treated as BLOBS
- Extension through the eclipse plug-in/update mechanism



Resources

<http://www.knime.org> - the home of KNIME

<http://www.inf.uni-konstanz.de/sighca> - WIKI related to High Content Analytics, also providing the associated plugins

<http://labs.knime.org> - additional experimental plugins