# KNIME TUTORIAL

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## What is KNIME?

- KNIME = Konstanz Information Miner
- Developed at University of Konstanz in Germany
- Desktop version available free of charge (Open Source)
- Modular platform for building and executing workflows using predefined components, called nodes
- Functionality available for tasks such as standard data mining, data analysis and data manipulation
- Extra features and functionalities available in KNIME by extensions
- Written in Java based on the Eclipse SDK platform

## **KNIME resources**

- Web pages containing documentation
  - <a>www.knime.org</a> tech.knime.org tech.knime.org
  - installation-0
- Downloads
  - knime.org/download-desktop
- Community forum
  - tech.knime.org/forum
- Books and white papers
  - knime.org/node/33079

### Installation and updates

- Download and unzip KNIME
  - No further setup required
  - Additional nodes after first launch
- New software (nodes) from update sites
  - <u>http://tech.knime.org/update/community-contributions/</u> <u>realease</u>
- Workflows and data are stored in a *workspace*



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#### **Download KNIME Desktop & SDK**

Download the latest KNIME Deskop and KNIME SDK version 2.8.2 for Windows, Linux, and Mac OS X.

#### **KNIME Desktop**

The KNIME Desktop version is intended for end users and provides everything needed to immediately begin using KNIME as well as extend KNIME with extension packages developed by others. The downloads also contain the KNIME quickstart guide.

#### Windows

Usually unzipping the archive somewhere on your hard drive is sufficient for the installation of KNIME. However, under Windows problems with the built-in unzip utility sometimes truncate file names. Therefore we offer self extracting archives:

- KNIME for Windows 32bit (self-extracting archive)
- KNIME for Windows 64bit (self-extracting archive)

If you are using a proper unzipper and want to use zip archives instead, you can find them here.

#### Linux

For Linux a 32 and 64bit build are available:

- KNIME for Linux 32bit
- KNIME for Linux 64bit

#### Mac OS X

Since KNIME 2.3.0 we are proud to announce a fully supported KNIME build for Mac OS X. It requires a 64bit Intelbased architecture with Java 1.6:

## What can you do with KNIME?

#### Data manipulation and analysis

• File & database I/O, filtering, grouping, joining, ....

#### Data mining / machine learning

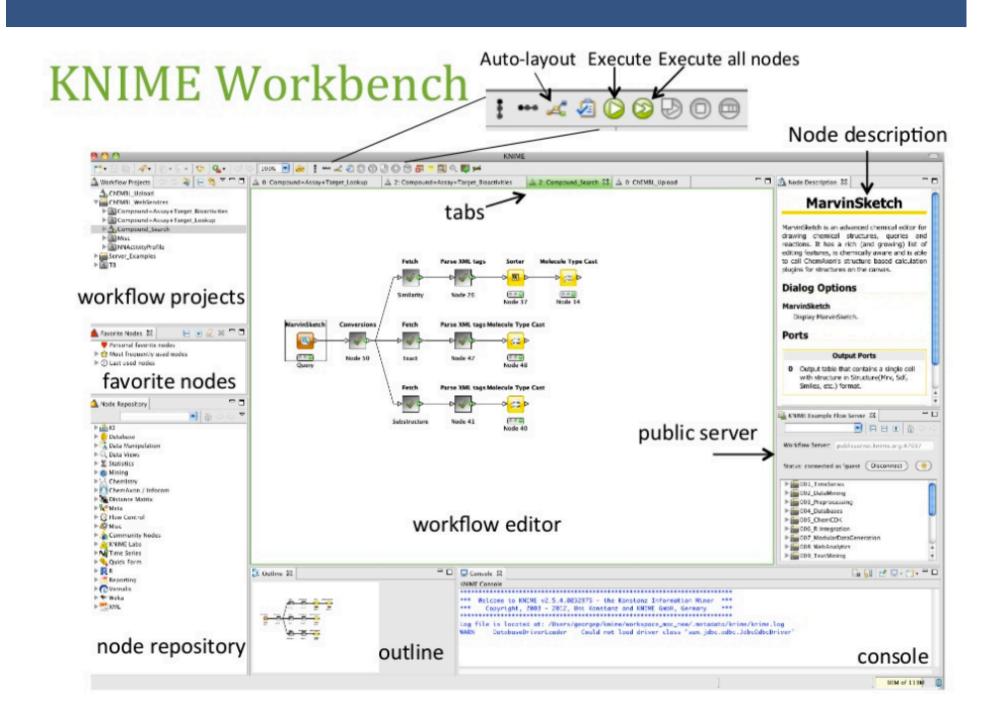
• WEKA, R, Interactive plotting

#### Scripting Integration

• R, Perl, Python, Matlab ...

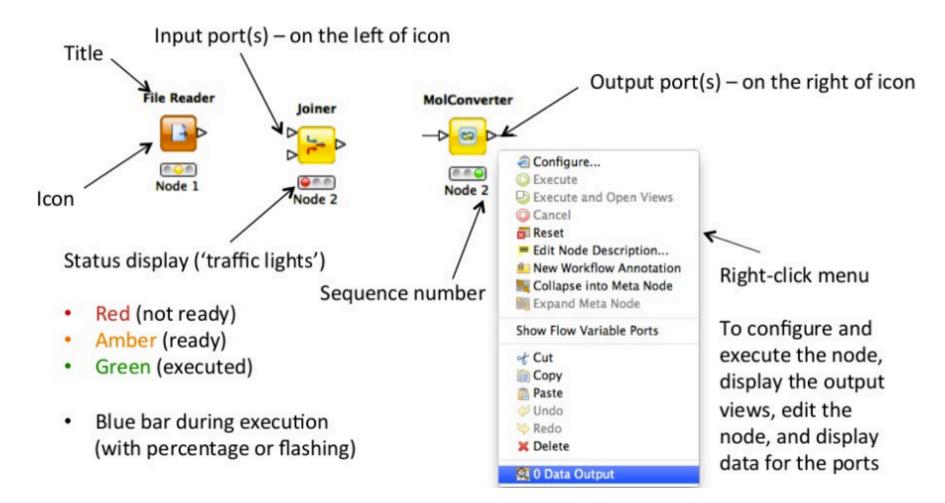
#### Much more

Bioinformatics, text mining and network analysis



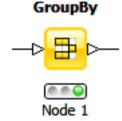
### **KNIME nodes: Overview**

Node = basic processing unit of KNIME workflow which performs a particular task



### Ports

- Data Port: a white triangle which transfers flat data tables from node to node
- Database Port: Nodes executing commands inside a database are recognized by their database ports (brown square)
- PMML Ports: Data Mining nodes learn a model which is passed to the referring predictor node via a blue squared PMML port





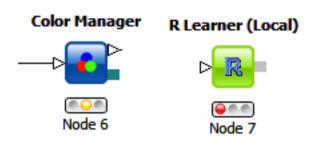
Database



Decision

### **Other Ports**

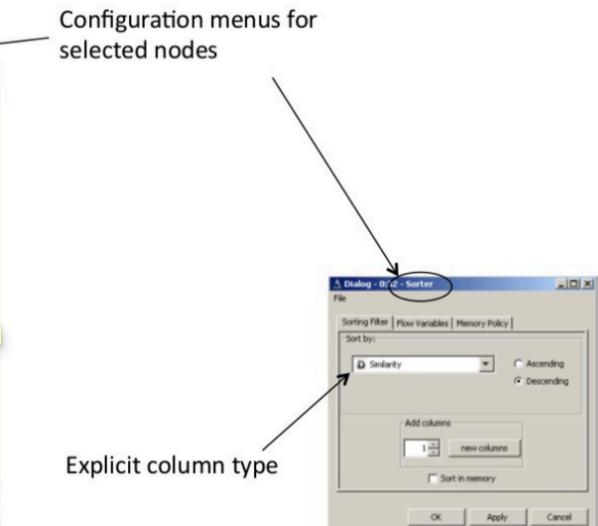
- Whenever a node provides data that does not fit a flat data table structure, a general purpose port for structured data is used (dark cyan square).
- All ports not listed above are known as "unknown" types (gray square).



### **KNIME nodes: Dialogs**

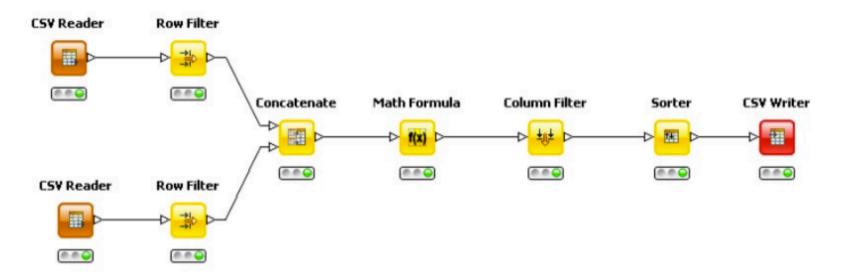
Double click to configure...

| ect file to read:                             | · Browse        |
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| Make row Dis prime                            |                 |
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| C Insert a missing cell                       |                 |
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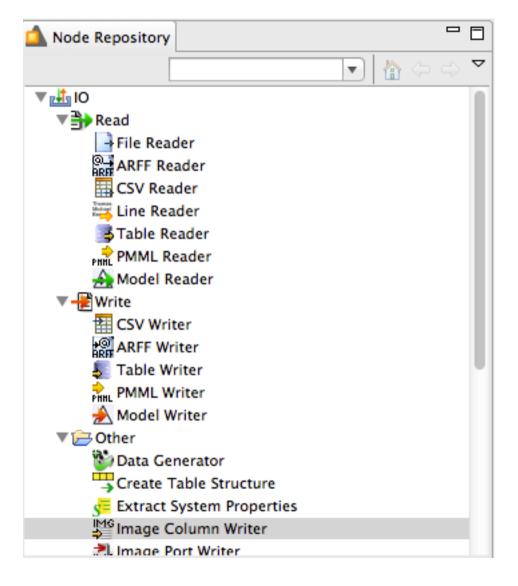


#### An example of workflow

- Workflows can be imported and exported as .zip files
  - With or without the underlying data
  - File → Import KNIME workflow...
  - File → Export KNIME workflow...



## **I/O Operations**



**ARFF** (Attribute-Relation File Format) file is an ASCII text file that describes a list of instances sharing a set of attributes.

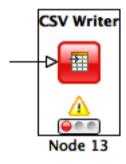
**CSV** (Comma-Separated Values) file stores tabular data (numbers and text) in plain-text form.

### **CSV Reader**

|            | Dialog - 0:11 - CSV Reader(FP-AR)               |  |  |  |  |  |
|------------|-------------------------------------------------|--|--|--|--|--|
|            | CSV Reader Flow Variables Memory Policy         |  |  |  |  |  |
|            | /Users/annamonreale/Desktop/MAINS/iter Browse P |  |  |  |  |  |
| CSV Reader | , Column Delimiter \n Row Delimiter             |  |  |  |  |  |
|            | " Quote Char # Comment Char                     |  |  |  |  |  |
|            | Has Column Header Has Row Header                |  |  |  |  |  |
|            | Support Short Lines                             |  |  |  |  |  |
|            | OK Apply Cancel 🕐                               |  |  |  |  |  |

## **CSV Writer**

|                 |                               | Brows |  |  |  |  |
|-----------------|-------------------------------|-------|--|--|--|--|
| Writer options: |                               |       |  |  |  |  |
| 🗌 Write colum   | n header                      |       |  |  |  |  |
| 🗌 Don't write   | column headers if file exists | ;     |  |  |  |  |
| Urite row ID    | Write row ID                  |       |  |  |  |  |
| Compress o      | Compress output file (gzip)   |       |  |  |  |  |
| If file exists  |                               |       |  |  |  |  |
| II THE EXISTS   |                               |       |  |  |  |  |

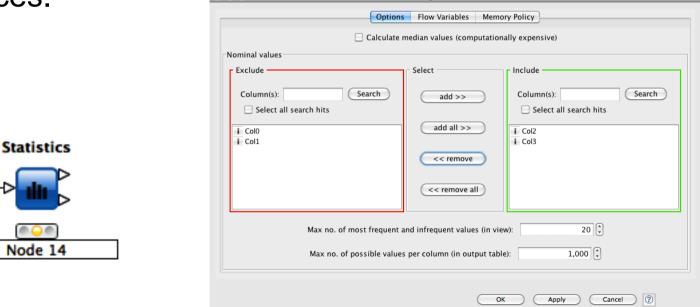


## **Data Manipulation**

- Three main sections
  - **Columns**: binning, replace, filters, normalizer, missing values, ...
  - Rows: filtering, sampling, partitioning, ...
  - Matrix: Transpose

### **Statistics node**

- For all numeric columns computes statistics such as
- minimum, maximum, mean, standard deviation, variance, median, overall sum, number of missing values and row counts
- For all nominal values counts them together with their occurrences.



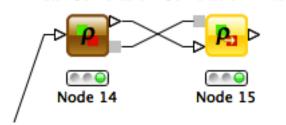
## **Correlation Analysis**

 Linear Correlation node computes for each pair of selected columns a correlation coefficient, i.e. a measure of the correlation of the two variables

Pearson Correlation Coefficient

- Correlation Filtering node uses the model as generated by a Correlation node to determine which columns are redundant (i.e. correlated) and filters them out.
  - The output table will contain the reduced set of columns.

Linear Correlation Correlation Filter



## **Data Normalization**

- Data normalization
  - Min-max normalization
  - Z-score normalization

|   | Normalizer           |
|---|----------------------|
| \ | -⊳ <mark>∔-</mark> ₊ |
|   |                      |
|   | Node 13              |

| 00                                                                                | Dialog - 2:2 - Normalizer  | 1                                                                             |
|-----------------------------------------------------------------------------------|----------------------------|-------------------------------------------------------------------------------|
| (                                                                                 | Methods Flow Variables Mem | ory Policy                                                                    |
| O Min-Max Normalization                                                           | Min: 0.0<br>Max: 1.0       |                                                                               |
| Z-Score Normalization     Normalization by Decimal Scaling                        |                            |                                                                               |
| Do not normalize<br>Column(s): Sear<br>Select all search hits<br>DATA_PRIMA_SPESA | ch add >><br>add all >>    | Normalize<br>Column(s): Search<br>Select all search hits<br>DATA_ULTIMA_SPESA |
|                                                                                   | << remove                  | I NUMERO_SPESE<br>D IMPORTO                                                   |
|                                                                                   | ОК                         | Apply Cancel 🕐                                                                |

### **Data Views**

- Box Plots
- Histograms, Pie Charts, Scatter plots, ...
- Scatter Matrix

# **Mining Algorithms**

- Clustering
  - Hierarchical
  - K-means
  - Fuzzy –c-Means
- Decision Tree
- Item sets / Association Rules
  - Borgelt's Algorithms

#### • Weka

# MARKET BASKET ANALYSIS

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## **Market Basket Analysis**

- Problem: given a database of transactions of customers of a supermarket, find the set of frequent items copurchased and analyze the association rules that is possible to derive from the frequent patterns.
- Knime gives two options:
  - Item Set Finder node & AR Learner node implementing Borgelt's algorithms (additional nodes to be installed)
  - Association Rule node: computes bothe frequent itemsets and AR (default node in standard Knime installation)

#### **Frequent Patterns and AR in KNIME**

- One node for both task:
  - Association rule learner
  - Frequent pattern extraction

|        | Association<br>Rule Learner |   |
|--------|-----------------------------|---|
|        | ->>                         |   |
| find   |                             |   |
| find r | rules / frequ. item:        | 5 |

| Options Flow Variables Memory Policy        |  |  |  |  |
|---------------------------------------------|--|--|--|--|
| Itemset Mining                              |  |  |  |  |
| Column containing transactions () product 💠 |  |  |  |  |
| Minimum support (0-1) 0.1                   |  |  |  |  |
| Underlying data structure: TIDList ‡        |  |  |  |  |
| Output                                      |  |  |  |  |
| Itemset type FREE ‡                         |  |  |  |  |
| Maximal itemset length: 10                  |  |  |  |  |
| Association Rules                           |  |  |  |  |
| ✓ Output association rules                  |  |  |  |  |
| Minimum confidence: 0.3                     |  |  |  |  |
| OK Apply Cancel 🕐                           |  |  |  |  |

Dialog - 2:70 - Association Rule Learner(find rules / frequ....

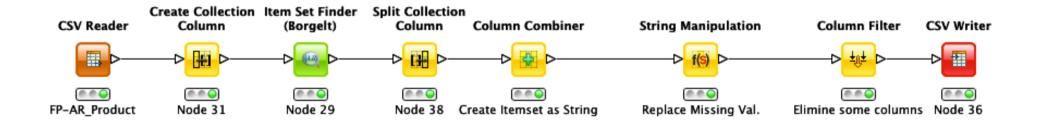
#### Alternative nodes for the same tasks...

• The two nodes implement the Borgelt's Algorithms:



- Item Set Finder node provides different algorithms:
  - Apriori (Agrawal et al. 1993)
  - FPgrowth (frequent pattern growth, Han et al 2000)
  - RElim (recursive elimination)
  - SaM (Split and Merge)
  - JIM (Jaccard Item Set Mining)
- AR Learner uses Apriori Algorithm

- Given the output of the Item set Finder node sometimes you cannot see all the components of the itemset
  - we need to transform it in a string and
  - then, we can also write the result in a file



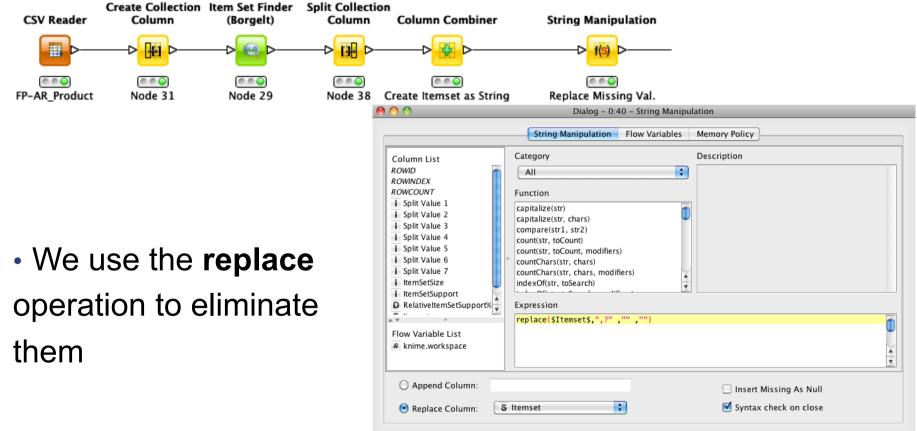
#### • First we need to split the collection

|               |                             |                              |                            | \varTheta 🔿 🔿 Dialog – 0:38 – Split Collection Column |
|---------------|-----------------------------|------------------------------|----------------------------|-------------------------------------------------------|
| CSV Reader    | Create Collection<br>Column | ltem Set Finder<br>(Borgelt) | Split Collection<br>Column | Settings Flow Variables Memory Policy                 |
| FP-AR_Product | Column                      | (Borgelt)                    | Column                     | Settings Flow Variables Memory Policy<br>             |
|               |                             |                              |                            | OK Apply Cancel 🕐                                     |

 Second we combine the columns that have to compose the itemset (string)

| Create Collection Item Set Finder Split Collection<br>CSV Reader Column (Borgelt) Column Column Co                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                             | mbiner                                        |
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| FP-AR_Product Node 31 Node 29 Node 38 Create Itemse                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            |                                               |
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| ○ Replace                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      | Delimiter by                                  |
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| Selection Select | t all search hits                             |
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- The combiner does not eliminate the missing values "?"
- The combined itemsets contain a lot of "?"



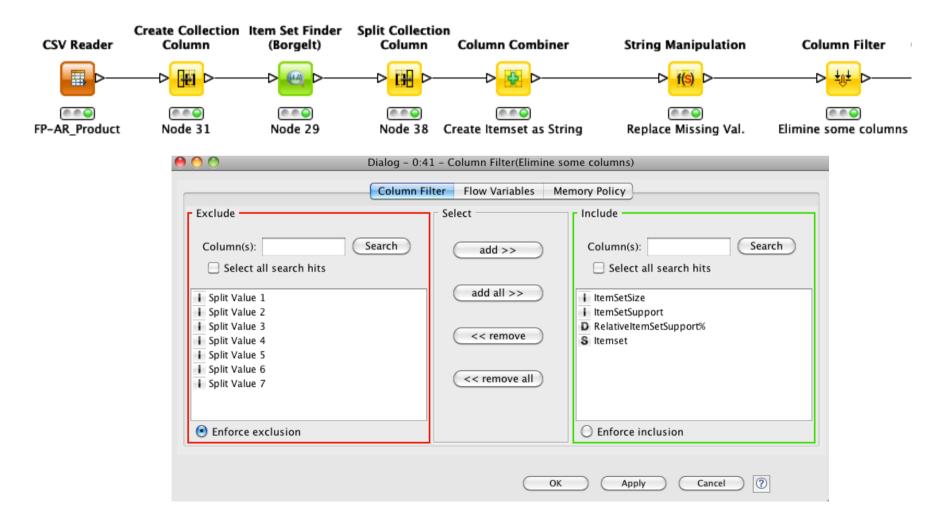
?

Cancel

OK

Apply

#### • Before writing in a file eliminate the split columns



#### .... The output table

#### 00

Filtered table - 0:41 - Column Filter(Elimine some columns)

#### File

|           |    | Table "default"        | - Rows: 139122 Spe      | c - Columns: 4 Properties Flow Variables     |
|-----------|----|------------------------|-------------------------|----------------------------------------------|
| Row ID    | 1. | ▼ ItemSetSize 📘 ItemSe | tSupport D Relativeltem | SetSup S Itemset                             |
| Row94237  | 7  | 3                      | 0.03                    | 16864,30459,233740,15786,265109,311540,85800 |
| Row102226 | 7  | 3                      | 0.03                    | 253300,7697,45168,15506,36369,72989,85800    |
| Row35465  | 6  | 3                      | 0.03                    | 39071,68523,14635,31560,75153,85800          |
| Row63365  | 6  | 3                      | 0.03                    | 228263,38950,37860,76174,65616,224434        |
| Row63811  | 6  | 3                      | 0.03                    | 2334354,76174,265109,31560,75153,85800       |
| Row65867  | 6  | 3                      | 0.03                    | 52006,265111,221614,265109,75153,85800       |
| Row68210  | 6  | 3                      | 0.03                    | 31555,14845,45168,31560,85800,75153          |
| Row72720  | 6  | 3                      | 0.03                    | 287124,236490,243821,75153,31560,85800       |
| Row78817  | 6  | 3                      | 0.03                    | 30958,7697,257536,25227,228164,56674         |
| Row81349  | 6  | 3                      | 0.03                    | 27008,30459,65125,16722,48067,265109         |
| Row84546  | 6  | 3                      | 0.03                    | 269468,30459,233740,52769,265109,311540      |
| Row84610  | 6  | 3                      | 0.03                    | 269468,233740,16281,48067,265109,85800       |
| Row86734  | 6  | 3                      | 0.03                    | 28467,16281,72989,221614,31560,75153         |
| Row89111  | 6  | 3                      | 0.03                    | 26308,15506,243821,31560,75153,85800         |
| Row89246  | 6  | 3                      | 0.03                    | 76288,40287,56674,48067,75153,265109         |
| Row90026  | 6  | 3                      | 0.03                    | 2335012,67463,68523,221614,265109,85800      |
| Row94238  | 6  | 3                      | 0.03                    | 16864,30459,233740,15786,265109,311540       |
| Row94239  | 6  | 3                      | 0.03                    | 16864,30459,233740,15786,265109,85800        |
| Row94241  | 6  | 3                      | 0.03                    | 16864,30459,233740,15786,311540,85800        |
| Row94245  | 6  | 3                      | 0.03                    | 16864,30459,233740,311540,265109,85800       |
| Row94253  | 6  | 3                      | 0.03                    | 16864,30459,15786,265109,311540,85800        |
| Row94342  | 6  | 3                      | 0.03                    | 16864,233740,15786,48067,265109,311540       |

Now you can see all the items in a set!!!

#### Now we can complete the workflow with the CSV Writer

