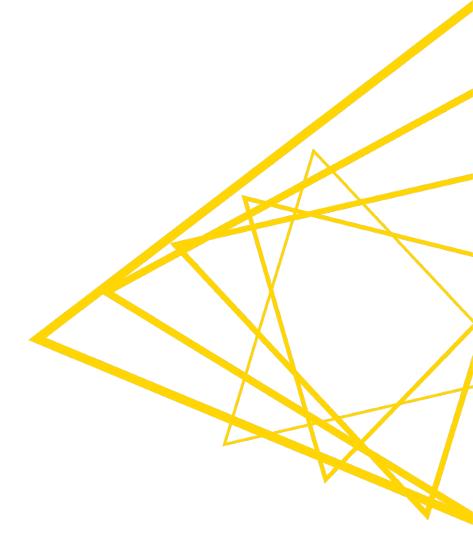


[L2-DS] KNIME Analytics Platform for Data Scientists: Advanced

KNIME AG



Flow Variables



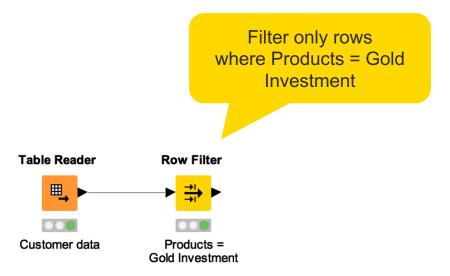
Goal of this Session

- What is a Flow Variable?
- Create a Flow Variable
- Use a Flow Variable as a parameter in the node settings
- Use a Configuration node to parameterize a Component
- Use a Widget node to enable interaction on a WebPortal page



Flow Variables: Usage Example

 Each month you need to produce a sales report for the most popular product





Flow Variables: Usage Example

- Each month I need to launch the Analytics Platform, aggregate the data to identify the most popular product, and update the Row Filter accordingly
- Or do I? Perhaps Flow Variables can help...

Automatically Filter by Most Popular Product

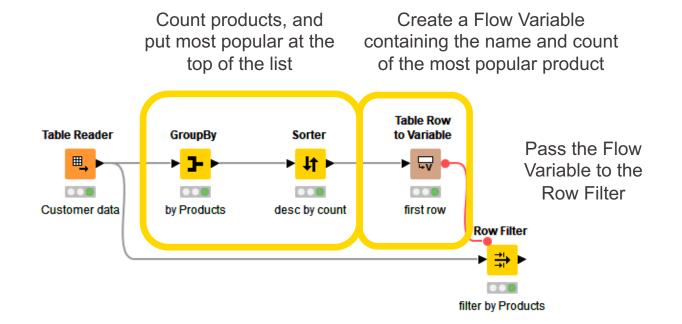
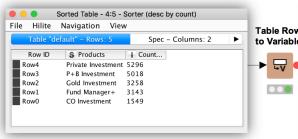


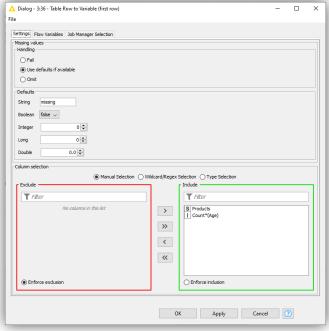


Table Row to Variable

- Takes a table as input and converts the first row to Flow Variables
 - Column names -> Flow Variable names
 - Column values -> Flow Variable values
- Only the first row is transformed, additional rows are discarded



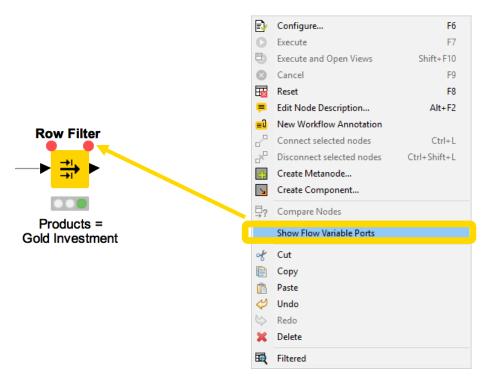
Flow Variables						
In	Owne	Nar	ne	Value		
0	4:6	s	Products	Private Investment		
0	4:6	ż	Count*(Age)	5296		
0	4:6	s	RowID	Row4		
0		s	knime.works	/Users/kathrinmelcher/knime-workspa		



7



Flow Variable Ports







Apply a Flow Variable (Button)

 Filter Criter Filter Criter Include rows by attribute value Exclude rows by attribute value Include rows by number Exclude rows by number Include rows by number Include rows by row ID Exclude rows by row ID 	Dialog - 0:274 - Row Filter	Use Variable: Create Variable:	/ariable Settings
	OK Apply Cancel 7	The Flow Va	ariable button



Apply a Flow Variable (Advanced)

Dialog - 0:274 - Row Filter	
Filter Criteria Flow Variables Memory Policy	
v ? rowFilter	The Flow Variables
S RowFilter_Typ	tab
S ColumnName S Product	
? include	
? deepFiltering +	
CaseSensitive	
S Pattern ÷	List of available Flow
? hasWildCards	Variables
? isRegExpr ÷	
OK Apply Cancel (?)	

Create a Flow Variable (Button)

Filter Criteri	Dialog - 0:274 - Row Filter
Include rows by attribute value Exclude rows by attribute value Include rows by number Exclude rows by number Include rows by row ID Exclude rows by row ID	Column value matching Column to test: S Products filter based on collection elements Matching criteria • use pattern matching Cold Investment Cold Investment Cold Investment Cold Investment Cold Investment Cold Investment o use range checking Iower bound: upper bound: 0 only missing values match OK Apply Cancel ?



Create a Flow Variable (Advanced)

Converting a setting value into a Flow Variable

Dialog - 0:274 - Row Filter	
Filter Criteria Flow Variables Memo	ry Policy
v ? rowFilter	
S RowFilter_Typ	\$
S ColumnName	New Variable
? include	÷ (
? deepFiltering	Name of the new
? CaseSensitive	Flow Variable
S Pattern	¢
? hasWildCards	
? isRegExpr	÷
OK Apply	Cancel

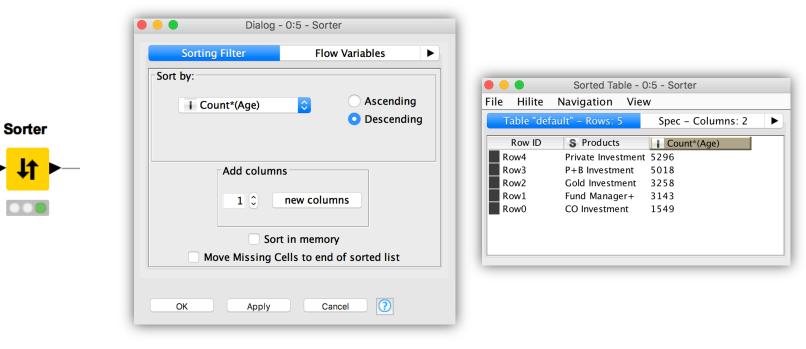
Key Features: Flow Variables

- Flow Variables are workflow parameters used to overwrite existing node settings
- A Flow Variable is carried along workflow branches (parallel branches don't share local Flow Variables)
- Flow Variables can be of type String, Integer, Double, Boolean, Long and Array, Path
- Flow Variables can be created
 - 1. in the "Flow Variables" tab of any node
 - 2. using the "Table Row to Variable" node
 - 3. using Configuration and Widget nodes



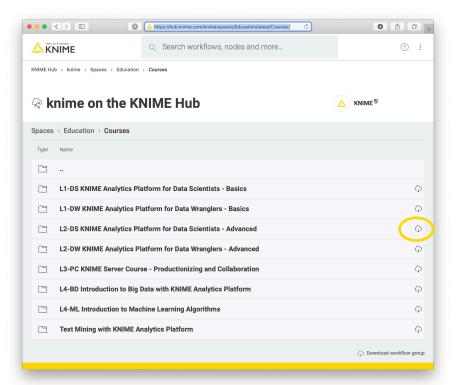
Sorter

- Sorts a table!
- Choice of ascending or descending
- Sort by multiple columns



Exercise Session 1:

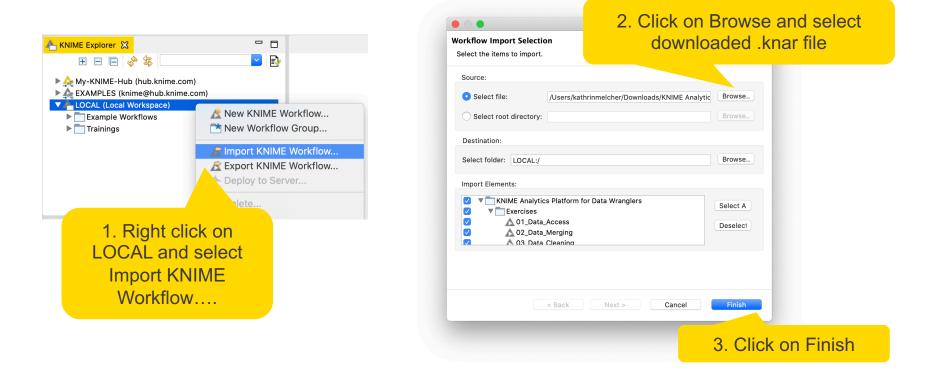
 Download the course material from the KNIME Hub <u>https://hub.knime.com/knime/spaces/Education/latest/Courses/</u>





Exercise Session 1

Import the course material to KNIME Analytics Platform





Flow Variables Exercise: Activity I

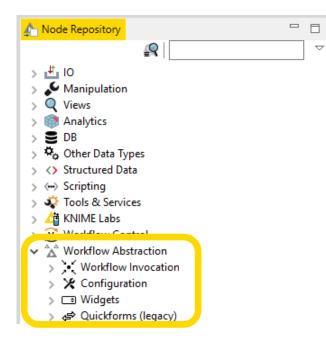
Start with exercise: Flow Variables, Activity I

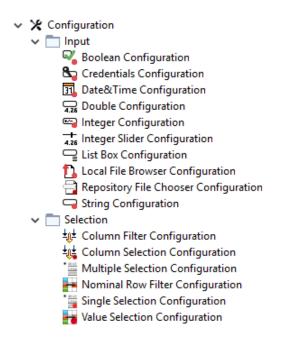
Filter the customer data to

- 1. customers of the "Gold Investment" product
- 2. customers of the most common product in the data



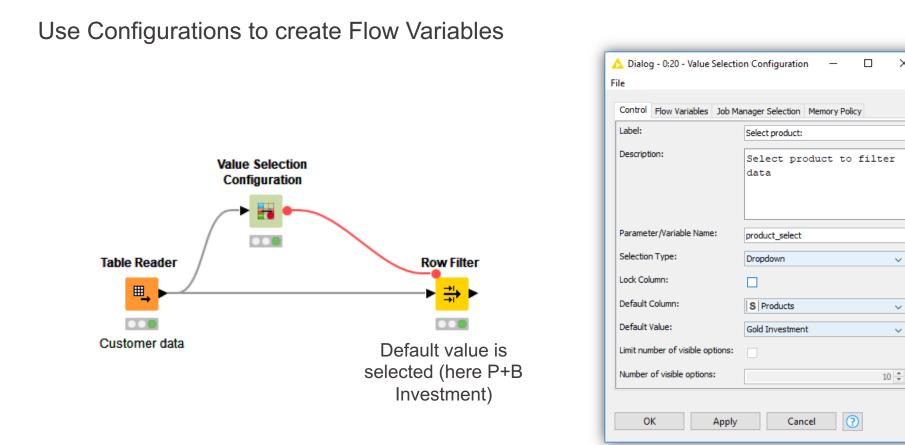
Configuration Nodes for Variable Creation and Output







Configuration Node Configuration





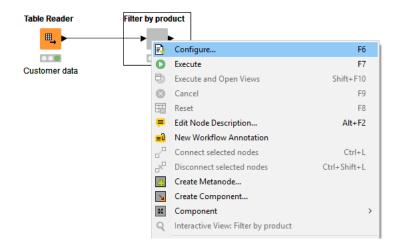
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Simple Configuration of Component



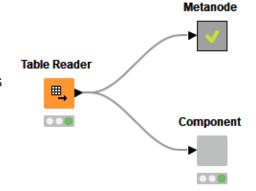
- Double click a Component to configure
- For use in WebPortal, replace Configuration nodes by Widget nodes

Options	Flow Variable	s Memory Policy	Job Manager	Selection	1	
Select p	roduct:					
Select p	roduct:					
	roduct: te Investment	~				
Priva	te Investment	~				
Priva	te Investment te Investment	~				
Priva Priva P+B I	te Investment te Investment investment	~				
Priva Privat P+B I Gold I	te Investment te Investment investment investment	~				
Priva Priva P+B I Gold I CO Ir	te Investment te Investment investment investment ivestment	~				
Priva Priva P+B I Gold I CO Ir	te Investment te Investment investment investment	× 				



Components

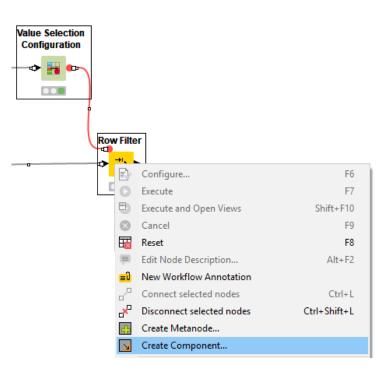
- Encapsulates a functionality for reuse and sharing
- Components main features:
 - Local Flow Variable scope
 - Configurable via Configuration nodes
- Key to advanced functionality in KNIME products:
 - Component corresponds to a KNIME WebPortal page
 - Configurations on a WebPortal page are defined using Widget nodes
 - Possibility to be shared via KNIME Hub





Create a Component

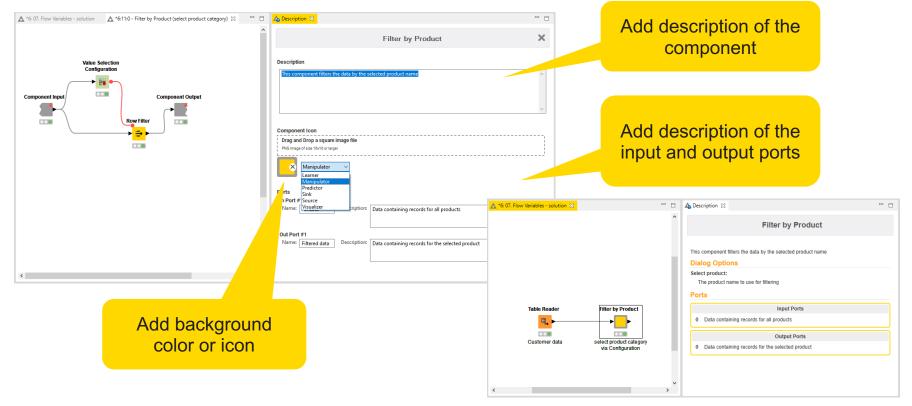
- Select nodes to encapsulate into a Component
- Right click a node
- Select "Create Component..."





Component Description

Make your component look like a KNIME node



Configure Component Ports

iter b	у рго	duct				
-•	Ð	Configure	F6	1		
- 1	0	Execute	F7			
_		Execute and Open Views	Shift+F10			
	Θ	Cancel	F9			
		Reset	F8			
	F	Edit Node Description	Alt+F2			
	≡Û	New Workflow Annotation				
	2	Connect selected nodes	Ctrl+L			
	2	Disconnect selected nodes	Ctrl+Shift+L			
	-f-	Create Metanode				
	2	Create Component				
	2	Component	>		Open	
				_		
	Q	Interactive View: Filter by product		5	Expand	
	Q ⊒?	Interactive View: Filter by product Compare Nodes			Setup	
	`				Setup Convert to Metanode	
	₽?	Compare Nodes			Setup Convert to Metanode Share	
	₽?	Compare Nodes Show Flow Variable Ports Cut			Setup Convert to Metanode Share Update Link	Ctrl+Alt
	₽? ✔ ■	Compare Nodes Show Flow Variable Ports			Setup Convert to Metanode Share Update Link Disconnect Link	Ctrl+Alt
	₽?	Compare Nodes Show Flow Variable Ports Cut Copy			Setup Convert to Metanode Share Update Link Disconnect Link Change Link Type	Ctrl+Alt
	₽? * 🗎	Compare Nodes Show Flow Variable Ports Cut Copy Paste			Setup Convert to Metanode Share Update Link Disconnect Link	Ctrl+Alt
	₹ ¶ ¶	Compare Nodes Show Flow Variable Ports Cut Copy Paste Undo			Setup Convert to Metanode Share Update Link Disconnect Link Change Link Type	Ctrl+Alt

- Add input and output ports to Metanodes/Components
- Remove ports to adapt to changes after creation of Metanode/Component

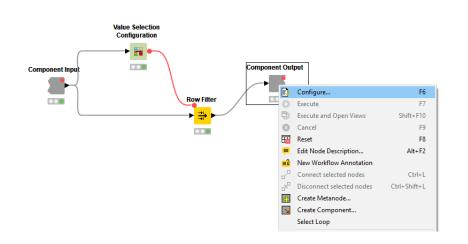
Specifiy the name of the n	rd ode and define the num	ber and type of the desired ir	and out ports.	Port Ty	Data	
Component Name: Filter	by product Add Remove Up Down	Out Ports: out_1 (Data)	Add Remove Up Down		OK Flowvariable PMML Database Connection Database Query AWS Comprehend Con AWSConnection DB Data DB Session Distance Measure FilterDefinition Gradient Boosting Mod H2O Context H2O Frame H2O Model Image KnimeConnection MOJO	



Regression Tree

Passing Variables from Components

- Flow Variables by default only available locally inside Component
- Configure Component Input/Output to pass Flow Variables from/to outside Component

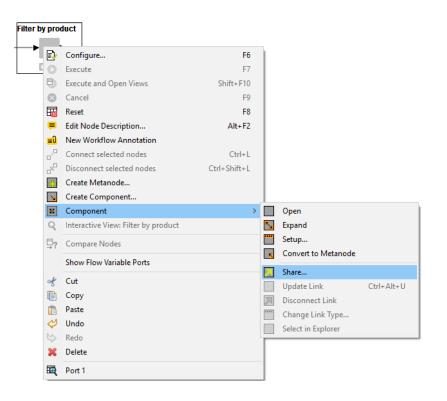


Ingulation	Descriptions		Job Manager Selectors variables from w		olicy sible outside the Component		
			 Manual Sele 	ction 🔿 Wildca	ard/Regex Selection		
s" sele	er cted_product cted_product (rce exclusion	column)		> >> <	Thudde Tilter No variables in this O O Enforce inclusion	list	



What is a Shared Component?

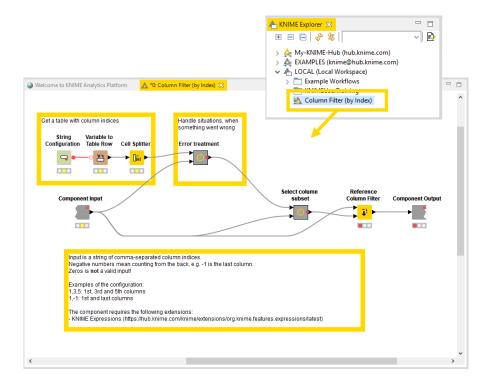
- Components can be saved in your KNIME workspace for later reuse
- To do this, simply right-click any Component and select "Share..."
- Shared Components are read-only instances of a Component
- Public Shared Components are available on EXAMPLES Server and on KNIME Hub





How can you Edit a Shared Component?

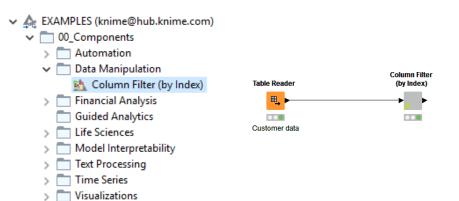
- Components can be edited using the Component Editor, similar to workflows
- To edit a Component using the Component Editor, double-click the Component in its location in the KNIME Explorer
- To ensure components are executable when opened in the Component Editor, chose the option to "Include input data with component" when sharing it

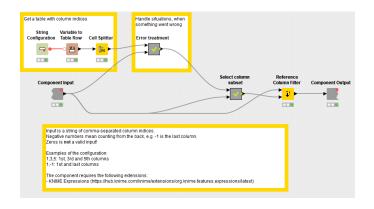




How can you Use a Shared Component?

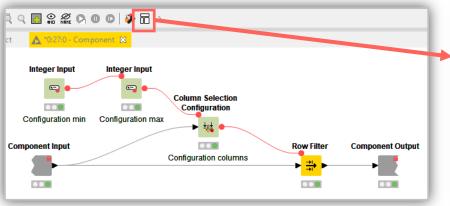
- To use a Shared Component, drag and drop it to the workflow editor
- Instances of Shared Components can be updated either manually or when workflow is opened
- Shared Component can also be unlinked from its original location, which makes it editable in the workflow directly
- Update Shared Components by overwriting them







Configuration Dialog Layout





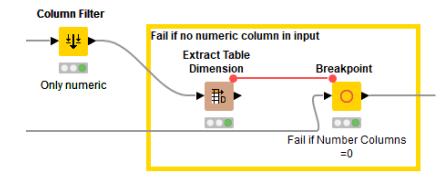
 Click layout button when inside component to modify the order of the setting options in configuration window of the component

▲ Dialog - 0:27 - Component	-		×
File			
Options Flow Variables Memory Policy Job Manager Selection			
Numeric columns:			
Min 10 💠		Cha	inge
Max 40 \$		Cha	inge
OK Apply Cancel		?	



Breakpoint

- Stops execution of a workflow branch
- Useful to stop the execution of a component and provide a custom error message
- Execution stops based on the selected condition:
 - Empty table
 - Active/Inactive branch
 - Flow Variable value



<mark>▲</mark> Dialog - 2:117:0:143:138 - Breakpoint (Fail if Number Col — □ × File
Options Flow Variables Job Manager Selection Memory Policy
Breakpoint Enabled
Breakpoint active for:
○ empty table ○ active branch ○ inactive branch ④ variable matches value
Select Variable: Number Columns 🗸
Enter Variable Value: 0
Custom message No numeric column available
OK Apply Cancel 🕐



Flow Variables Exercise: Activity II

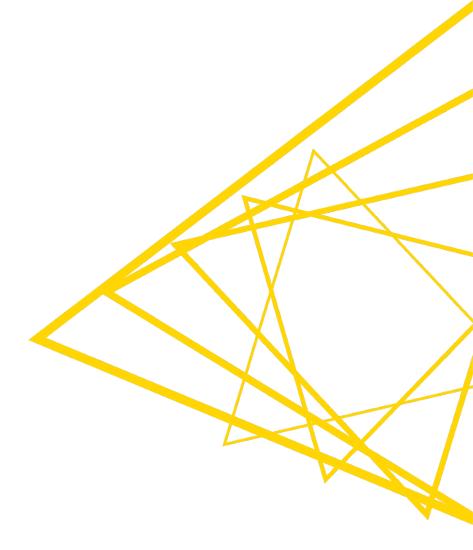
Start with exercise: Flow Variables, Activity II

 Create a component that allows a user to choose an investment product and filter the data by that product





Date/Time Data



Date & Time Overview

- Dedicated data type for date and time data
- Supported in Date&Time nodes
 (and others: GroupBy, Pivot, Line Plot)
- Complete re-write in KNIME 3.4

le Hilite	Navigation View	
Table	e "default" – Rows: 5241	L60
Row ID	😰 timestamp	D Intensity
Row0	2007-01-01T00:01	10.4
Row1	2007-01-01T00:02	10.4
Row2	2007-01-01T00:03	10.4
Row3	2007-01-01T00:04	10.4
Row4	2007-01-01T00:05	10.4
Row5	2007-01-01T00:06	10.4
Row6	2007-01-01T00:07	10.2
Row7	2007-01-01T00:08	10.2
Row8	2007-01-01T00:09	10.2
Row9	2007-01-01T00:10	10.2
Row10	2007-01-01T00:11	10.2
Row11	2007-01-01T00:12	10.2
Row12	2007-01-01T00:13	10.2
Row13	2007-01-01T00:14	10.2
Row14	2007-01-01T00:15	10.2

Other Data Types Metwork Text Processing Time Series Manipulate Create Date&Time Range Date&Time Difference Date&Time Shift Date&Time-based Row Filter Modify Date hodify Time hodify Time Zone ▼ Transform String to Date&Time I Timestamp to Date&Time Call Duration to String 📳 Duration to Number Shing to Duration Date&Time to legacy Date&Time Legacy Date&Time to Date&Time 😃 Extract Date&Time Fields 😃 Extract Duration Fields 🗐 Window Loop Start Smoothing Moving Aggregation 📥 Moving Average



String to Date&Time

- Convert date/time data from String into a native Date&time cell
- Guesses correctly many date/time formats in String columns
 - Enter format manually if auto-guessing doesn't work
 - KNIME automatically adds custom formats to auto-guess list
 - Convert multiple columns that have the same date/time format by one node

String to Date&Time

n String	Dialog - 0:46 - String to Date&Time Select columns to
	Options Flow Variables Memory Policy
ite/time	Manual Selection Wildcard/Regex Selection Include T Filter S Date S Time S timestamp
essing doesn't	>>> < < <
m formats to	Enforce exclusion Enforce inclusion Enter date format Append selected columns Suffix of appended columns: (Date&Time) manually
ve the same	Append selected columns Suffix of appended columns: (Date&Time) Manually Replace selected columns Type and Format Selection New type: Date&time S Date format: yyyy-MM-dd'T'HH:mm[:ss[.SSS]] \$
	Locale: en-US Content of the first cell: 2007-01-01T00:01:00
	Guess data type and format
Select type	Of il on error
output colu	

Date&Time – Data Types

Ta	ble "default" – Rows: 1000	►
Row ID	Date	
Row0	2017-01-19	
Row1	2017-01-19	
Row2 Row3	2017-01-20 2017-01-20	
Row4	2017-01-20	
Row5	2017-01-21	
Row6	2017-01-21	
Row7	2017-01-22	
Row8	2017-01-22	
Row9	2017-01-22	
Row10	2017-01-23	
	Date	
• • • Out	Date put table - 2:50 - Create Date&Time Ra	inge
ile Hilite	put table - 2:50 - Create Date&Time Ra Navigation View	inge
ile Hilite	put table - 2:50 - Create Date&Time Ra	inge
ile Hilite T Row ID	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000	inge
ile Hilite T Row ID Row0	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 70 Date&Time 2017-01-19713:00:46	nge
ile Hilite T. Row ID Row0 Row1	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 [7] Date&Time 2017-01-19T13:00:46 2017-01-19T21:46:57	nge
ile Hilite T Row ID Row0	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 70 Date&Time 2017-01-19713:00:46	nge
ile Hilite T Row ID Row1 Row2	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 70 Date&Time 2017-01-19T13:00:46 2017-01-19T121:46:57 2017-01-20T16:33:08 2017-01-20T15:19:20 2017-01-21T00:05:31	nge
ile Hilite Row ID Row1 Row1 Row2 Row3 Row4 Row5	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 2017-01-19713:00:46 2017-01-19712:46:57 2017-01-20106:33:08 2017-01-20105:31 2017-01-21100:05:31 2017-01-21108:11:42	nge
ile Hilite Row ID Row 0 Row 1 Row 2 Row 3 Row 3 Row 4 Row 5 Row 6	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 2017-01-19713:00:46 2017-01-197121:46:57 2017-01-20715:19:20 2017-01-20715:19:20 2017-01-21T08:51:42 2017-01-21T08:51:42	nge
ile Hilite Row ID Row 1 Row 2 Row 3 Row 4 Row 5 Row 5 Row 6 Row 7	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 70 Date&Time 2017-01-19T13:00:46 2017-01-19T121:46:57 2017-01-20T15:19:20 2017-01-21T00:05:31 2017-01-21T00:51:142 2017-01-21T07:37:53 2017-01-22T02:24:04	nge
ile Hilite Row ID Row 0 Row 1 Row 2 Row 3 Row 3 Row 4 Row 5 Row 6	put table - 2:50 - Create Date&Time Ra Navigation View able "default" - Rows: 1000 2017-01-19713:00:46 2017-01-197121:46:57 2017-01-20715:19:20 2017-01-20715:19:20 2017-01-21T08:51:42 2017-01-21T08:51:42	nge

Options	Flow Variables Job Manager Selection Memory Policy
Output Settings	Date Time
Output type:	✓ Date&time
New column nan	
Mode Selection	
Number of rows:	
	O Variable
Starting Point	
Start:	Date: 2017-01-19 🗔 Time: 13:00:46 🔺
	_
	Time Zone: Europe/Berlin
	Use execution date&time
Ending Boint	
Ending Point	
Ending Point	
-	Date: 2018-01-19 🖸 Time: 14:00:46 📩
Interval:	
Interval:	Date: 2018-01-19 Time: 14:00:46
Interval:	
Interval:	
Interval:	

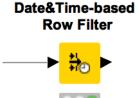
File	Hilite	Naviga	tion	View			
	Tab	le "defa	ult" –	Rows:	1000		
R	ow ID	🕘 Ti	me				
Rov			:31.15	-			
Rov			:31.15				
Rov			:31.15				
Rov			:31.15				
Rov			:31.15				
Rov			:31.15				
Rov			:31.15				
Rov	v8	14:02	:31.15	55			
Rov			:31.15				
Rov	v10	14:02	:31.15	55			
			Tir	no			
			1.11	ne			
	utout tob	No - 2.6	50 - 01	roato D	ato 8.Tir	no Pango	
				eate D	ate&Tir	ne Range	9
Hilite	Naviga	tion	View	reate D			
Hilite Fable "de	Naviga fault" –	tion Rows : 1	View	reate D		ne Range - Colum	
Hilite Fable "de Row ID	Naviga fault" -	tion Rows: 1 me	View 1000		Spec	- Colum	n: 1
Hilite Table "de Row ID w0	Naviga fault" - 2018-	tion Rows: me -01-19	View 1000 T14:0	2:31.15	Spec 55+01:	- Colum	n: 1 e/Berlir
Hilite Table "de Row ID w0 w1	Naviga fault" - 2018- 2018-	tion Rows: 1 me -01-19 -01-19	View 1000 T14:0 T14:0	2:31.19	Spec 55+01: 55+01:	- Colum 00[Europ 00[Europ	n: 1 e/Berlir e/Berlir
Hilite Table "de Row ID w0 w1 w2	Naviga fault" - 2018- 2018- 2018- 2018-	tion Rows: me -01-19 -01-19 -01-19	View 1000 T14:0 T14:0 T14:0	2:31.19 2:31.19 2:31.19	Spec 55+01: 55+01: 55+01:	- Colum 00[Europ 00[Europ 00[Europ	n: 1 e/Berlir e/Berlir e/Berlir
Hilite Table "de Row ID w0 w1 w2 w3	Naviga fault" - 2018- 2018- 2018- 2018- 2018-	tion Rows: 1 -01-19 -01-19 -01-19 -01-19	View 1000 T14:0 T14:0 T14:0 T14:0	2:31.19 2:31.19 2:31.19 2:31.19	Spec 55+01: 55+01: 55+01: 55+01:	- Colum 00[Europ 00[Europ	n: 1 e/Berlir e/Berlir e/Berlir e/Berlir
Hilite Table "de Row ID w0 w1 w2 w3 w4	Naviga fault" - 2018- 2018- 2018- 2018- 2018- 2018- 2018-	tion Rows: -01-19 -01-19 -01-19 -01-19 -01-19 -01-19	View 1000 T14:0 T14:0 T14:0 T14:0 T14:0	2:31.19 2:31.19 2:31.19 2:31.19 2:31.19	Spec 55+01: 55+01: 55+01: 55+01: 55+01:	- Colum 00[Europ 00[Europ 00[Europ 00[Europ	n: 1 pe/Berlir pe/Berlir pe/Berlir pe/Berlir pe/Berlir
Hilite able "de Row ID w0 w1 w2 w3 w4 w5	Naviga fault" - 2018- 2018- 2018- 2018- 2018- 2018- 2018- 2018- 2018- 2018-	tion Rows: 1 -01-19 -01-19 -01-19 -01-19 -01-19 -01-19 -01-19	View 1000 T14:0 T14:0 T14:0 T14:0 T14:0 T14:0 T14:0	2:31.19 2:31.19 2:31.19 2:31.19 2:31.19 2:31.19 2:31.19	Spec 55+01: 55+01: 55+01: 55+01: 55+01: 55+01: 55+01:	- Colum 00[Europ 00[Europ 00[Europ 00[Europ 00[Europ 00[Europ 00[Europ	n: 1 e/Berlin ee/Berlin ee/Berlin ee/Berlin ee/Berlin ee/Berlin ee/Berlin
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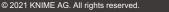


Date&Time-based Row Filter

- Filter rows from a specified time period
- Range can be limited on upper bound, lower bound, or both
- Options for end point:
 - Date&Time: Fixed date and time
 - Duration: Duration string (e.g. 2y 3M)
 - Numerical: Select granularity from a dropdown menu and enter a number

Column Selec Date&Time (
Date&Time Se	election
✓ Start:	Date: 2007-01-01 Time: 00:00:00 1 Now Time Zone: Europe/Berlin © Inclusive Use execution date&ime
✔ End:	• Date&Time • Duration • Numerical





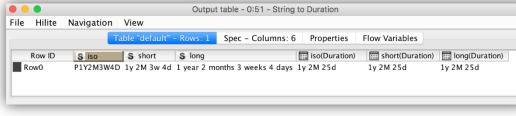


String to Duration

- Takes a String and converts it to a duration cell
- Three different options to format input Strings
- Example: Convert 1 year, 2 months, 3 weeks, and 4 days to duration cell
 - ISO-8601: "P1Y2M3W4D"
 - Short letter: "1y 2M 3w 4d"
 - Long word: "1 year 2 months 3 weeks 4 days"

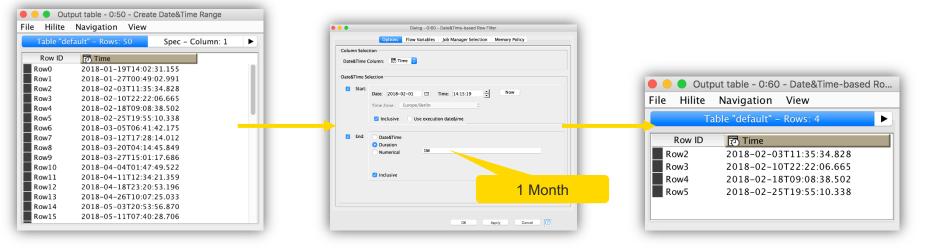
	Options Flow Variables Memory Policy
	Options Flow Variables Memory Policy
	Manual Selection Wildcard/Regex Selection r Exclude
	T Filter
	No columns in this list
	Enforce exclusion Replace/Append Selection
	Append selected columns Suffix of appended columns: (Duration) Replace selected columns Type Selection
	Automatically detect type Create date-based duration Create date-based duration
	Create time-based duration Z Fail on error
	Cancel CK - Execute Apply Cancel C
0	Z Fail on error
0 t" - Rows	C Fall on error OK - Execute Apply Cancel Ot Durput table - 0:51 - String to Duration

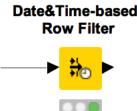




Duration-based Filtering

- Date&Time-based Row Filter allows to extract time periods
- From the start date, select all rows within the defined period
- Use one of the three options to define the duration, e.g.
 - ISO-8601: "P1Y2M3W4D"
 - Short letter: "1y 2M 3w 4d"
 - Long word: "1 year 2 months 3 weeks 4 days"





Date&Time Difference

- Choose desired granularity (days, hours, minutes, etc.)
- Check the difference between a time column and...

Date&Time

Difference

Тс

col

- Another time column
- Execution time
- User-defined time
- Previous row

	Dialog - 0:52 - Date&Time Difference
	Options Flow Variables Job Manager Selection Memory Policy
	lumn Fime column 🛛 Time ᅌ
 sec cui fix pre Output o Gra Du 	ee difference to cond column Time Time
alculate difference in, both columns ne the same type	eed to have



Date&Time Shift

- Shifts date or time by either a duration or a numerical value
- Use duration:
 - Use duration column
 - Or shift by user defined value
 - E.g. 1y, 2M, 5h, etc.
- Use numerical value in combination with selected granularity

Date&Time Shift

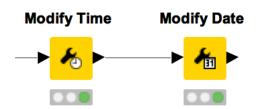
S

- Use numerical column
- Or shift by user defined value

Exclude	Manual Select	Includ		
T Filter		TE		
No columns	s in this list	» «	nestamp	
• Enforce exclusion		○ En	force inclusion	
Use Duration Use Duration column Duration value	n		\$	
O Use Numerical				
Use Numerical Numerical colum Numerical value				0

Modify Time / Modify Date

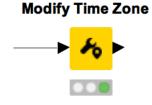
- Modify Date&Time columns
- Three options:
 - Append time (date) to a date (time) column
 - Change time (date) to a fixed value
 - Remove time (date) from a Date&Time column
- Column selection shows only columns that can be modified by the current configuration



	Options	Flow Variables	Memory Policy	
	💽 Manual Sele	ection 🔵 Wildc	ard/Regex Selection	
Exclude			Include	
T Filter		_	T Filter	
No colun	nns in this list	> >> < <	₽ timestamp	
• Enforce exclusion Replace/Append Select • Append selected c	olumns Suffix of a	ppended column	C Enforce inclusion s: (modified date)	
• Replace selected c	olumns			
 Append date Change date 	Date: 2018-08	-02		
Remove date	✓ Time Zone:	Europe/Berli	n 🗘	

Modify Time Zone

- Similar to Modify Time/Modify Date
- Input: Date&Time
 - Set time zone
- Input: Date&Time (Time zone)
 - Set time zone
 - Shift time zone
 - Remove time zone



D	ialog - 0:51 - Modify	Time Zone
Options	Flow Variables	Memory Policy
• Manual	Selection 🔵 Wildo	ard/Regex Selection
T Filter		T Filter
No columns in this list	> > < «	Timestamp
Enforce exclusion Replace/Append Selection		Enforce inclusion
 Append selected columns Suffix Replace selected columns 	of appended columr	ns: (modified time zone)
Time Zone Selection Set time zone Shift time zone Remove time zone	:: Europe/Berlin	•
	(
		Select time zone from dropdown list

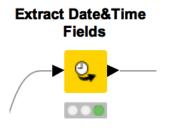
Date and Time Analysis Exercise, Activity I

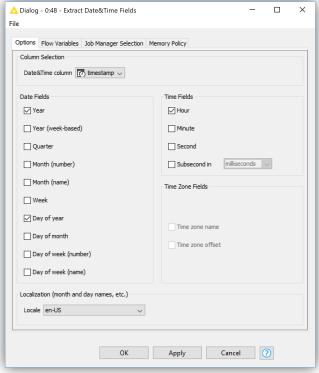
Start with exercise: Date and Time Analysis, Activity I

- Read meter_data.csv data
- Combine the individual date and time values into a timestamp with the String Manipulation node
- Convert the timestamp from String to Date&Time
- Extract the records for January 2007 with the Date&Time-based Row Filter node

Extract Date&Time Fields

- Extract date fields (year, day, month,...) or time fields (hour, minute, second,...) from a Date&Time cell
- Pick and choose which fields to include
- Useful when used in combination with data aggregation nodes (GroupBy, Pivoting, etc.)



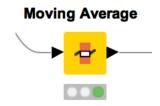




Moving Average

- Effective "smoothing" node
- Smoothing defined by
 - window type (centered, forward or backward)
 - window length
 - weighted or not
- Useful when plotting aggregated time series data to more easily see trends

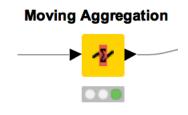
Dialog -	- 0:42 - Moving Average
Options Flo	ow Variables Memory Policy
Type of Moving Aver	rage: Center Gaussian 🗘
Window	Length 721
Re	move original columns
Exclude	Include
T Filter	Filter D Intensity
	»
	«
	OK Apply Cancel





Moving Aggregation

- Blend of GroupBy + Moving Average Functionality
- Group by moving window
- Aggregate using standard KNIME methods

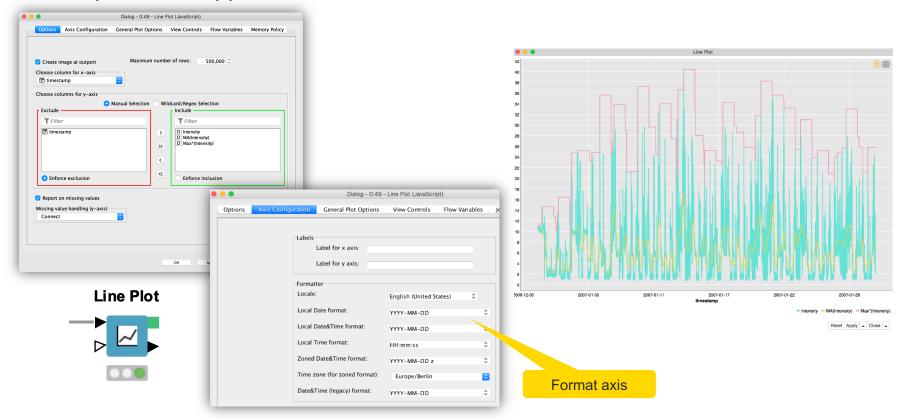


	Settings Descripti	on Flow Variables Job	Manager Selection Memory Policy	
General settings Window type Forward Central S Cumulative computation	Sackwaru	length 1440 ove aggregation columns	 Resolve missing values f Remove retained column 	
Aggregation settings	Manual Aggregat	on Pattern Based Aggrega	ation Type Based Aggregation	
Available columns Intensity Ma(intensity)	- Select add >> add all >> << remov	Column D Intensity	nultiple columns use right mouse click Aggregation (click to chang Maximum	
Maximum unique values per gro	oup 10,000 🗘 V	alue delimiter , Colu	mn naming Aggregation method (colu	umn name) ᅌ



Line Plot

Line plot with support for Date columns





Date and Time Analysis Exercise, Activity II

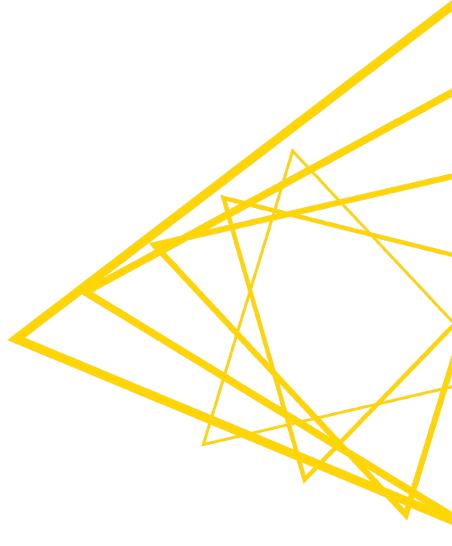
Start with exercise: Date and Time Analysis, Activity II

- Read sampled_meter_data.table data
- Extract Year, Day of Year, and Hour values from the timestamp into separate columns
- Calculate the average timestamp and average intensity by year, day, and hour
- Start a new workflow branch and calculate gaussian centered moving average of the intensity
- Calculate the maximum of the intensity column for the preceding day (1440 previous records)
- Plot the original, average, and maximum intensity in a line plot





Workflow Control Loops, Switches, Try-Catch



Workflow Control Structures

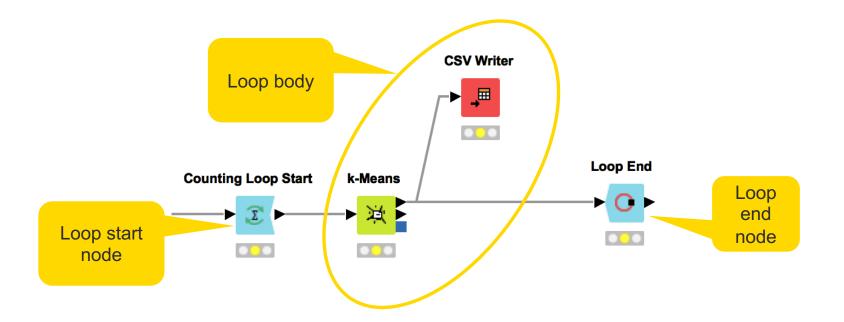
- Loops
 - Iterate over a workflow snippet with variable inputs.
- Switches
 - Direct the path of a workflow by selectively executing one or more workflow branches.
- Try-Catch
 - Handle workflow branches that may fail in execution and you don't know before execution

🗸 👽 Workflow Control > 👌 Automation V Variables Loop Support O Breakpoint Counting Loop Start Ξ Chunk Loop Start Column List Loop Start 🧭 Generic Loop Start Table Row To Variable Loop Start C Loop End V Variable Condition Loop End Group Loop Start 🌔 Interval Loop Start C Loop End (2 ports) Loop End (Column Append) Recursive Loop End Recursive Loop End (2 ports) C Recursive Loop Start Recursive Loop Start (2 ports) 🕐 Variable Loop End Switches 🛃 IF Switch ١Ē End IF case ∠ CASE Switch Data (Start) case ∠ CASE Switch Data (End) **Empty Table Switch** iF≺ Java IF (Table) S Error Handling Meta Nodes



The Loop Block

- A loop block is defined by appropriate loop start and loop end nodes.
- Loop body = Nodes in between (including side branches).



Group Loop Start

- Similar to GroupBy except without aggregation tab.
- Each iteration of the loop passes the next group of rows.
- You implement the aggregation task. It can be anything from a complex calculation to updating a database.

Group Loop Start	Manual Selection Wildcard/Regex Selection Type Selection Exclude Filter MaritalStatus S Gender EstimatedYearlyIncome NumberOfContracts
	S MaritalStatus S Gender I EstimatedYearlyIncome NumberOfContracts
	I Age S Target I Available401K I CustomerValueSegment D ChurnScore
	Enforce exclusion Input is already sorted by group column(s) [execution fails if not correctly sorted]

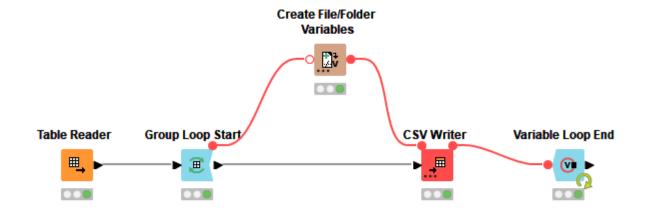
Create File/Folder Variables

- Creates one or multiple path flow variable(s) pointing to files / folders
- Inputs:
 - Base location
 - Flow variable name(s)
 - Value (file name or path relative to base location)
 - File extension (optional)
- Output variables can be used to control the output location in writer nodes.

Base location	ow Variables Job Manager Selec	tion			
Create for	Relative to v Current	workflow \checkmark			
Folder	//data/temp/products		~	Browse	
File/Folder	variables				
Variable	Base location	Value	File exte		
filePath	//data/temp/products\	roducts\		+ Add variable	
The "pa	th_values" parameter is con	itrolled by a variable.			
	e/Folder		oply Car	cel	
	bloe				
ate Fil Varia	0169				

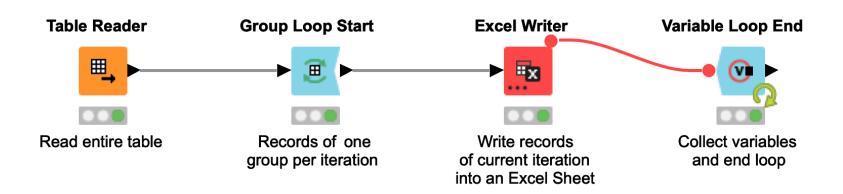
Example: Writing Aggregated Files

- Group Loop Start → Variable Loop End
- Group data by specific column values
- Iterate over all groups of data
- Create an appropriate path variable
- Write grouped data to tables with new file name





Example: Writing Multiple Excel Sheets





Workflow Control Exercise, Activity I

Goal: Build a loop that will create an Excel file with separate Excel sheets for the records of different products.

- Read the table CurrentDetailData.table (Table Reader node)
- Start a loop that handles the records for the different products in separate iterations (Group Loop Start node)
- For each product write one Excel sheet into a single Excel file (Excel Writer node)
- Close and execute the loop (Variable Loop End node)



Example: Reading Many Excel Sheets

- List all sheet names of an Excel file
- Convert sheet name into a flow variable (1 sheet name per iteration)
- In each iteration, read the spreadsheet with the current sheet name
- Close the loop and collect the results

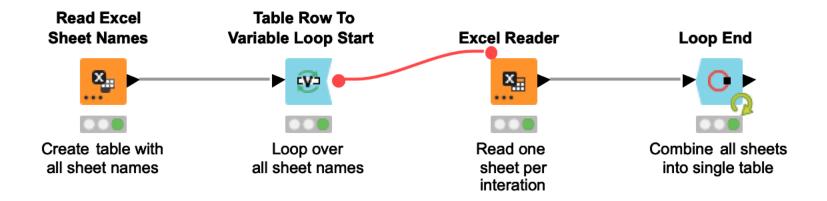
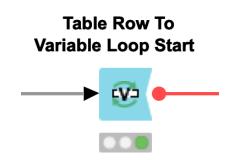




Table Row to Variable Loop Start

- Similar to the Table Row to Variable node
- Each iteration of the loop converts the next row of the input table into Flow Variables
- Injects variables into other nodes to reexecute subflows with a progression of settings



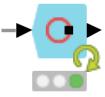
ettings Flow Variables Job Manager Selection	
Missing values Handing Fail	
Double 0.0 🗢	ildcard/Regex Selection 〇 Type Selection
Exclude Trifter No columns in this list	Include Trilter P Path
	< «
Enforce exclusion	

Loop End

- Can be used to end of a loop
- Collects the results of the different iterations by row-wise concatenation of the incoming tables
- Provides options to:
 - Add a column with the iteration number
 - Allow variable column types
 - Allow changing table specifications

Row k	key policy		
_ G	enerate new row IDs		
O Ui	nique row IDs by appe	ending a suffix	
	eave row IDs unmodif	ied	
🗸 🗸	d iteration column		
🗸 Igr	ore empty input table	es	
	ow variable column ty	ypes	
	ow changing table sp	ecifications	
ОК	Apply	Cancel 🕜	







Workflow Control Exercise, Activity II

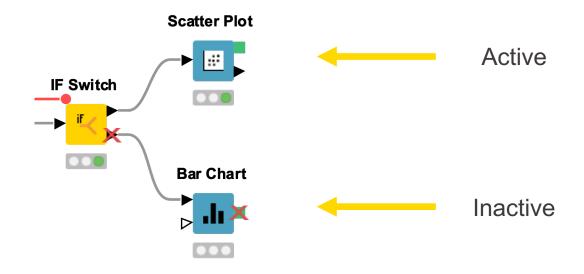
Goal: Create a loop that reads and concatenates all the sheets in an Excel file.

- Create a table that contains all sheet names of the Excel file created in Activity I (Read Excel Sheet Names node)
- Start a loop that iterates over the sheet names (Table Row to Variable Loop Start node)
- Read the Excel sheet with the sheet name in the current iteration (Excel Reader node)
- Close the loop and concatenate the tables from the different iterations (Loop End node)



Switches

- A switch allows you to selectively activate branches of a workflow
- Inactive branches are marked with a red x on their output ports.
 Inactive nodes propagate down stream.





Single Selection Configuration

- Configuration: Select single value from list of Strings
- Returns selection as string type Flow Variable
- Choose between different layout options (dropdown, radio buttons...)



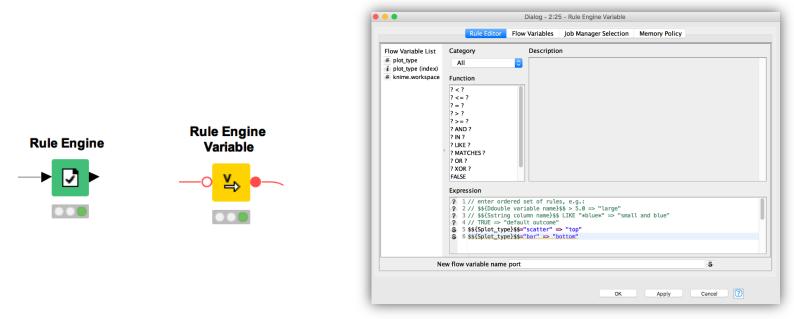


	Manager Selection Memory Policy
Label:	Select plot type:
Description:	
Parameter/Variable Name:	plot_type
Selection Type:	Dropdown 🗸
Possible Choices:	bar
	scatter
Default Value:	bar scatter
	scatter
Limit number of visible options	
Limit number of visible options	•
Number of visible options:	10



Rule Engine/Rule Engine Variable

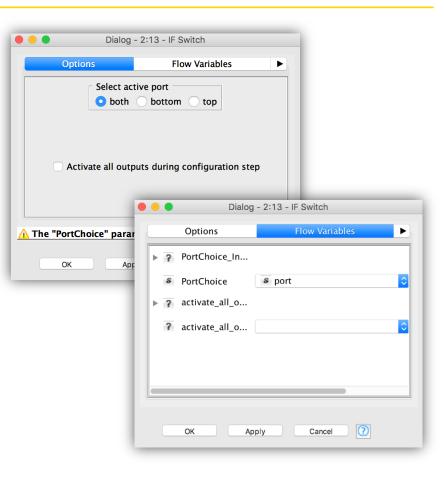
- Define custom logic using simple rules.
- Rules like: <<u>Antecedent</u>> => <<u>Consequence</u>>, e.g 1=1 => "true"
- May be used in Flow Variables or tables
- Easiest way to encode logic for switches

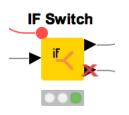


If Switch

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- Controls which branches of your workflow are active programmatically
- Controlled with a Flow Variable, setting the value to the literal Strings: "top", "bottom", "both"
- May be used in Flow Variables or tables (different nodes)



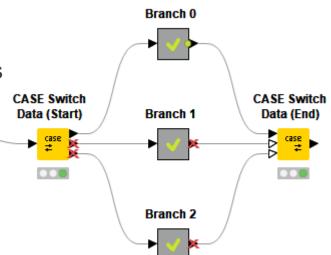






Case Switch Data

- Similar to If-Switch: Takes data from single input port and passes it to the active output port
- Nodes connected to inactive branches are not executed
- Configure via node dialog, or pass port index as Flow Variable
 - 0, 1, 2 for top, middle, and bottom port
- Case switches also available for Flow Variable and model ports





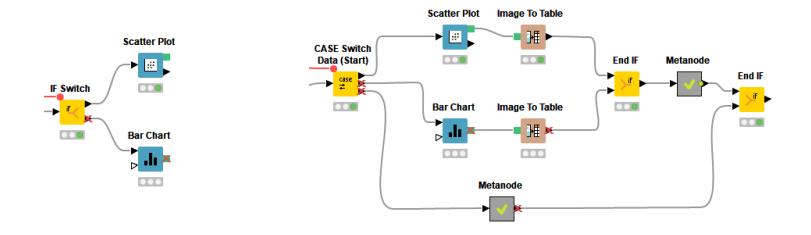
The difference between Loops and Switches

Loops

- The Loop Start is connected to the Loop End node, they form a pair.
- A loop iterates over a workflow part.

Switches

• A Switch Start can be used without a corresponding Switch End. They can also be combined.



Workflow Control Exercise, Activity III

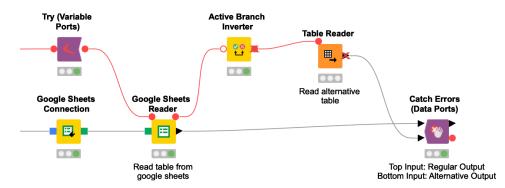
- Extend the workflow below with a switch that only creates one type of visualization
 - Create a Single Selection Configuration node with the possible values "scatter" and "bar"
 - Use the CASE Switch Data (Start) that activates the top or the middle branch depending on the selection scatter/bar (Use the "...(index)" flow variable to define the active port)
 - Combine the outputs of the two branches with the CASE Switch Data (End) node

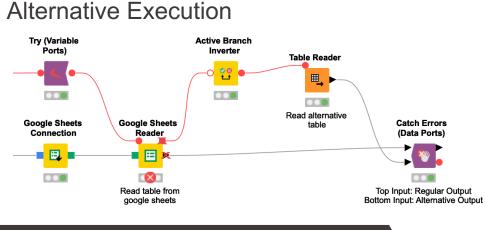


Try-Catch

- A way to catch errors in workflows
- Useful when it is hard to know if a node will execute (for example, when reading from a Google Sheet)
- KNIME tries to execute the nodes, but if it fails will fall back to an alternative branch

Regular Execution





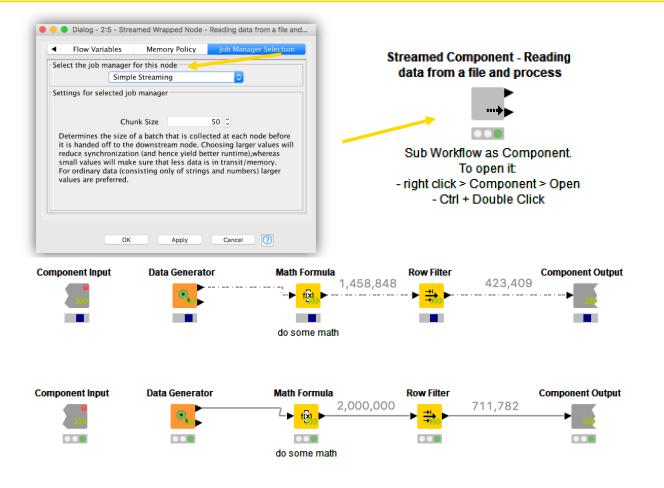


Streaming

- Standard execution: Node by node. Node processes all data, finishes, then passes data to next node, etc.
- Streaming: Nodes executed concurrently, each nodes passes data to the next as soon as it is available, i.e. before node is fully executed
 - Faster execution, esp. for reading/preprocessing data
- Install KNIME Streaming Execution (Beta) extension
- Create Component -> Configure -> Job Manager Selection -> Simple Streaming
 - Not available for all nodes (show in node repository)
 - Can only execute entire metanode, not individual nodes
 - Intermediate results not available since nothing is cached

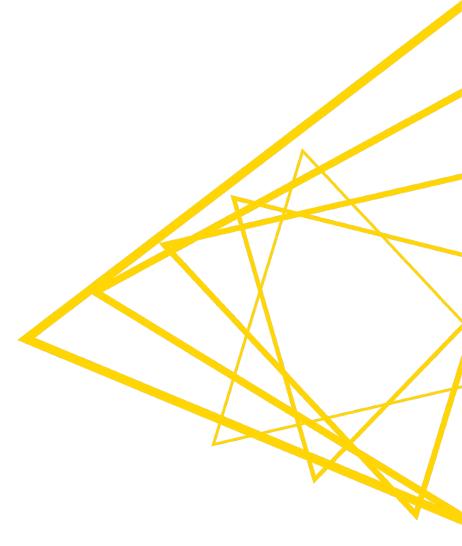


Streaming





Advanced Data Mining

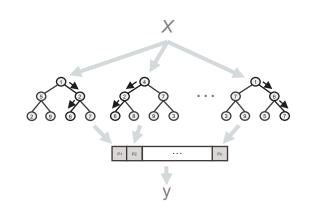


Overview

- Ensemble models
 - Random Forest / Tree Ensembles
 - Gradient Boosted Trees
- Parameter optimization
- Cross validation
- H2O and Keras integration in KNIME

KNIME's Tree Ensemble Models

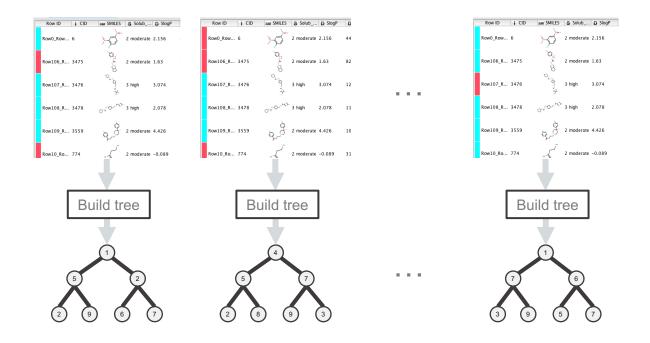
- The general idea is to take advantage of the "wisdom of the crowd"
- Ensemble models: Combining predictions from a large number of weak predictors, e.g. decision trees
- Leads to a more accurate and robust model
- This is called "bagging"



Typically: for classification the individual models vote and the majority wins; for regression, the individual predictions are averaged

How Does Bagging Work?

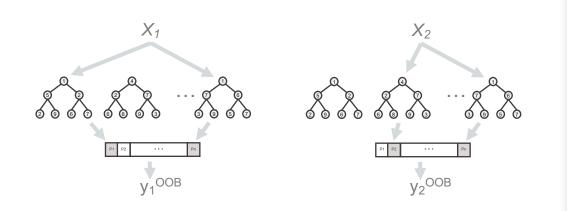
Pick a different random subset of the training data for each model in the ensemble (bag)





An Extra Benefit of Bagging: Out of Bag Estimation

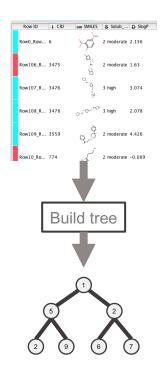
 Allows testing the model using the training data: when validating, each model should only vote on data points that were not used to train it



e Hilite I	Navigation	View					
	Table	"default" - I	Rows: 2666	Spec – Columns: 26	Properties	Flow Variables	
Row ID	S State	D P (Churn	=0) D P (Ch	urn=1) S Churn (Out-c	of-bag) D Chu	rn (Out-of-bag) model c	ount
Row1_Row0	S	0.943	0.057	0	0.943	35	
Row2_Row1	ж	1	0	0	1	33	
Row3_Row2	IJ	1	0	0	1	37	
Row4_Row3	ЭН	0.528	0.472	0	0.528	36	
Row5_Row4	ж	0.976	0.024	0	0.976	41	
Row6_Row5	۰L	0.848	0.152	0	0.848	33	
Row7_Row6	1A	0.833	0.167	0	0.833	36	
Row9_Row8	А	0.667	0.333	0	0.667	30	
Row11_Ro	N	0.138	0.862	1	0.862	29	
Row13_Ro	۹.	0.974	0.026	0	0.974	39	
Row14_Ro	4T	0.917	0.083	0	0.917	36	
Row15_Ro	4	0.387	0.613	1	0.613	31	
Row18_Ro	т	0.974	0.026	0	0.974	39	
Row19_Ro	'A	1	0	0	1	38	
Row21_Ro	L	0.971	0.029	0	0.971	34	
Row22_Ro	:0	0.03	0.97	1	0.97	33	
Row23_Ro	Z	0.854	0.146	0	0.854	41	
Row25_Ro	'A	0.973	0.027	0	0.973	37	
Row26_Ro	IE	0.886	0.114	0	0.886	35	
Row27_Ro	٧Y	0.912	0.088	0	0.912	34	
Row28_Ro	4T	0.976	0.024	0	0.976	42	
Row29_Ro	10	1	0	0	1	42	
Row30_Ro	11	1	0	0	1	40	
Row32_Ro	IH	0.914	0.086	0	0.914	35	
Row33_Ro	A	0.875	0.125	0	0.875	32	

Random Forest

- Train a bag of decision trees
- For each tree / model a training set is generated by sampling uniformly with replacement from the standard training set
- An extra element of randomization is used when building the trees: **each node** in the decision tree only "sees" **a subset of the input columns**, typically \sqrt{N}
- Random forests tend to be very robust w.r.t. overfitting (though the individual trees are almost certainly overfit)
- Extra benefit: training tends to be much faster



Random Forest Learner

- The output model describes a random forest and is applied in the corresponding predictor node using a simple majority vote
- The statistics table on the attributes tells how often each attribute...
 - ... is used in the first three splits
 - ... was a possible candidate in the first three splits



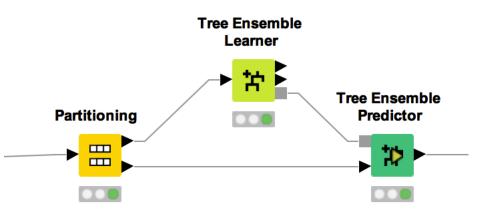
	Options Flow Variables	Memory Policy	
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Attribute Selection			
O Use fingerprint attribute	[B <no fingerprint="" input="" valid=""></no>	٥
 Use column attributes 			
	Manual Selection 🔵 Wilde		
Exclude		Include	
T Filter		▼ Filter	
No columns in this lis	it 🔊	I age S workclass	
	»	fnlwgt	
		S education	
	<	S marital-status S occupation	
	~		
Enforce exclusion		Enforce inclusion	
Misc Ontions			
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Tree Ensembles

- Random Forest is a specific tree ensemble with predefined ensemble parameters
- The Tree Ensemble Learner node allows to train different tree ensembles
 E.g. different row and column sampling options
- Optimization of a tree ensemble is complex due to a surplus of configuration options
 - Number of models
 - Number of columns
 - Number of rows
 - Tree depth

....



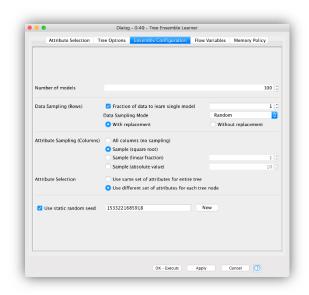


Tree Ensemble Learner

- Choose which columns to include
- Configure a prototype tree (depth, split criteria etc.)
- Setup ensemble parameters (model count, row/column subsampling)

Attribute Selection Tree Opti	ons Ensemble Configuration Flow Variables Memory Policy
Farget Column	S Target
Attribute Selection	
 Use fingerprint attribute 	■ <no fingerprint="" input="" valid=""> 0</no>
 Use column attributes 	
O Man	ual Selection 🔿 Wildcard/Regex Selection
Exclude	Include
T Filter	TFilter
No columns in this list	S Gorder S Gorder S Gorder I Estimated Vearly/norme I Estimated Vearly/norme I Availed Voarly/norme I Availed Voarly/norme D Countrol ValueSegment D Countrol ValueSegment Enforce inclusion
lisc Options	
Ignore columns without domain in	formation
Enable Hilighting (#patterns to sto	re) 2,000 C
Save target distribution in tree nod	es (memory expensive - only important for tree view and PMML export)
The "nrModels" parameter is contro	lied by a variable.

Attribute Selection Tree Optio	ns Ensemble Configuration	Flow Variables	Memory Policy
Split Criterion	Information Gain Ratio		
Use mid point splits (only for nume	eric attributes)		
🗹 Use binary splits for nominal colum	nns.		
Limit number of levels (tree depth)			10 0
Minimum split node size			1 0
Minimum child node size			1 0
Use fixed root attribute	WebActivity		\$
	OK - Execute	Apply	Cancel 🕜





Gradient Boosted Trees Learner

- Another algorithm for creating ensembles of decision trees
- Starts with a shallow tree
- Builds additional trees to fit the residual errors
- Can introduce randomness in choice of data subsets ("stochastic gradient boosting") and in variable choice (Advanced Options)

		Out	Advantation Open	s Flow Variables Is		osted Trees Learner	Manage Balling
		Options	Advanced Options	Flow Variat	bles .	Job Manager Selection	Memory Policy
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	Dialog - 0:108 - Gradient Boosted Trees	 Enforce exclu 	ision		<u>«</u>	Enforce inclusion	
Options Advanced	d Options Flow Variables Job Mana	Tree Options					
			f levels (tree depth)				4 0
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options		Boosting Options					
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ig value handling	XGBoost			-	OK	Apply	
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Advanced Data Mining Exercise, Activity I

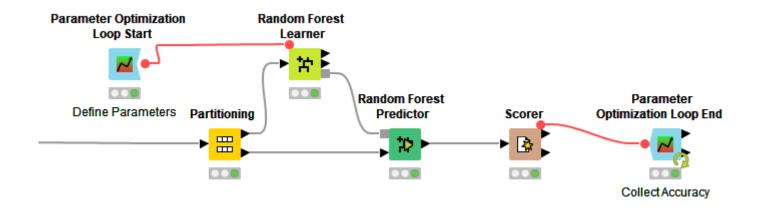
Start with exercise: Advanced Data Mining, Activity I

- Read *CurrentDetailData.table* data
- Partition the data 50/50 using stratified sampling on the "Target" column
- Train and apply a Random Forest model to predict the "Target" column
- Use a tree depth of 5 and 50 models



Parameter Optimization

- Some modeling approaches are very sensitive to their configuration.
- Calculating optimum settings is not always possible.
- Parameter Optimization loops may help find a good configuration.

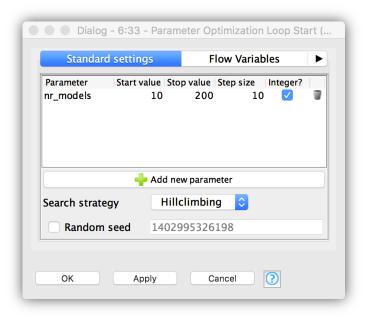




Parameter Optimization Loop Start

- Define parameters to optimize
- Set upper/lower bounds and step sizes (and flag integers)
- Choose an optimization method
 - Brute force for maximum accuracy, but slower computation
 - Hillclimbing for better faster runtimes, but may get stuck in local optimum settings
 - Random search to randomly search for parameter values within a given range
 - Bayesian Optimization (TPE)

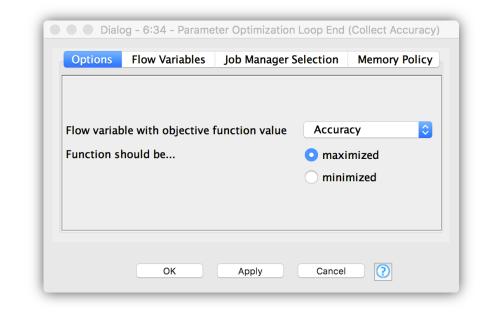


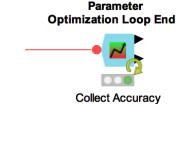




Parameter Optimization Loop End

- Collects a value to optimize as Flow Variable.
- Value may be maximized (accuracy) or minimized (error)







Advanced Data Mining Exercise, Activity II

Start with exercise: Advanced Data Mining, Activity II

- Add a parameter optimization loop to your model training process
- Use Hillclimbing to determine the optimum number of models (min=10, max=200, step=10, int = yes)
- Use maximum accuracy as the objective value
- What is the best number of models?

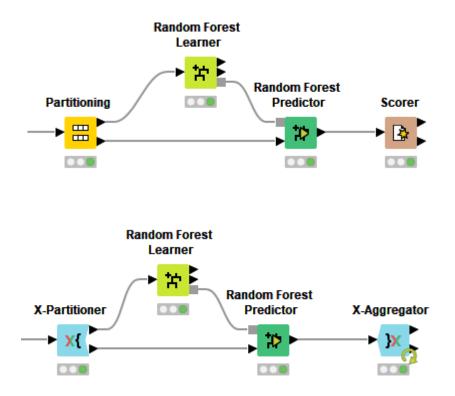
(Hint: don't forget to use the flow variable in the Random Forest Learner node)

 (Optional): Train and save a model with the best parameter set (using a Table Row to Variable, Random Forest Learner, and Model Writer node)



Cross Validation

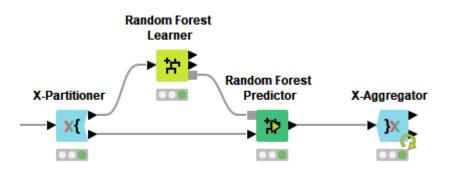
- Used to evaluate model stability
- Re-execute the modeling process many times using different data partitions
- Collect aggregated statistics on model accuracy

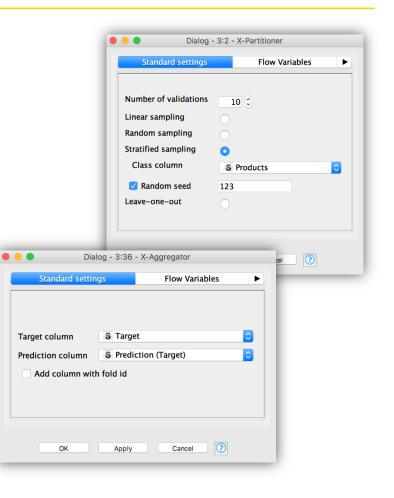




Example: Cross Validation

- X-Partitioner → X-Aggregator
- X-Partitioner replaces Partition
- X-Aggregator replaces Scorer
- Can be used with any learner/predictor







Binary Classification Inspector

- Inspect and compare the performances of classification models
- Adjust the classification threshold according to the goal of your model





Advanced Data Mining Exercise, Activity III

Start with exercise: Advanced Data Mining, Activity III

- Create a 10-fold cross validation for your model
- Take a look at the error rates produced by the different iterations. Does the model seem stable?

91



Advanced Data Mining Exercise, Activity IV (Optional)

Start with exercise: Advanced Data Mining, Activity IV (Optional)

Goal: Train a decision tree and a random forest model and compare their performance

- Partition the data 50/50 using stratified sampling on the "Target" column
- Train and apply a Random Forest model to predict the "Target" column
- Train and apply a Decision Tree model to predict the "Target" column
- Combine the performances of both models (Column Appender node)
- Evaluate the performances of the models (Binary Classification Inspector node) Which model performs better?



H2O Integration

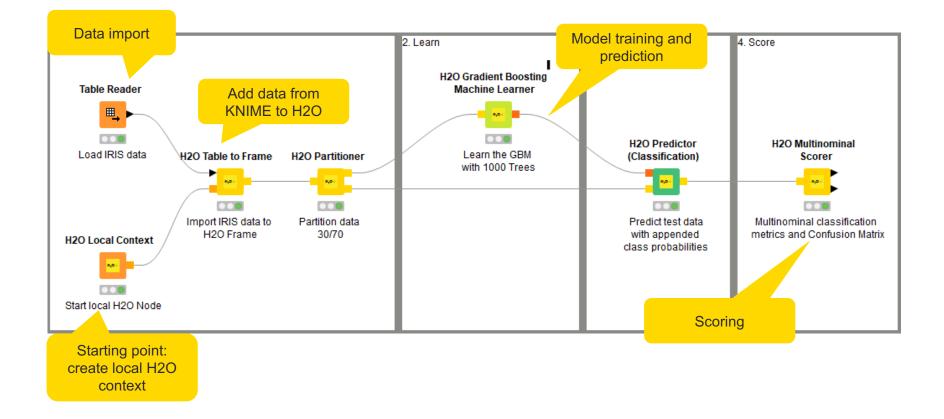
- KNIME integrates the H2O machine learning library
- H2O: Open source, focus on scalability and performance
- Supports many different models
 - Generalized Linear Model
 - Gradient Boosting Machine
 - Random Forest
 - k-Means, PCA, Naive Bayes, Isolation Forest, etc. and more to come!
- Includes support for MOJO model objects for deployment

```
✓ ➡ H2O Machine Learning
   > 12 10
   > B MOJOs
     📁 Manipulation
     📁 Misc
    B Models
     🗸 🗁 Generalized Linear Model
           ⊷ H2O Generalized Linear Iviodel Learner
          H2O Generalized Linear Model Learner (Regression)
     Generalized Low Rank Models
           H2O Generalized Low Rank Models (Missing Value Impute)
     H2O Gradient Boosting Machine Learner
           H2O Gradient Boosting Machine Learner (Regression)
     Isolation Forest
          H2O Isolation Forest Learner
     🗸 🗁 Naive Bayes
           💀 H2O Naive Bayes Learner
     🗸 📁 PCA
           H2O PCA
           💀 H2O PCA Apply
           H20 PCA Compute
     Random Forest
           💀 H2O Random Forest Learner
           H2O Random Forest Learner (Regression)
     k-Means
           💀 H2O k-Means
        💀 H2O Cluster Assigner
```

⊷ H2O Isolation Forest Predictor



H2O Integration - Example





Deep Learning Integration

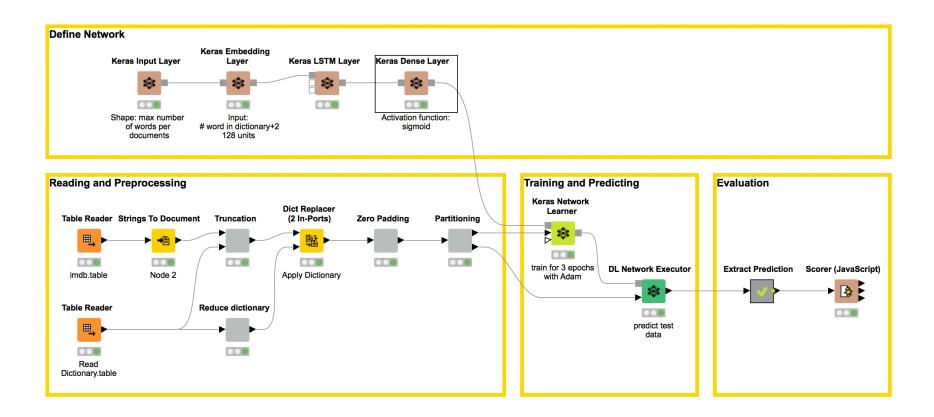
- Keras integration:
 - Many different layer nodes.
 - Define your network, train and apply a network without a single line of code.
- DL Python integration
- TensorFlow integration

✓ (∰) Deep Learning 🔻 K Keras DL4J > 📁 1/0 > 🗁 Layer > 📁 Learn > > > Networks > 📂 Predict 🕞 Word Embeddings V K Keras > 🗁 Layers Keras Freeze Layers Keras Network Executor Keras Network Learner Keras Network Reader Keras Network Writer Keras Set Output Lavers V 🟓 Python DL Python Network Creator DL Python Network Editor DL Python Network Executor DL Python Network Learner Keras to TensorFlow Network Converter TensorFlow Network Executor TensorFlow Network Reader TensorFlow Network Writer

🔻 글 Layers Advanced Activations Convolution Keras Convolution 1D Layer Keras Convolution 2D Layer Keras Convolution 3D Layer Keras Cropping 1D Laver Keras Cropping 2D Layer Keras Cropping 3D Layer Keras Separable Convolution 1D Layer Keras Separable Convolution 2D Layer Keras Transposed Convolution 2D Layer Keras Upsampling 1D Layer Keras Upsampling 2D Layer Keras Upsampling 3D Laver 🗟 Keras Zero-Padding 1D Layer Keras Zero-Padding 2D Layer 🗟 Keras Zero-Padding 3D Layer V Core Keras Activation Layer 🗟 Keras Activity Regularization Layer 🗟 Keras Dense Layer 🗟 Keras Dropout Layer Keras Flatten Layer Keras Input Layer Keras Masking Layer 🗟 Keras Permute Layer 😹 Keras Repeat Layer 🗟 Keras Reshape Layer Embedding Keras Embedding Layer Locally Connected Merge Noise Normalization Pooling Recurrent SKeras Convolutional LSTM 2D Layer Keras CuDNN GRU Layer 😹 Keras CuDNN LSTM Layer

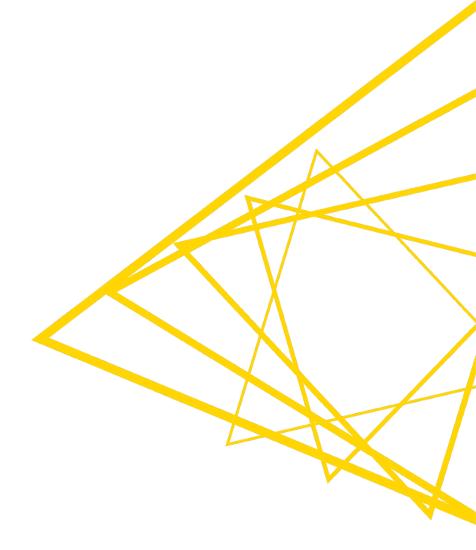


Sentiment Analysis Using Keras



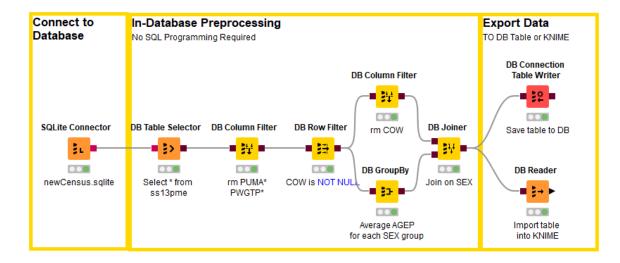


Databases



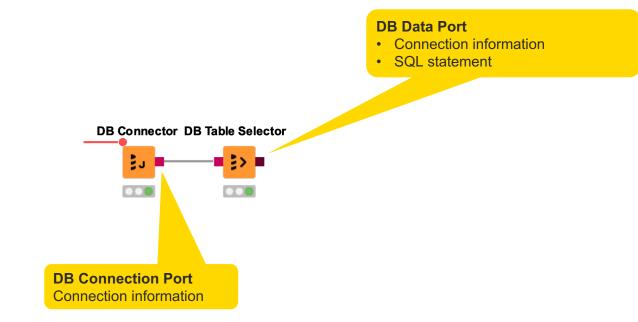
Database Extension

- Visually assemble complex SQL statements (no SQL coding needed)
- Connect to all JDBC-compliant databases
- Harness the power of your database within KNIME
- Complete rewrite in KNIME Analytics Platform 4.0





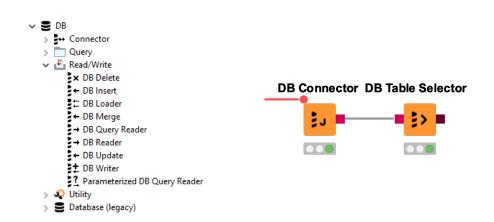
Database Port Types





DB Table Selector

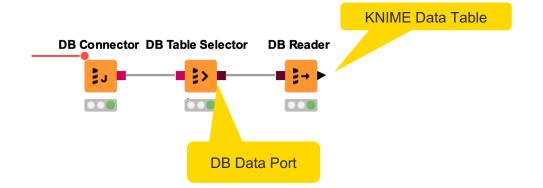
- Takes connection information and constructs a query
- Explore DB metadata
- Outputs a SQL query



🛕 Dialog File	- 8:17 - DB Table Sel	lector			-		×
Settings	Input Type Mapping	Flow V	ariables	Memory I	Policy		
DB Tab	e Selector	Table:	ss13pm	ne	Selec	ct a table	
Cust	om Query						
	ОК	pply		Cancel		2	

DB Reader

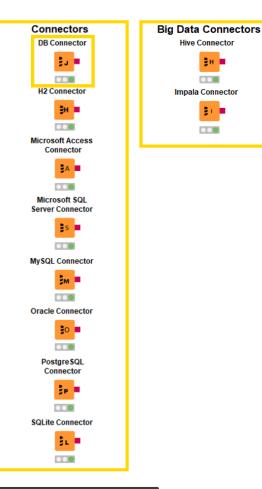
- Executes incoming SQL Query on Database
- Reads results into a KNIME data table





Database Connectors

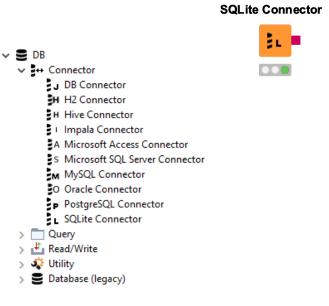
- Dedicated nodes to connect to specific Databases
 - Necessary JDBC driver included
 - Easy to use
 - Import DB specific behavior/capability
- Hive, Impala connectors part of the KNIME Big Data Connectors extension
- General DB Connector
 - Can connect to any JDBC source
 - Register new JDBC driver via
 File -> Preferences -> KNIME -> Databases





Dedicated Database Connectors

- MySQL, MS SQL Server, Postgres, SQLite, Amazon Redshift, etc.
- Propagate connection information to other DB nodes



🛕 Dialog - 3:105 - SQLite Connector Х File Input Type Mapping Output Type Mapping Memory Policy Advanced Flow Variables Connection Settings JDBC Parameters Configuration ~ Database Dialect: SOLite \sim Driver Name: SQLite \sim Location knime://knime.workflow/../../newCensus.sqlite Path: \sim Browse... O In-memory: temporary OK Cancel Apply

«General» DB Connector Node

🛆 Dialog - 0:16 - DB Connector — 🗆 🗙	▲ Dialog - 0:16 - DB Connector — □ File
Connection Settings JDBC Parameters Advanced Input Type Mapping	Output Type Mapping Flow Variables Job Manager Selection Memory Po Connection Settings JDBC Parameters Advanced Input Type Mappin
Connection	
Database Type: Default 🗸	Database Type: Default
Database Dialect: SQL-92 ~	Database Dialect: SQL-92
Driver Name: SQLite 🗸	Driver Name:
Database URL: jdbc:sqlite: <file>?</file>	Database type defines Database URL: jdbc:sqlite: <file>?</file>
Authentication	SQL dialect
None	None
○ Credentials	Credentials
⊖ Username	⊖ Username
O Username & password	O Username & password
◯ Kerberos	() Kerberos
OK Apply Cancel ?	OK Apply Cancel 👔

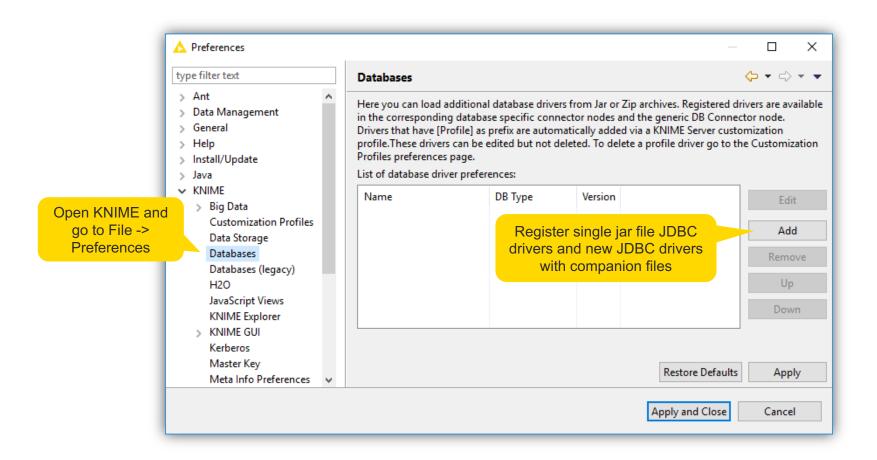


Memory Policy

 \times

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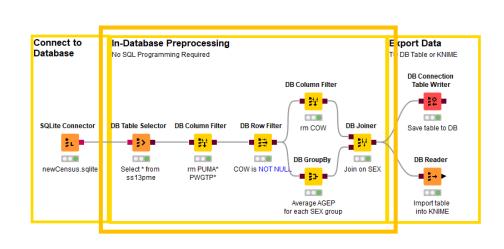
Register JDBC Driver

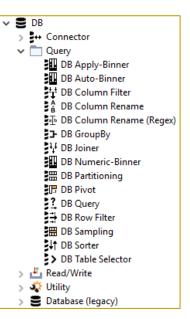




In-Database Processing

Database Manipulation node generates a SQL query on top of the input SQL query (brown square port)



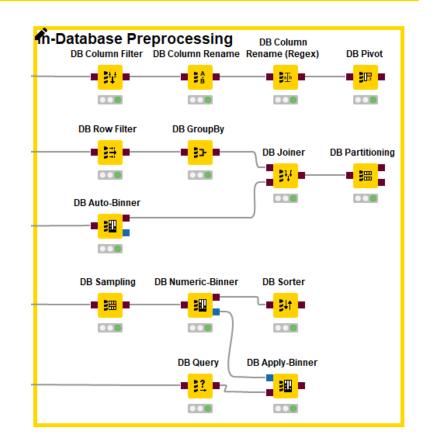






Query Nodes

- Filter rows and columns
- Join tables/queries
- Extract samples
- Bin numeric columns
- Sort your data
- Write your own query
- Aggregate your data
- Partition your data





RowID	Group	Value
r1	m	2
r2	f	3
r3	m	1
r4	f	5
r5	f	7
r6	m	5

Aggregated on "Group" by method: sum("Value")



DB GroupBy

Aggregate rows to summarize data

- First tab provides grouping options
- Second tab provides control over aggregation details

▲ Dialog - 0:218 - DB GroupBy - □ ×		🛕 Dialog - 0:218 - DB GroupBy	- 🗆 ×
File		File	
	DB GroupBy	File Settings Description Flow Variables Job Manager Selection Memory Policy Groups Manual Aggregation Pattern Based Aggregation Type Based Aggregation Aggregation settings	1
Advanced settings		Advanced settings	
Column naming: Aggregation method (column name) v Add COUNT(*) column name: COUNT(*)		Column naming: Aggregation method (column name) V Add Co	OUNT(*) column name: COUNT(*)
OK Apply Cancel	Returns nu	mber of rows per group	Cancel
		in set et te te per group	



DB GroupBy – DB Specific Aggregation Methods

roups Manual Aggregation	Pattern Based Aggre	egation Type Based Aggregatio	n	
Aggregation settings Available columns S MaritalStatus S Gender I EstimatedYearlyIncom NumberOfContracts I Age S Target	Select	To change mult Column	iple columns use right mouse click for context in Aggregation (click to change) TOTAL AVG COUNT GROUP_CONCAT	Parametr
I arget Available401K CustomerValueSegmer D ChurnScore I CallActivity I SentimentRating I WebActivity	add >> add all >> << remove]	MAX MIN SUM TOTAL custom	
< >	<< remove all			
dvanced settings	: Aggregation method	(column name) 🗸 🔽 Add C	OUNT(*) column name: COUNT(*)	

SQLite: 7 aggregation functions

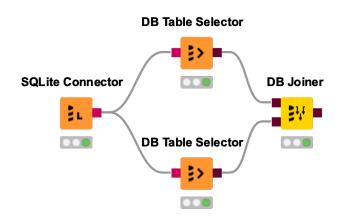
Aggregation settings — Available columns	Select	To change multiple	e columns use right mouse click for co	ntext m	enu.	
D sepal length		Column	Aggregation (dick to chan		Parameter	
D sepal width D petal length		D sepal length	ARRAY AGG		1	~
		D sepal width		× ×		^
D petal width		D petal length	AVG	0 A	Edit	
rowidx		D petal width	CORR		Edit	
S id		D sepal length	COUNT		Edit	
		D sepal width	COVAR POP		Edit	
		D petal length	COVAR SAMP		Edit	
		D petal width	MAX			
		D sepal length	MIN			
	C C C C C C C C C C C C C C C C C C C	D sepal width	D sepal width REGR_AVGX		Edit	
	<< remove all	D petal length	REGR_AVGY		Edit	1
		D petal width REGR_COUNT			Edit	1
		D sepal length	REGR_INTERCEPT		Edit	1
		D sepal width	REGR_R2		Edit]
		D petal length	REGR_SLOPE		Edit]
		D petal width	REGR_SXX		Edit]
		D sepal length	REGR SXY		Edit	14

PostgreSQL: 25 aggregation functions



DB Joiner

- Combines columns from 2 different tables
- Top port contains "Left" data table
- Bottom port contains the "Right" data table

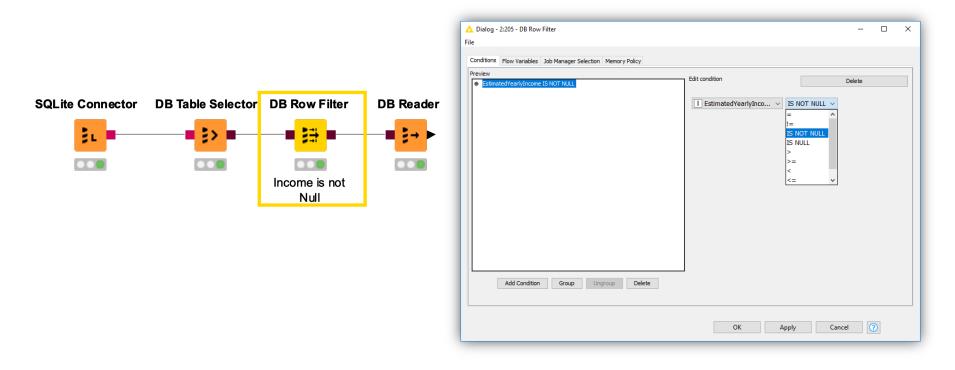


▲ Dialog - 0:222 - DB Joiner –	×
Joiner Settings Column Selection Flow Variables Job Manager Selection Memory Policy	
Join Mode Join mode Inner Join v	^
Joining Columns Match all of the following O Match any of the following 	
Top Input ('left' table) Bottom Input ('right' table)	
D serialno v + ·	-
	~
OK Apply Cancel 🕐	



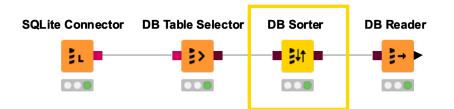
DB Row Filter

- Filters rows that do not match the filter criteria
- Use the IS NULL or IS NOT NULL operator to filter missing values



DB Sorter

Sorts the input data by one or multiple columns

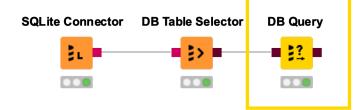


▲ Dialog - 0:231 - DB Sorter File	– 🗆 ×
Sorting Filter Flow Variables Job Manager Selection Sort by:	Memory Policy
I SentimentRating V	 Ascending Descending
Next by:	 Ascending Descending
Next by:	 Ascending Descending
Add columns	
OK Apply Cancel	0



DB Query

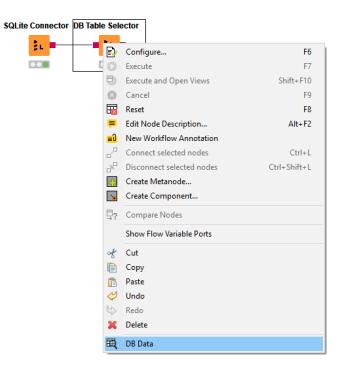
- Executes arbitrary SQL queries
- #table# is replaced with input query



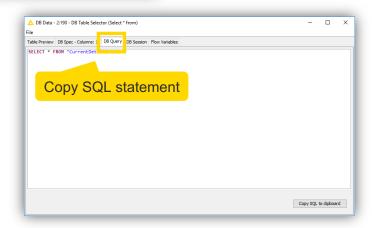
Database Metadata Brow					
	ser	SQI	Statement		
	Q	1	SELECT * FROM #table# LIMIT 10		^
SCHEMA					
🖶 📊 TABLE					
CurrentD					
newTable ss13hme					
ss13pme					
	Fetched 1 minute ago	1			
~	retched 1 minute ago				
Flow Variable List	Database Column List				
s" knime.workspace	MaritalStatus				
s killine.workspace	Gender				
	EstimatedYearlyIncome	Ш.,			
	NumberOfContracts	Ш.,			
	Age				
	Age Target Available401K				
	Target			 	v



Database Connection Port View



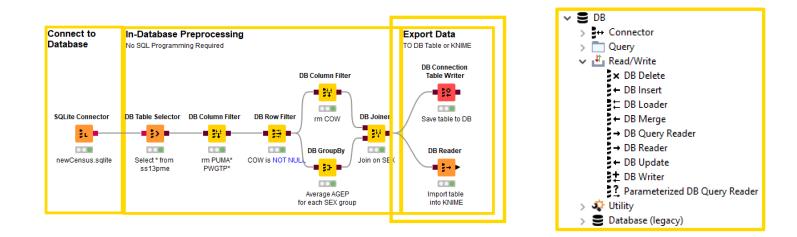
ble Preview	B Spec - Columns	s: 13 DB Quer	y DB Session	Flow Variables			
		Cache	no. of rows:	100			
Row ID	S Marital	S Gender	Estimat	Number	Age	S Target	
Row0	M	м	90000	0	44	1	_
Row1	S	м	60000	1	45	1	
Row2	M	м	60000	1	45	1	
Row3	S	F	70000	1	42	1	
Row4	S	F	80000	4	42	1	
Row5	S	м	70000	1	45	1	
Row6	S	F	70000	1	44	1	
Row7	M	м	60000	2	46	1	
Row8	S	F	60000	3	46	1	
Row9	S	м	70000	1	46	1	
Row 10	S	F	70000	1	46	1	
Row11	M	м	60000	4	46	1	_
Row12	M	F	100000	2	42	0	_





Export Data

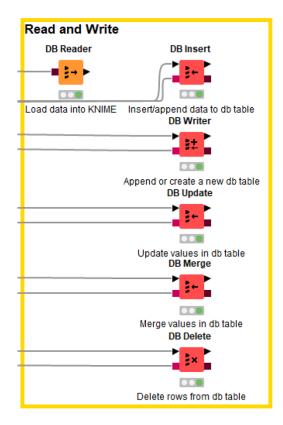
- Writing data back into database
- Exporting data into KNIME
- SQL operations are executed on the database!





Database Writing Nodes

- Create table as select
- Insert/append/merge data
- Update values in table
- Delete rows from table





DB Writer

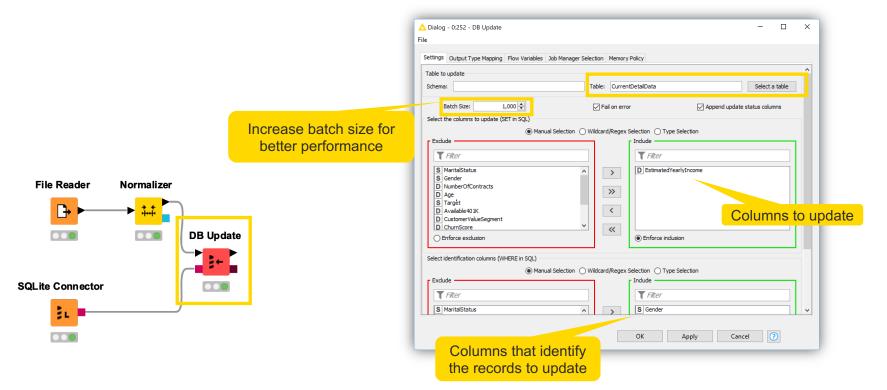
 Writes data from a KNIME data table directly into a database table File Reader

Settings Output Type Mapping Flow Variab	oles Job Manager Selec	tion Mem	ory Policy		_
Table to write					
Schema:	Table	e: Curren	tDetailData	Select a table	
Batch Size: 1,000	Fail on error	V A	oppend write status columns	Remove existing table	
- Select the columns to write (T in SQL)					- 1
	nual Selection 🔘 Wildca		Selection O Type Selection		
Exclude			Include		
T Filter			T Filter		
		>	S MaritalStatus		
rease batch size for		-	S Gender	Append to	o or o
etter performance		>>	EstimatedYearlyIncome NumberOfContracts	existing	tabl
outor portornarioo			1 Age	er tie	,
		<	S Target		
		<<	I CustomerValueSegment		
			D ChurnScore	*	
Enforce exclusion			 Enforce inclusion 		
					-

ettings Output Type Mapping	Flow Variables	Job M	Manager Selecti	on Memory Policy				
Mapping by Name								
Column Name	Re	egex	Source Type		Mapping		0	
								^
								~
Mapping by Type								
			1	Mapping			0	
KNIME Type				Mapping → String → VARCHAI	۹.		0	^
KNIME Type String			-				0	^
KNIME Type String Boolean value			-	\rightarrow String \rightarrow VARCHAI	AN		0	^
KNIME Type String Boolean value Number (integer)			-	\rightarrow String \rightarrow VARCHAN \rightarrow Boolean \rightarrow BOOLE	AN		0	^
KNIME Type String Boolean value Number (integer) Number (long)			-	→ String → VARCHAI → Boolean → BOOLE → Integer → INTEGE	AN R		•	^
KNIIME Type String Boolean value Number (integer) Number (long) Number (double)				→ String → VARCHAI → Boolean → BOOLE → Integer → INTEGE → Long → BIGINT	AN R			^
KUIWE Type String Boolean value Number (integer) Number (double) Local Date Local Time				→ String → VARCHAI → Boolean → BOOLE → Integer → INTEGE → Long → BIGINT → Double → DOUBLE	AN R			^
KVIIME Type String Boolean value Number (integer) Number (double) Local Date Local Time			- - - - - - - -	→ String → VARCHAI → Boolean → BOOLE → Integer → INTEGE → Long → BIGINT → Double → DOUBLE → LocalDate → DATE	AN R :			
KVIIME Type String Soolean value Number (integer) Number (double) Local Date			- - - - - - - -	String → VARCHAI Boolean → BOOLEE Integer → INTEGE Long → BIGINT Double → DOUBLE LocalDate → DATE LocalTime → TIME	AN R :	MEZONE		
KVIIME Type String Boolean value Number (integer) Number (double) Local Date Local Time Local Date Time			- - - - - - - -	String → VARCHAI Boolean → BOOLEE Integer → INTEGE Long → BIGINT Double → DOUBLE LocalDate → DATE LocalTime → TIME	AN R : : : : : :	MEZONE		
KNIME Type String Boolean value Number (integer) Number (double) Number (double) Occal Date Local Date Time			- - - - - - - -	String → VARCHAI Boolean → BOOLEE Integer → INTEGE Long → BIGINT Double → DOUBLE LocalDate → DATE LocalTime → TIME	AN R : : : : : :	MEZONE		

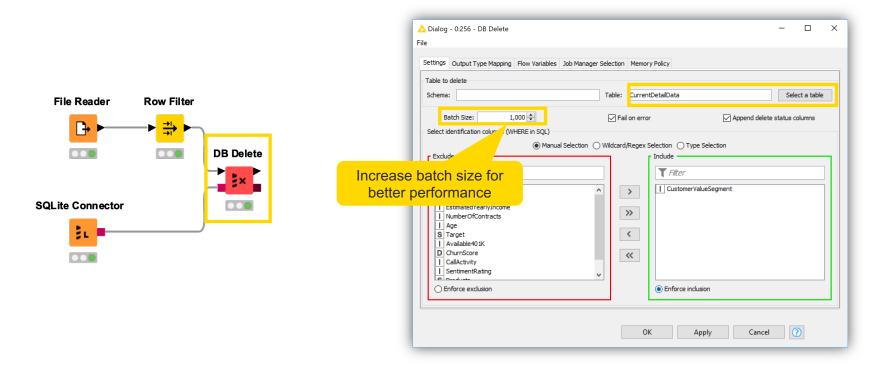
DB Update

Updates all database records that match the update criteria



DB Delete

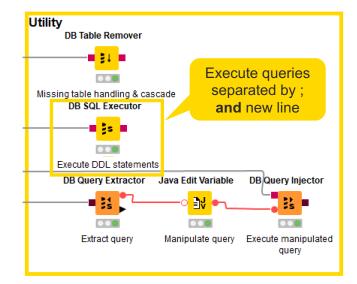
Deletes all database records that match the values of the selected columns.





Utility

- Drop table
 - missing table handling
 - cascade option
- Execute any SQL statement e.g. DDL
- Manipulate existing queries





Database Exercise

- Connect to the *database.mv.db* database with the H2 Connector node
- Write the Fully Joined Data into the database as a new table called "adult"
- Select the "adult" table in the database
- Count the number of records per product
- Filter out products that occur less than 1000 times by joining the aggregated and the original database table
- Read the filtered database table into a KNIME data table



Thank You! education@knime.com

