

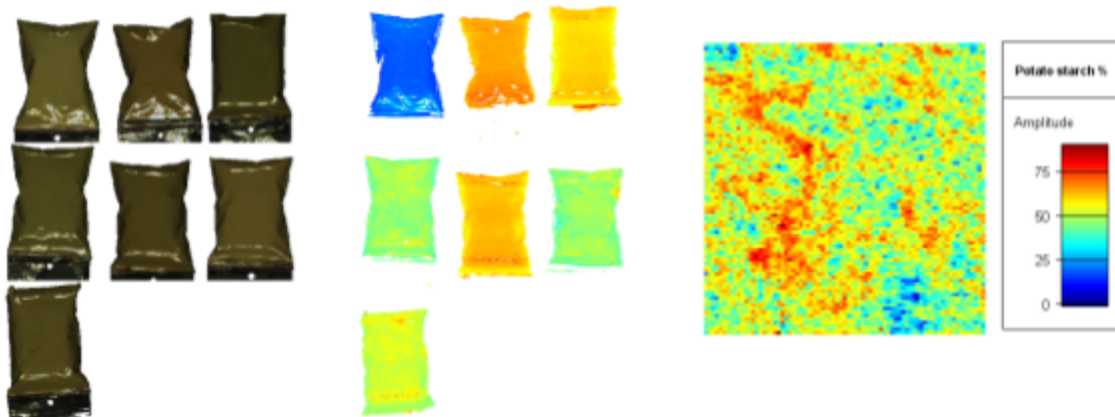
Evince tutorial

Quantification of powder samples

Objective

The goal of this tutorial is to learn how to use Evince for developing a quantification method using hyperspectral images. In this example we will measure the % of three different types of powders (vanilla, baking soda, potato starch) that are mixed together in a plastic bag. The following steps are explained in the tutorial:

1. Importing multiple images into Evince
2. Removing the background and cleaning up the images
3. Identifying objects (samples) in the image
4. Assigning reference values (% of each powder) to each sample
5. Developing a quantification model (PLS) for the % of the three powder types
6. Testing the quantification model by predicting the content in a new sample on the object and the pixel level



Tutorial data

The hyperspectral images were recorded using a SWIR camera (spectral range 1000-2500 nm). To reduce file size for download over the web the spectral channels were reduced from 256 to 67.

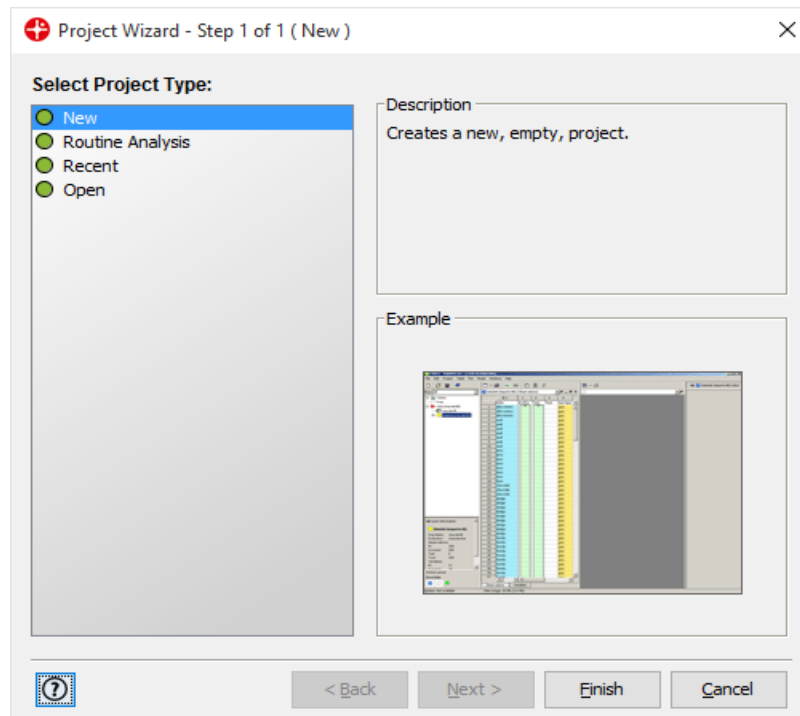
Download tutorial data zip file from this link:

https://www.prediktera.com/download/sample/Powder_quantification.zip

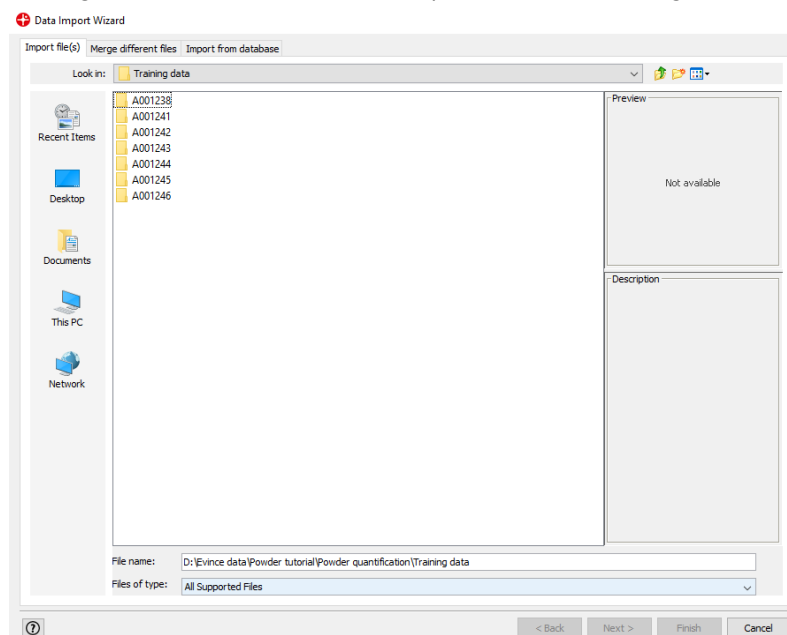
Instructions

1. Import and merging of images

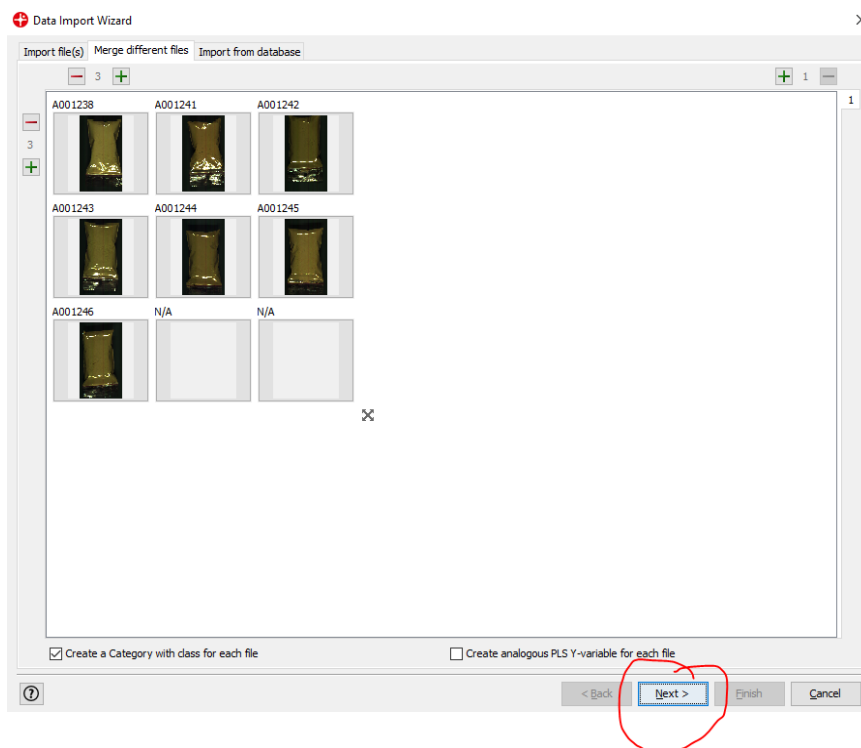
- Start by downloading the *Powder quantification* dataset to your hard drive
- Start Evince, select *New* and click on *Finish* to start a new project



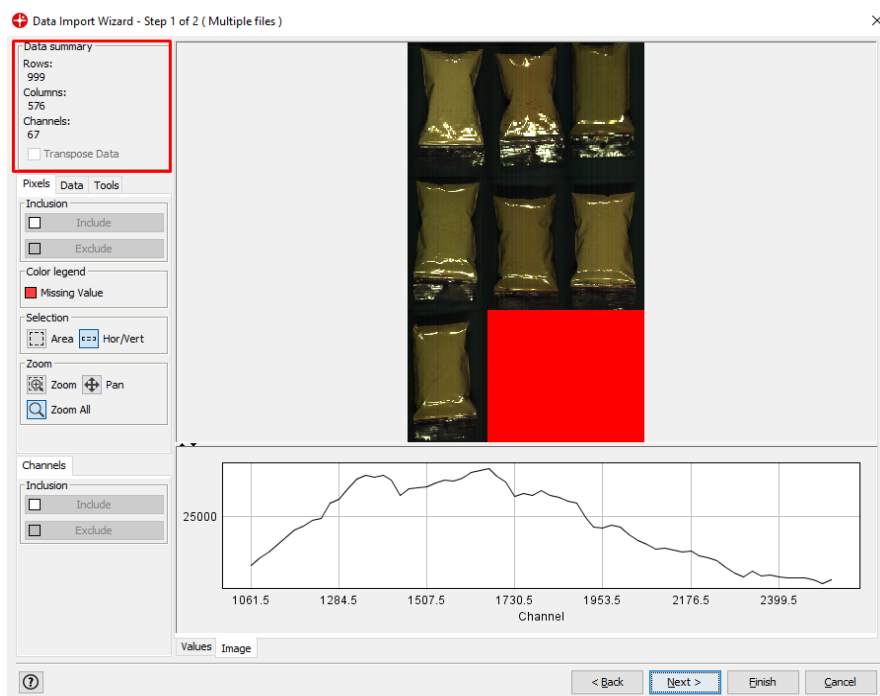
- Find the *Powder quantification/Training data* folder, select all folders and click on *Next* (to select all folders hold down the shift key on your keyboard and clicking on the first and last folder). Click Yes to merge the selected files.



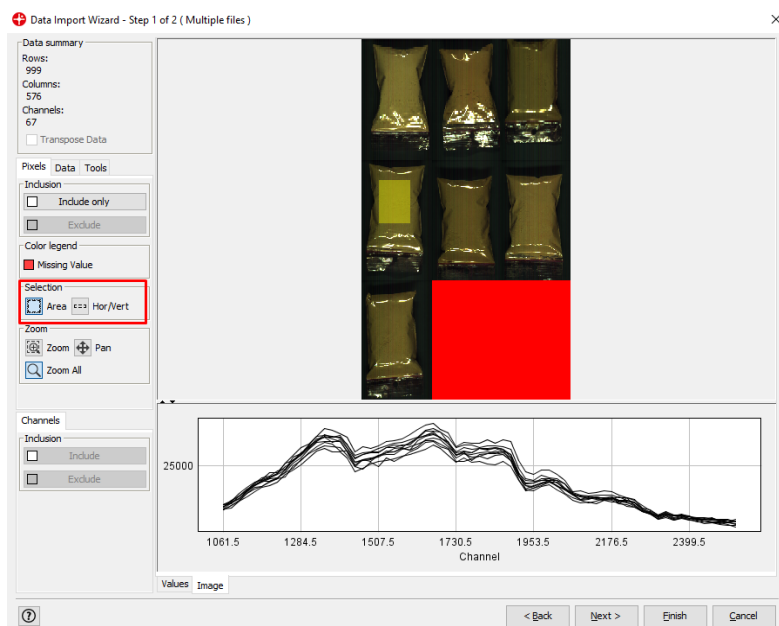
d. Click on *Next*



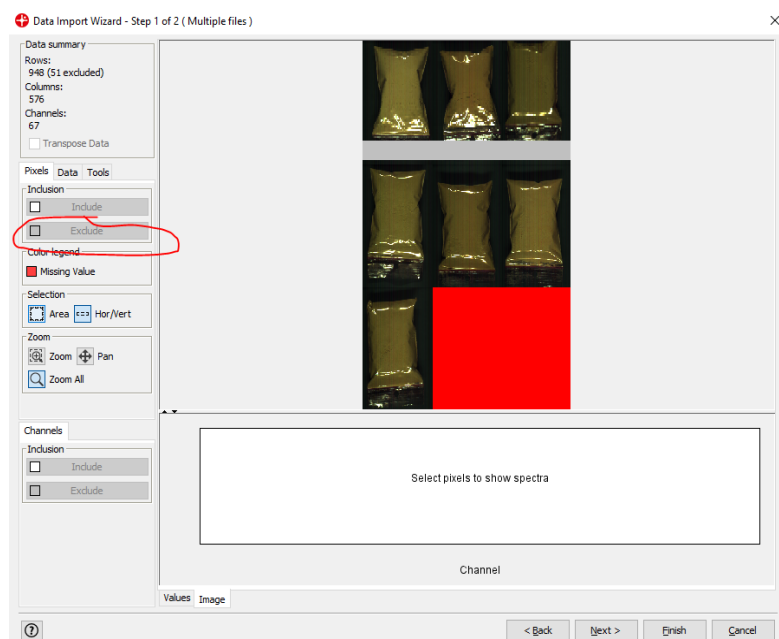
e. The *Data Summary* shows us that we have an image with 999 rows, 576 columns and 67 channels (spectral variables). By moving the mouse over the image you can see the spectral profile for each pixel.



- f. By left-clicking and dragging your mouse over the image you can select areas of the image and see the spectral profile for that area. Under the *Selection* menu you can change the shape of the selection tool.

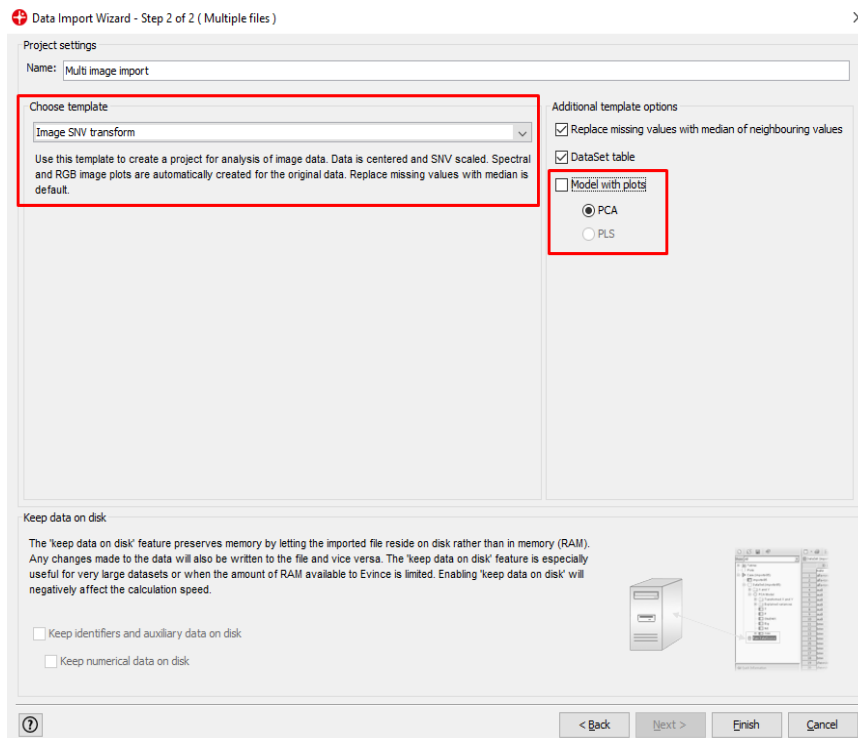


- g. After selecting an area and clicking *Exclude* you can remove pixels from your image that are not of interest. In this example we could remove pixels that are not from plastic bags with powder (i.e. the black background). This is not necessary to do but can be useful to reduce the size of the image file or to make the following data analysis easier (note that the red area cannot be excluded since this does not contain any image data).

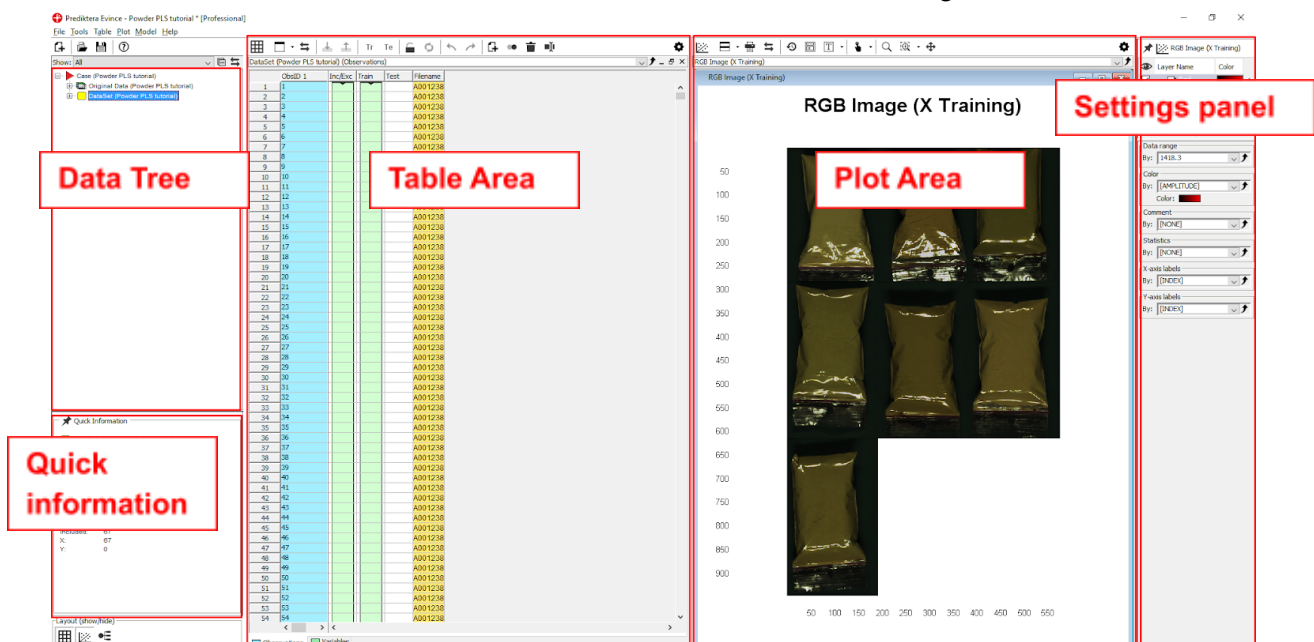


- h. Click on *Next*

- i. Make sure *Model with plots* is unchecked and *Image SNV transform* is chosen. (SNV is a transformation method used to remove unwanted variation from the spectra data)



- j. Change the name of the Evince project if you would like
- k. Click *Finish*.
- l. We have now finished the import of the images into our new Evince project. The screen is divided into the 5 areas seen in this image.



Data Tree: Shows an overview of the hierarchy of datasets and models that are in this project. By clicking on the plus sign next to each icon you can expand it to see additional information relating to that data set or model. The *Original Data* is a table of the spectral values for all pixels, for all wavelengths in the images we imported. The *DataSet* is a "working copy" which we can modify, e.g. apply spectral filters or exclude pixels. It is possible to make additional DataSets.

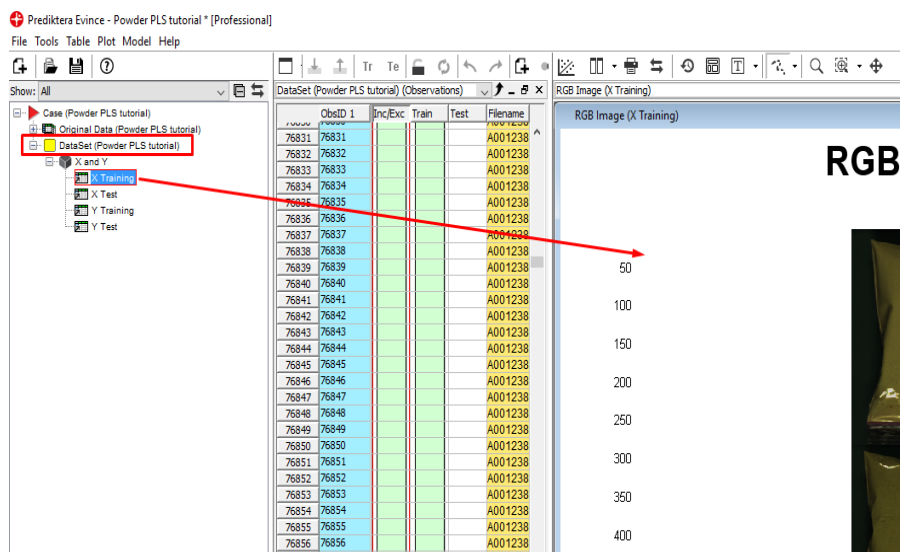
Table Area: Shows information in the form of a table. In this case the variables (Spectral bands) and observations (pixels) in this dataset. There is a tab at the bottom of the table to change between Observations and Variables.

Plot area: Shows information in the form of images and plots. In this case a pseudo RGB image of the hyperspectral images we imported.

Settings panel: This panel shows the settings for the active plot or image that is in the Plot area.

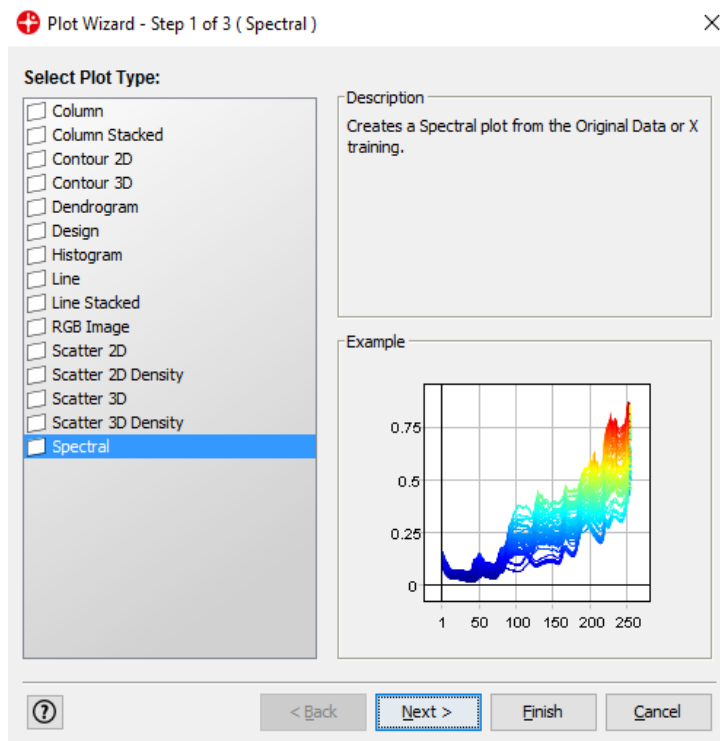
Quick Info: Show info about the selected item, table or plot.

- m. Click on the plus sign next to the Dataset to expand it. Left click on *X Training* and drag and drop it to the plot area.

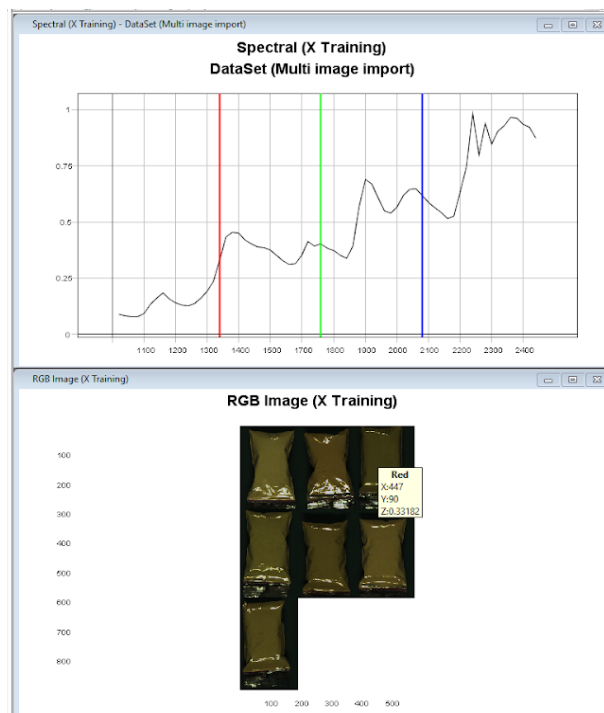


The screenshot shows the Prediktera Evince software interface. On the left, the **Data Tree** panel displays a hierarchy of datasets. The **DataSet (Powder PLS tutorial)** is expanded, showing **X Training** and **Y Test**. A red arrow points from the **X Training** item to the **Plot Area** on the right. The **Table Area** in the center displays a table of observations with columns for **ObsID 1**, **Inc/Exc**, **Train**, **Test**, and **Filename**. The **Plot Area** on the right shows a **RGB Image (X Training)** with a vertical color scale ranging from 50 to 400. The word **RGB** is displayed in large text next to the image.

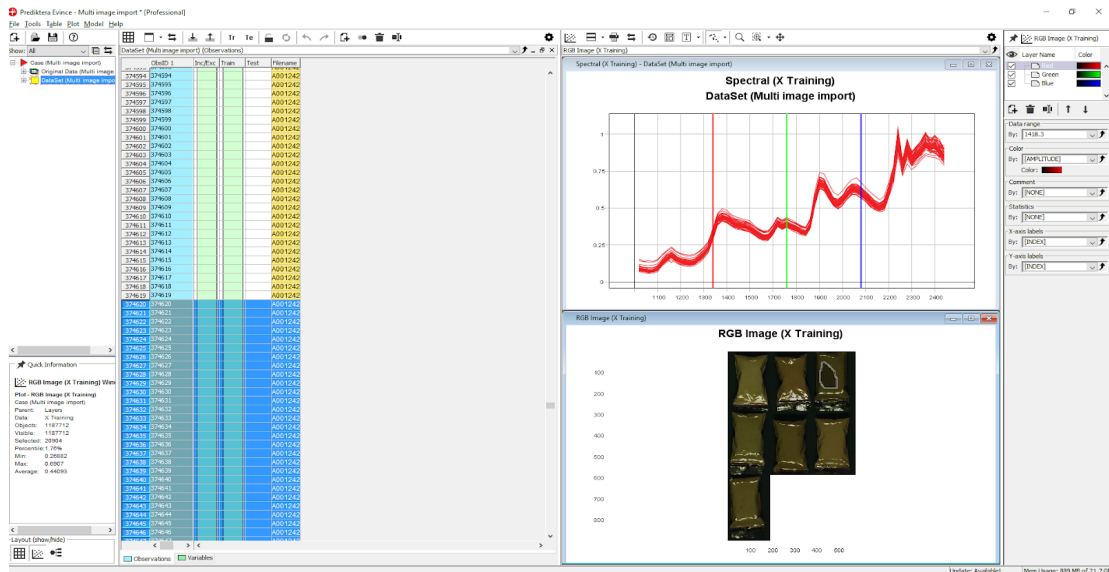
- n. Select the *Spectral plot* in the next window and then click on *Finish*.



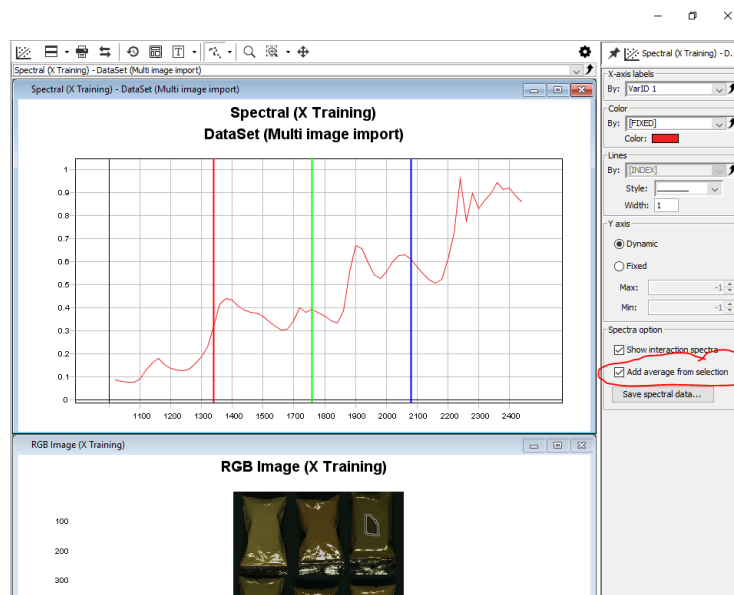
- o. By moving the mouse over the pseudo *RGB Image* you can see the wave length for each pixel. This image is created from three wavelengths shown in the *Spectral* plot (Red, Green and Blue lines). By dragging these lines with your mouse you can change the wavelength.



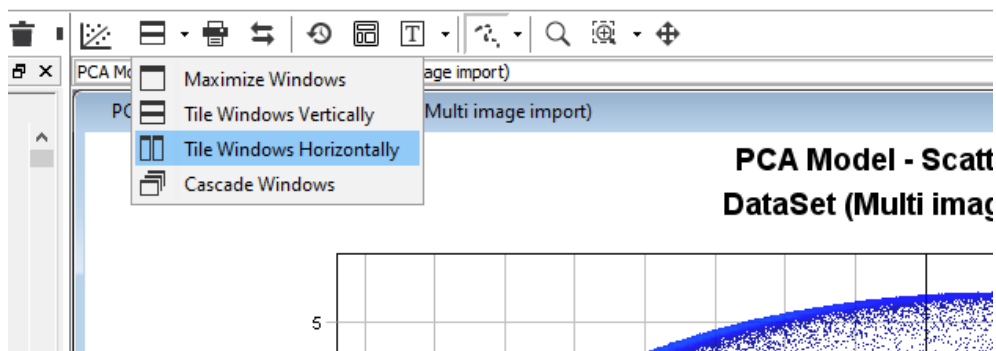
- p. By holding down the left mouse button and selecting an area in the *RGB Image* the spectral profiles for all pixels in this area are shown (notice that the pixels selected are automatically highlighted in the data table)



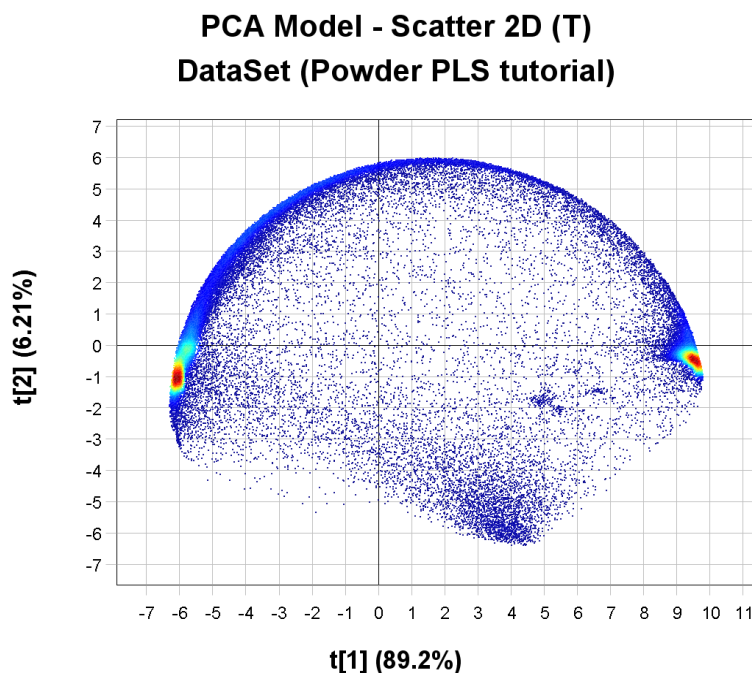
- q. Click anywhere on the *Spectral* plot to activate the Settings menu for that plot, check the box to *Add average from selection*. This will give you the average spectral profile for the selected area. You can select additional areas with the mouse to compare the average spectral profiles for those areas.



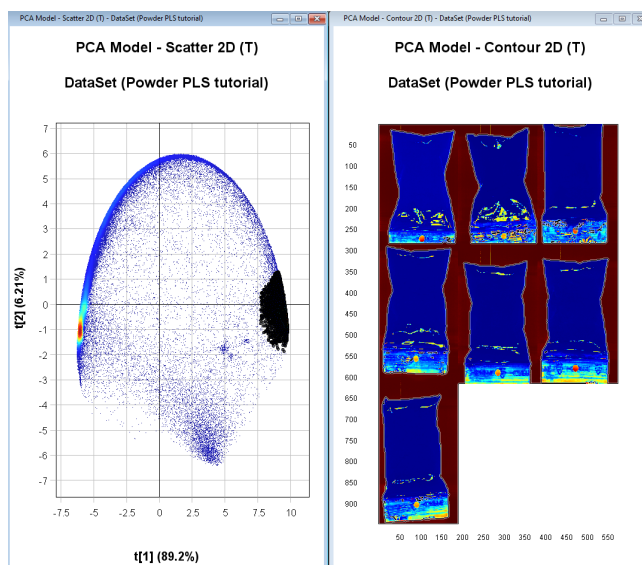
- c. Click on the Arrange drop down menu and select *Tile windows horizontally* to enlarge the windows.



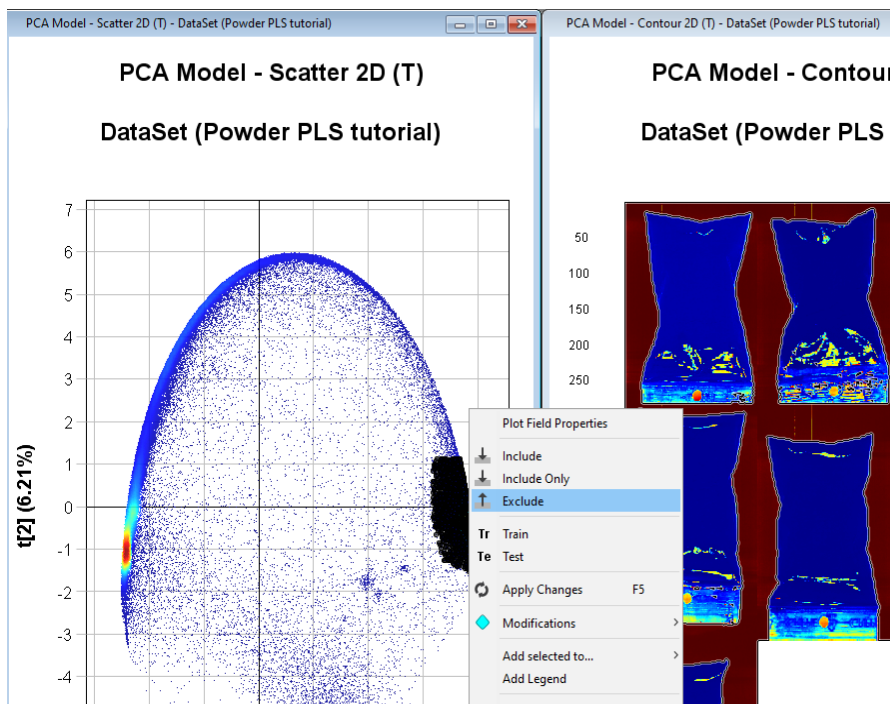
- d. The *PCA Model Scatter 2D (T)* plot is showing how the pixels in the image are clustering based on similarity in the spectral profile. In this example the first component $t[1]$ is explaining 89.2% of the variation and $t[2]$ 6.21% (you might get slightly different results if you did or did not exclude pixels in the import step). The color is based on pixel density (red = pixels are very close to each other).



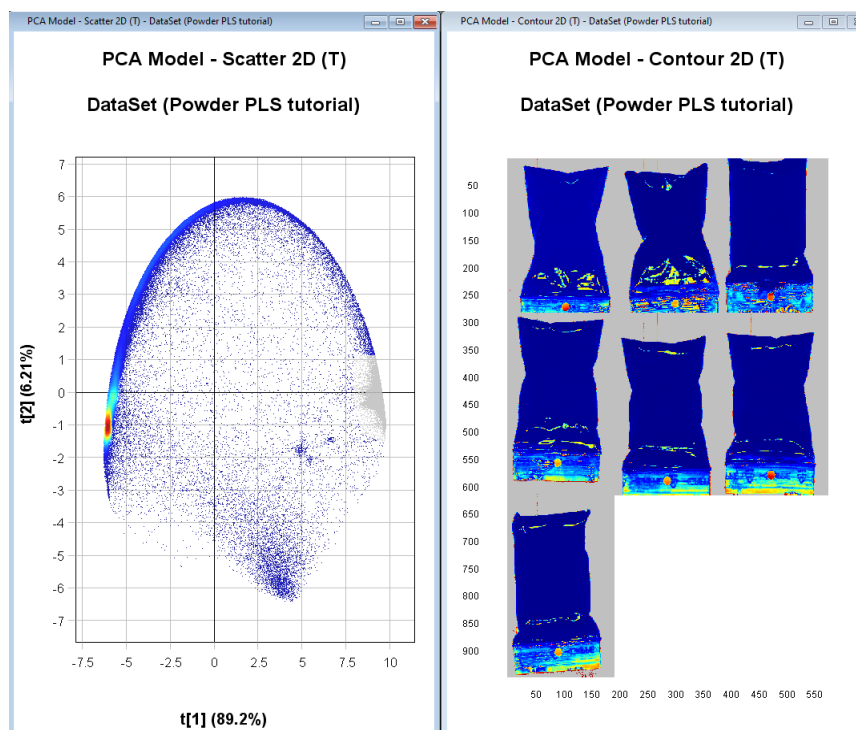
- e. By holding down the left mouse button and dragging the selection tool over the cluster of pixels to the right we can see in the *PCA Model – Contour 2D (T)* image that these correspond to the background pixels (they become darker in color after selection). The *PCA Model – Contour 2D (T)* is colored by the variation in $t[1]$.



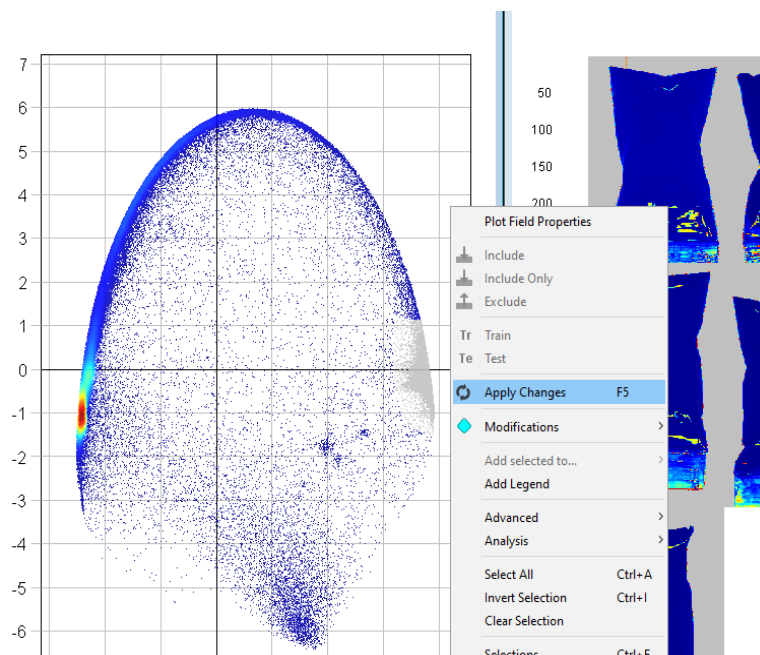
- f. Right-click anywhere in the either plot and click on *Exclude*



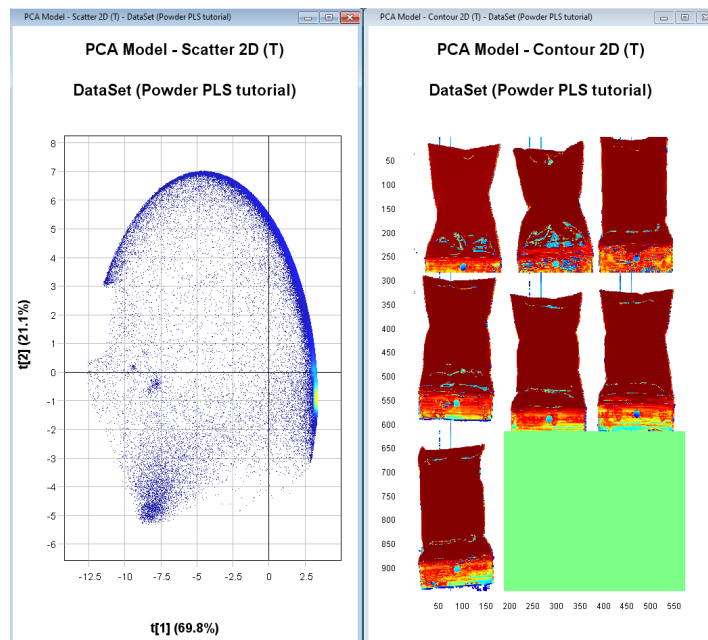
g. The excluded pixels are now greyed out



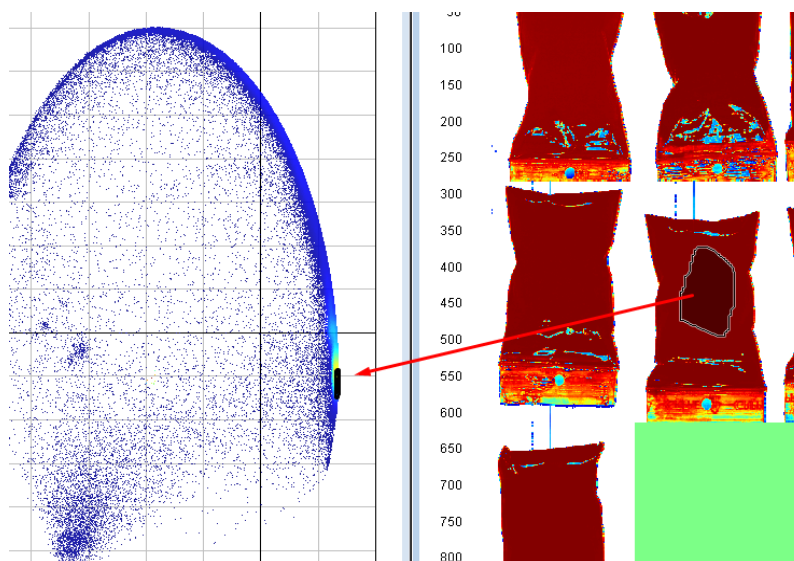
h. Right click on the plot and select *Apply Changes*



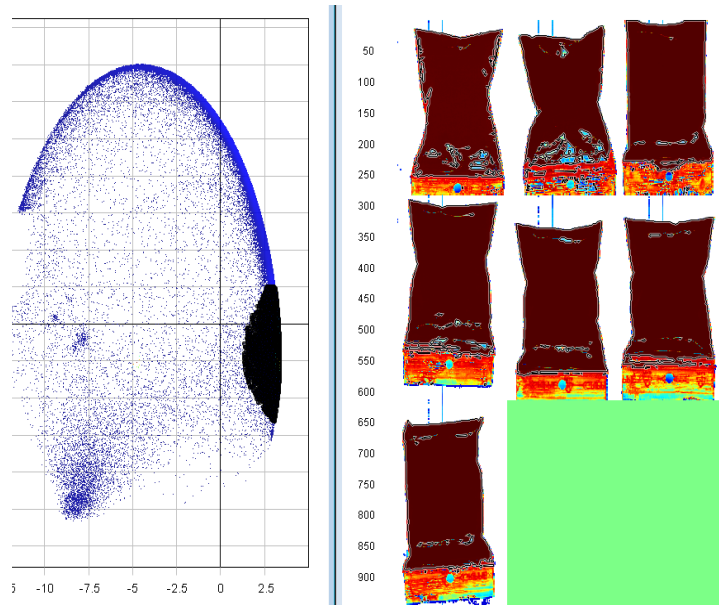
- i. The PCA model has now been updated without the excluded pixels (depending on which pixels you removed, this plot might look different from the screen shown in these instructions).



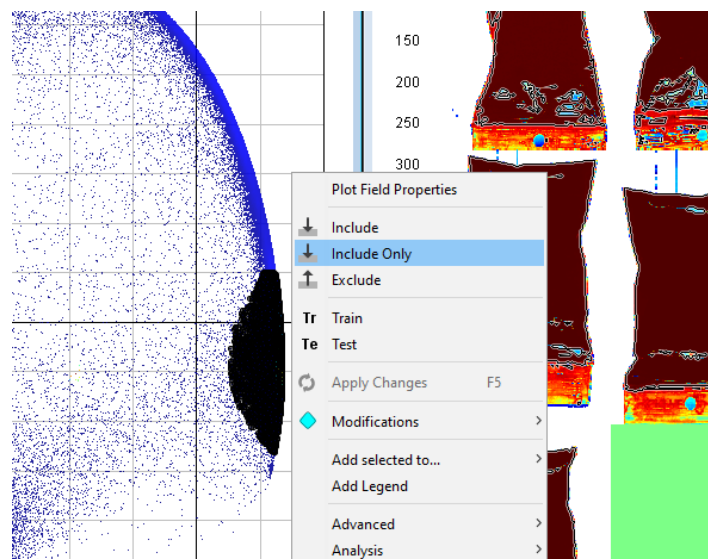
- j. We have now removed the pixels corresponding to the background. But we want to do some additional cleaning of the image to remove the part of the plastic bags that don't have powder in them, pixels on the edge of the sample (contains some influence from the background), and pixels that have too much glare.
- k. Select pixels that correspond to a sample and see which cluster this corresponds to in the scatter plot (might look different from the screen shown in these instructions).



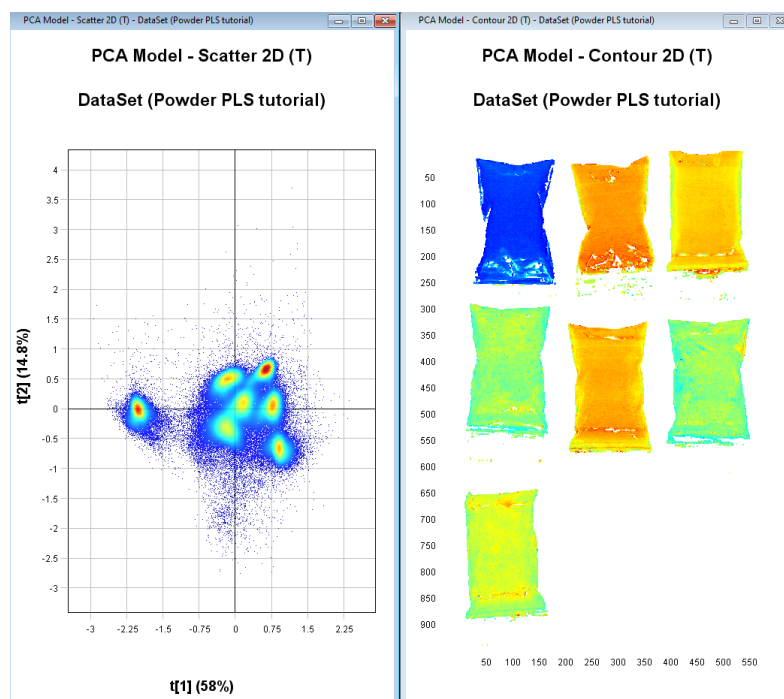
- I. Select the cluster corresponding to the samples



- m. Right click on the plot, click on *Include only* and then right click on the plot again and *Apply changes*

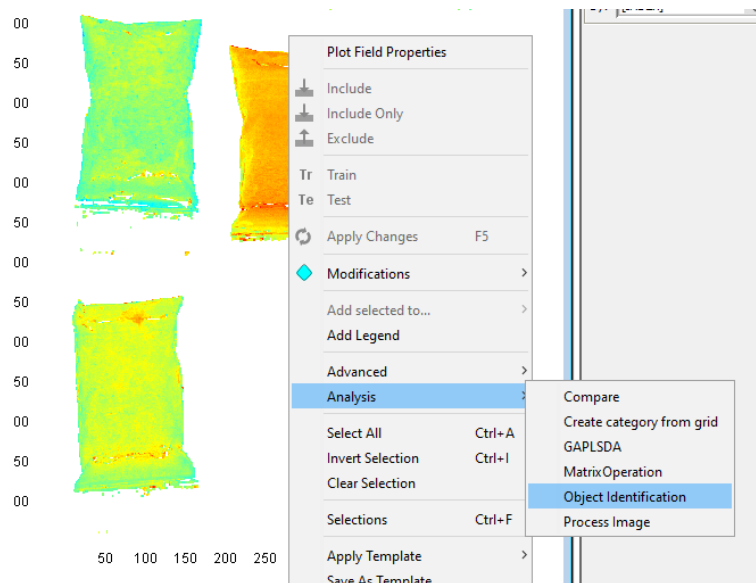


- n. If needed repeat the two previous steps until you have an image where you have removed the pixels that are not sample (i.e. the part of the plastic bags not containing the powder). If you want to magnify an image or plot to see better hold the mouse pointer over it and scroll using your mouse wheel.
- o. We should now have 7 distinct clusters in the scatter plot each representing a sample.

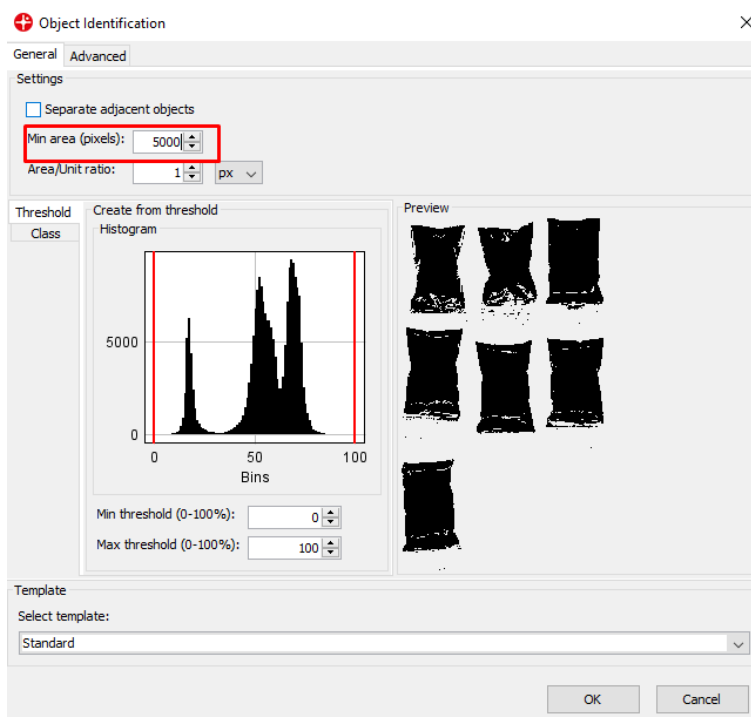


3. Identifying objects (samples) from each image

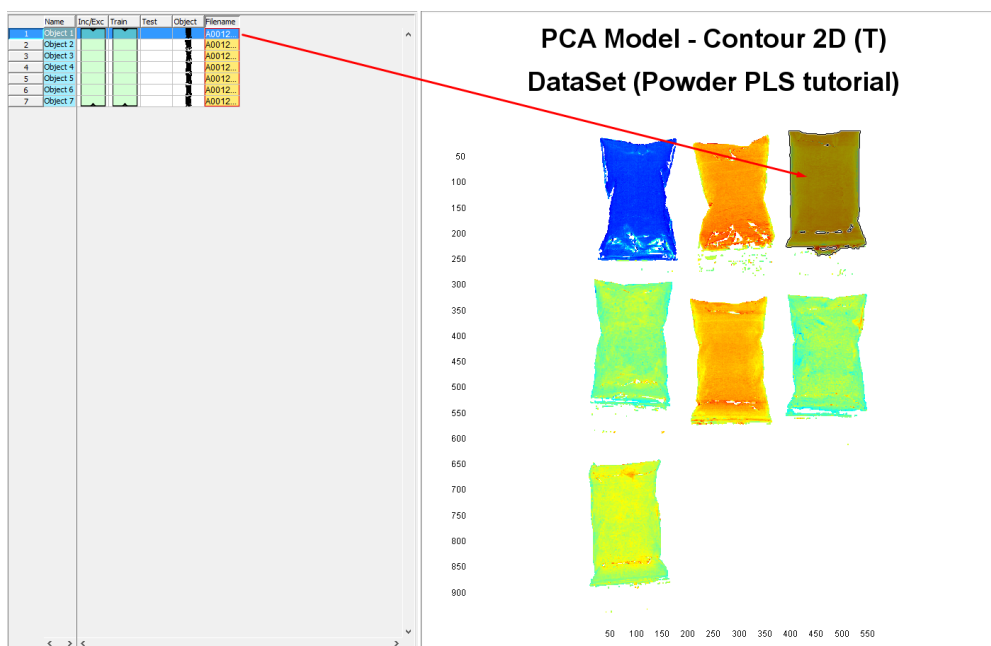
- Right click on the Contour plot and select *Analysis/Object identification*



- b. Set the *Min area* to 5000 pixels. This means that any object under 5000 pixels will not be found. This can be useful to remove small objects like dust. Click on *OK*.

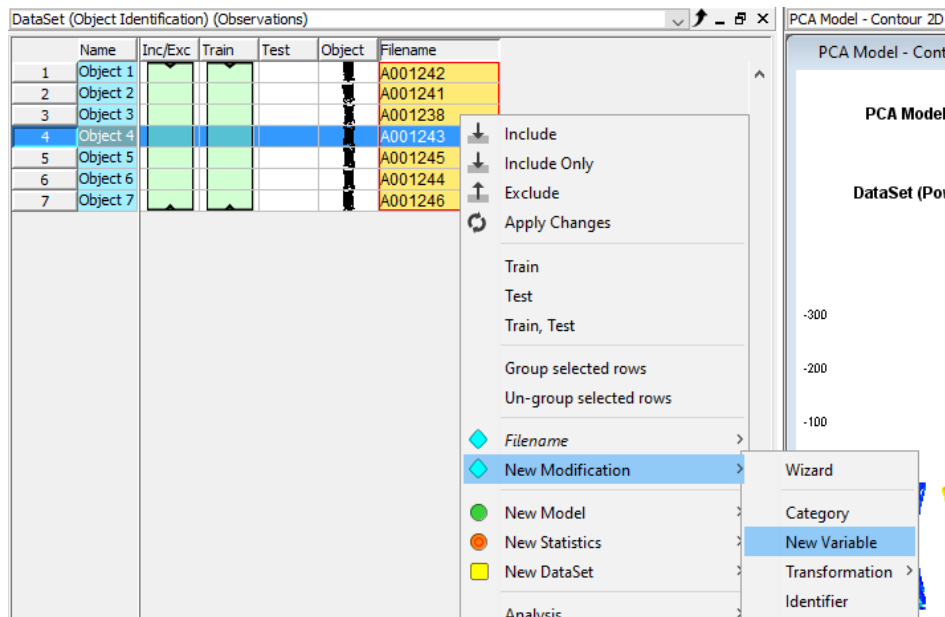


- c. In the table area you can see that we generated a dataset of 7 objects each corresponding to an average spectra of all pixels for each plastic bag with powder.

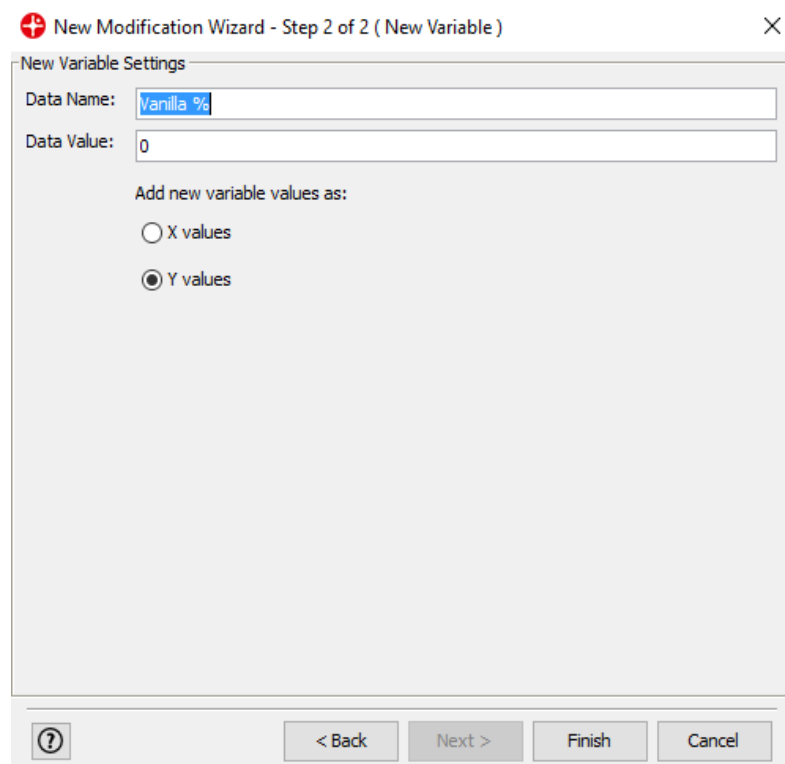


4. Assigning reference value to each sample

- a. Right-click in the table and select *New Modification/New Variable*



- b. Write Vanilla % in the *Data name* field and click on *Finish*



- c. Repeat this step to add the variables Baking soda % and Potato starch %

	Name	Inc/Exc	Train	Test	Object	Filename	Vanilla %	Baking soda %	Potato starch %
1	Object 1					A0012420	0		0
2	Object 2					A001241MV	MV		MV
3	Object 3					A001238MV	MV		MV
4	Object 4					A001243MV	MV		MV
5	Object 5					A001245MV	MV		MV
6	Object 6					A001244MV	MV		MV
7	Object 7					A001246MV	MV		MV

- d. Copy the reference values from the Powder refdata table. The .xls file was included in the download of the image files.

Name	Date modified	Type	Size
Test data	2017-02-21 14:48	File folder	
Training data	2017-02-21 14:46	File folder	
Powder ref values.xls	2017-02-21 10:25	Microsoft Excel 97...	23 KB

	A	B	C	D	E
1		Vanilla (%)	Baking Soda (%)	Potato Starch (%)	
2	A001242	0	0	100	
3	A001241	0	100	0	
4	A001238	100	0		
5	A001243	50	0		
6	A001245	50	50		
7	A001244	0	50		
8	A001246	33	33		
9					
10					

- e. Paste the data into the table in Evince by right-clicking on the row for the first sample in the Vanilla column (please wait a few seconds while Evince matches the data with each object and the windows closes)

	Name	Inc/Exc	Train	Test	Object	Filename	Vanilla %	Baking ...	Potato...
1	Object 1					A0012420	0		0
2	Object 2					A001241MV	MV		MV
3	Object 3					A001238MV	MV		MV
4	Object 4					A0012430			
5	Object 5					A001245MV	MV		MV
6	Object 6					A001244MV	MV		MV
7	Object 7					A001246MV	MV		MV

f. The table should look like this now

	Name	Inc/Exc	Train	Test	Object	Filename	Vanilla %	Baking soda %	Potato starch %
1	Object 1					A0012...	0	0	100
2	Object 2					A0012...	0	100	0
3	Object 3					A0012...	100	0	0
4	Object 4					A0012...	50	0	50
5	Object 5					A0012...	50	50	0
6	Object 6					A0012...	0	50	50
7	Object 7					A0012...	33	33	33

5. Developing a quantification model (PLS) for the % of the three powder types

- a. Now we want to create a PLS model with the reference values we just entered into the table for each sample. Right click on the *DataSet (Object Identification)* and select *New Model/PLS Model*. Click *Finish* on the next window that comes up.

The screenshot shows the Prediktera software interface. On the left, a project tree displays the following structure:

- Case (Powder PLS tutorial)
 - Original Data (Powder PLS tutorial)
 - DataSet (Powder PLS tutorial)
 - X and Y
 - X Training
 - X Test
 - Y Training
 - Y Test
 - * PCA Model
 - DataSet (Object Identification)** (highlighted with a red box)

On the right, a table displays the data for the selected 'DataSet (Object Identification)'. The table has columns: Name, Inc/Exc, Train, Test, Object, Filename, Vanilla %, Baking soda %, and Potato starch %. The data rows correspond to Object 1 through Object 7, with their respective percentages of Vanilla, Baking soda, and Potato starch.

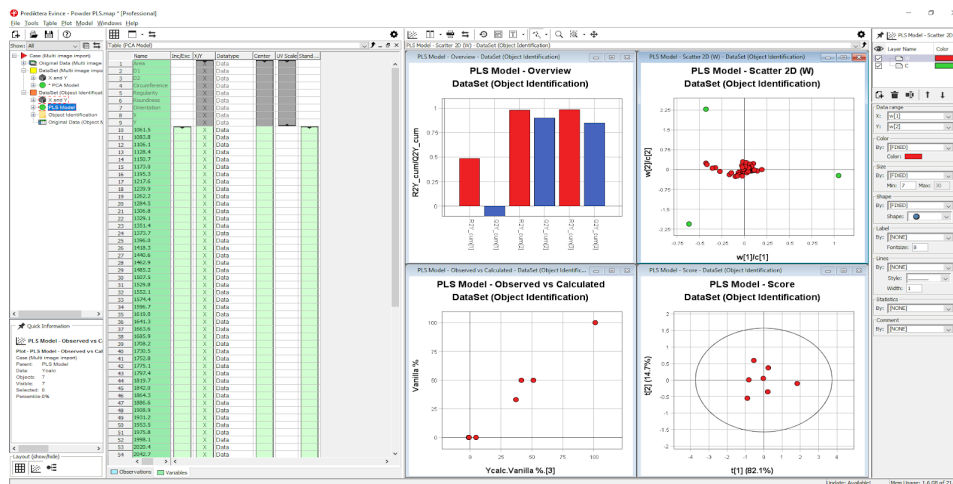
A context menu is open over the 'DataSet (Object Identification)' table. The menu options are:

- New Model (highlighted with a green circle)
- New Statistics
- New Table
- Apply Template
- Clone DataSet
- Apply Changes
- Delete
- Rename
- Predict DataSet from Model

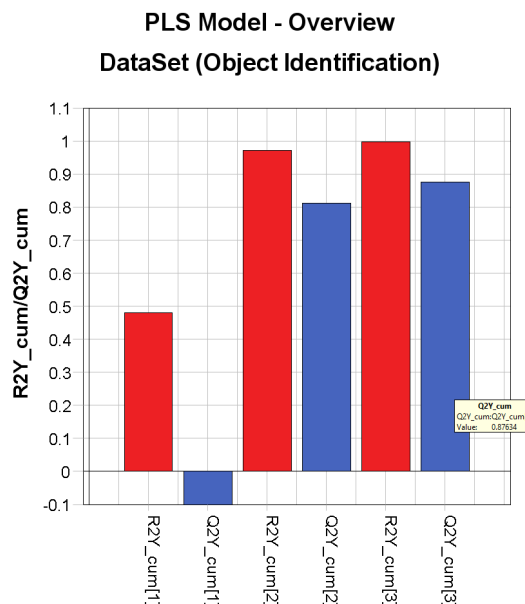
The 'New Model' option is expanded, showing a sub-menu with the following options:

- Wizard
- PCA Model
- PCY Model
- PLS Model** (highlighted with a blue box)
- PLS-DA Model
- SIMCA Model

- b. A number of plots are generated for the PLS model. You can close down all except *The PLS Model – Overview* and the *Observed vs Calculated* plot.

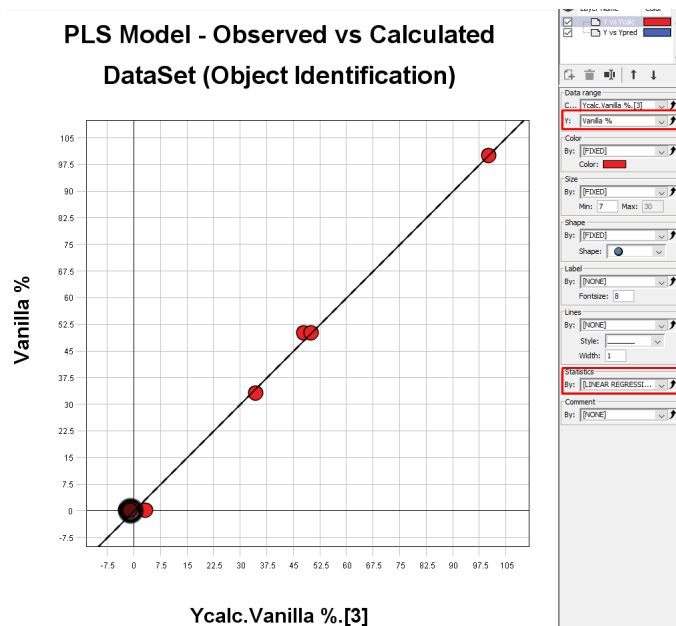


- c. The *PLS Model – Overview plot* is showing us how well our model correlate between the information in the images and the % of the 3 different materials.



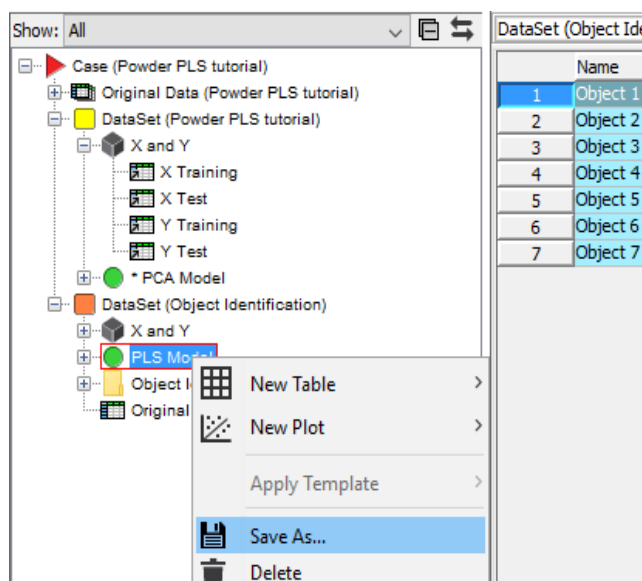
Evince uses an autofit function that finds the best complexity of the model. In this case it has found 3 significant components. The red bars (R^2) show the variation that is explained using 1, 2 and 3 components. In this case $R^2=0.997$ (99.7% explained). The blue bars (Q^2) is showing the predictive power of the model, i.e. how well it explains samples that are not in the model. In this case $Q^2=0.876$ (hover the mouse pointer over each bar to see the exact number). These numbers might vary slightly depending on how the background removal was done.

- d. The *PLS Model – Observed vs Calculated* plot is showing the calibration curve for our model. In the Settings menu under *Data range* and *Y:* field you can change the variable to look at. Under *Statistics* you can add a linear regression line to the plot.

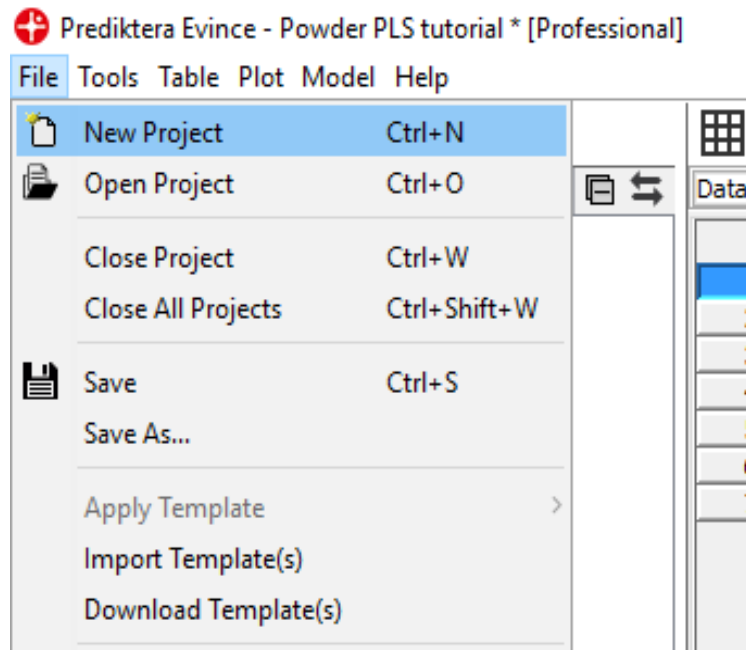


7. Testing the quantification model by predicting the content in a new image

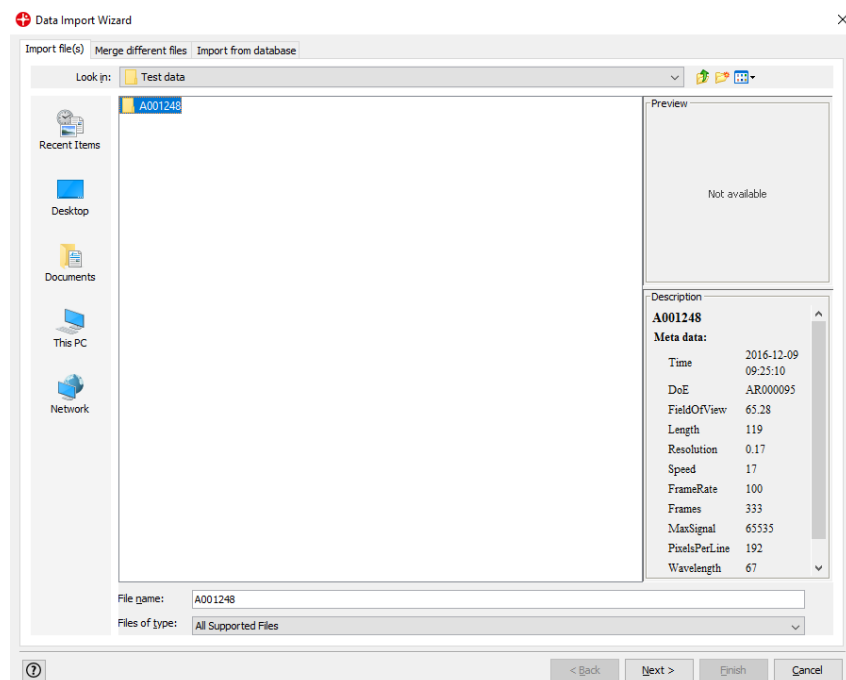
- a. We now want to use this model to analyse the content of a new sample. Right click on the PLS model in the data tree and *Save As*. Choose a name and location and click on *Save*.



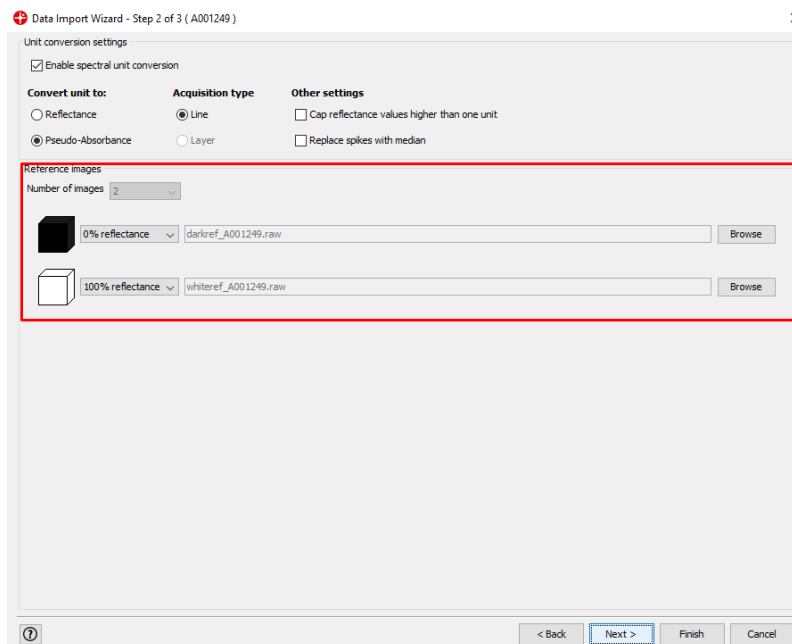
- b. Click on *File* and *New project*, Select *New* and click on *Finish* in the next window.



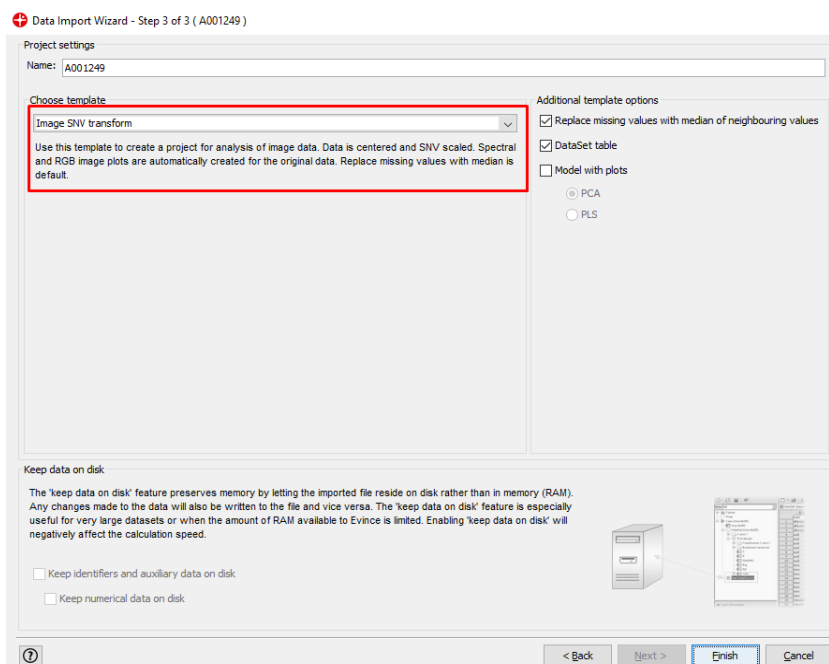
- c. Find the folder A001249 that contains the image that we want to analyse. Click *Next* and then *Next* again.



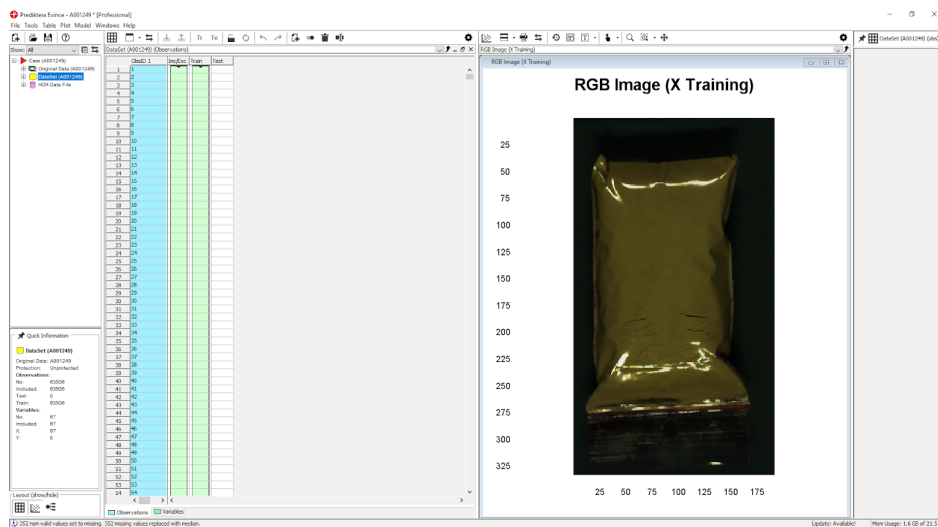
- d. In this window you can change the white and dark references that are applied to the image. If the reference files are located in the same directory as the image file and named `darkref_"imagename"`, and `whiteref_"imagename"`, as they are in this case, Evince will automatically apply these to the imported image. Click *Next*.



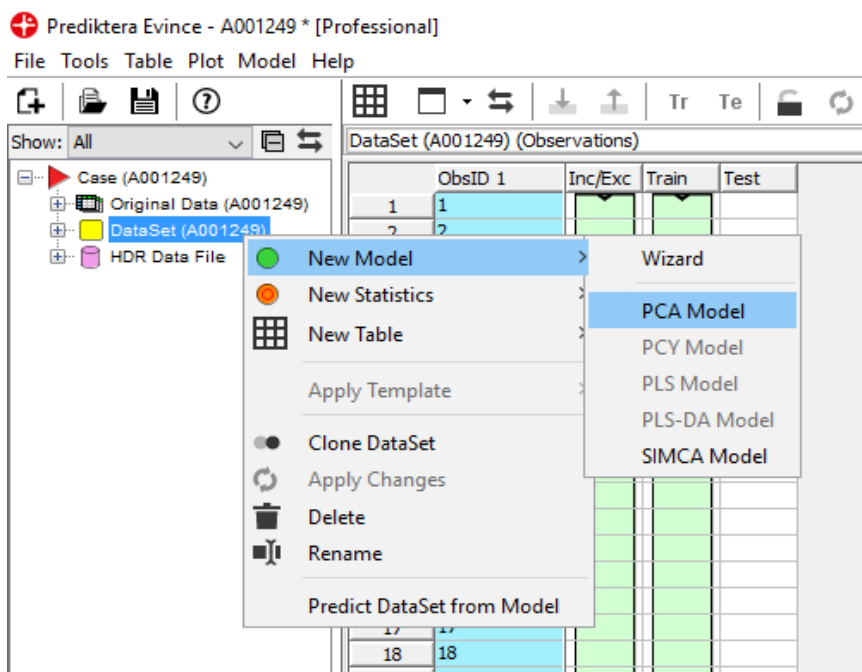
- e. Choose the *Image SNV transform* template and click on *Finish*.



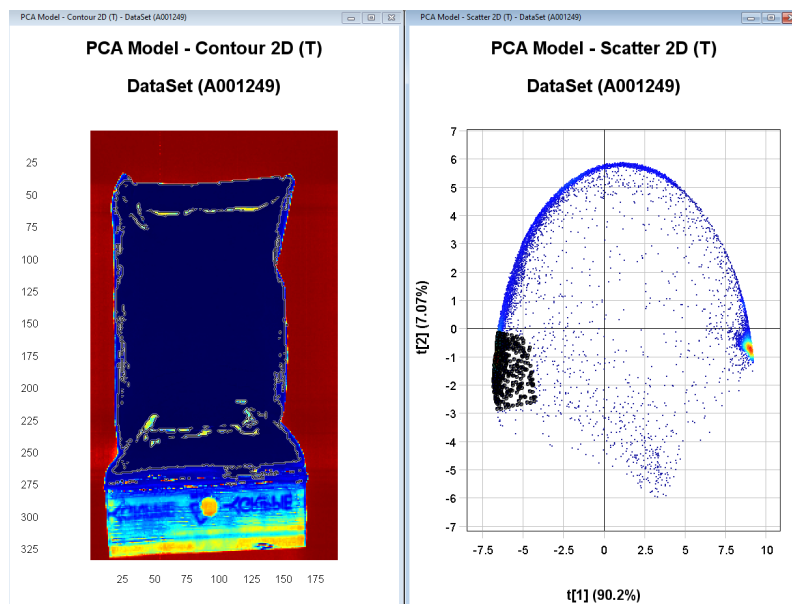
f. We have now imported the image into a new Evince project



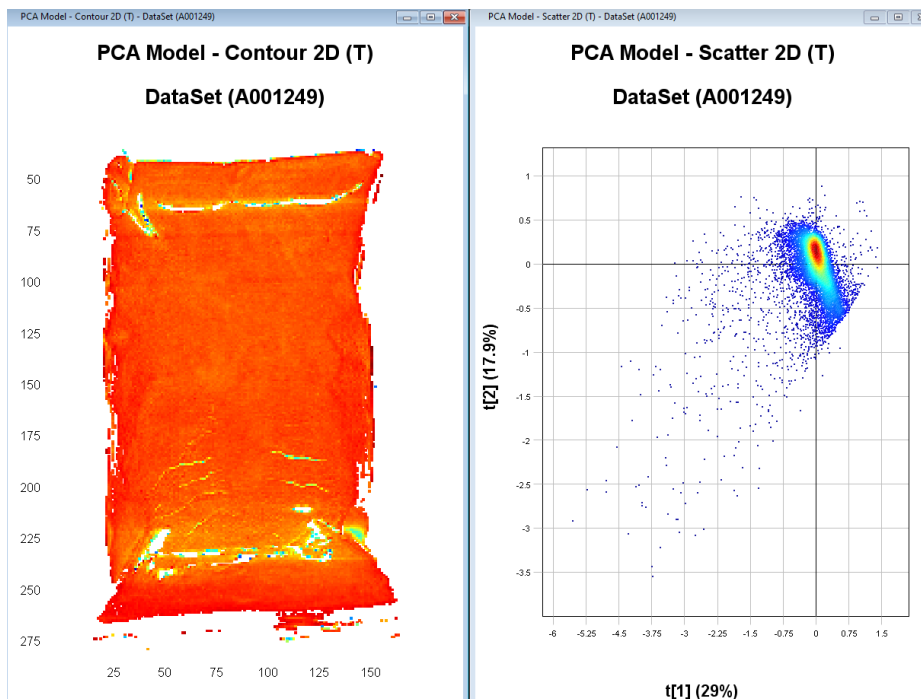
g. Right click on the *DataSet/New Model/PCA Model* and then *Finish*.



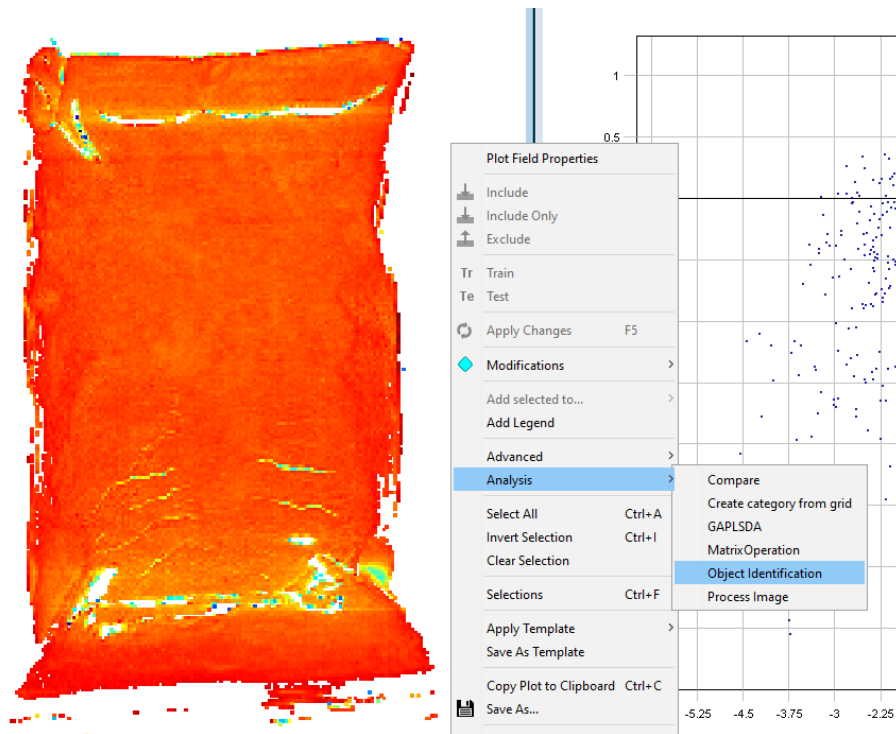
- h. Select the points in the left side cluster in the *PCA Model – Scatter 2D*. We see in the *PCA Model – contour 2D* plot that this corresponds to pixels on the sample.



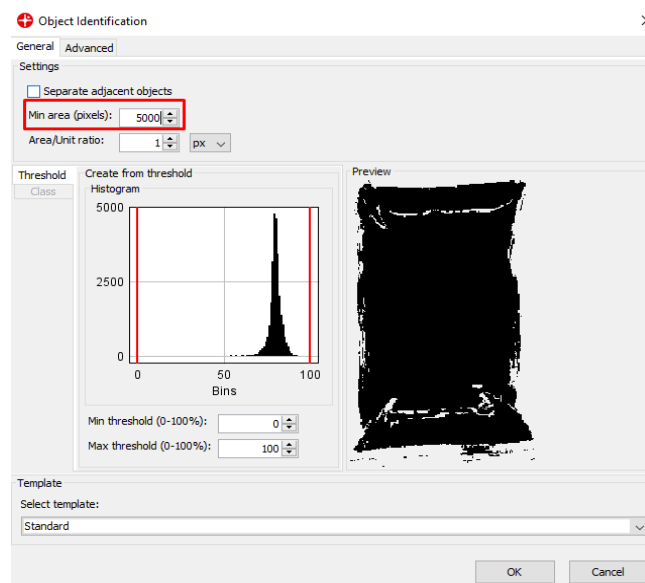
- i. Right click on one of the plots and select Include only and then *Apply changes*. We now have an updated PCA model without the background pixels.



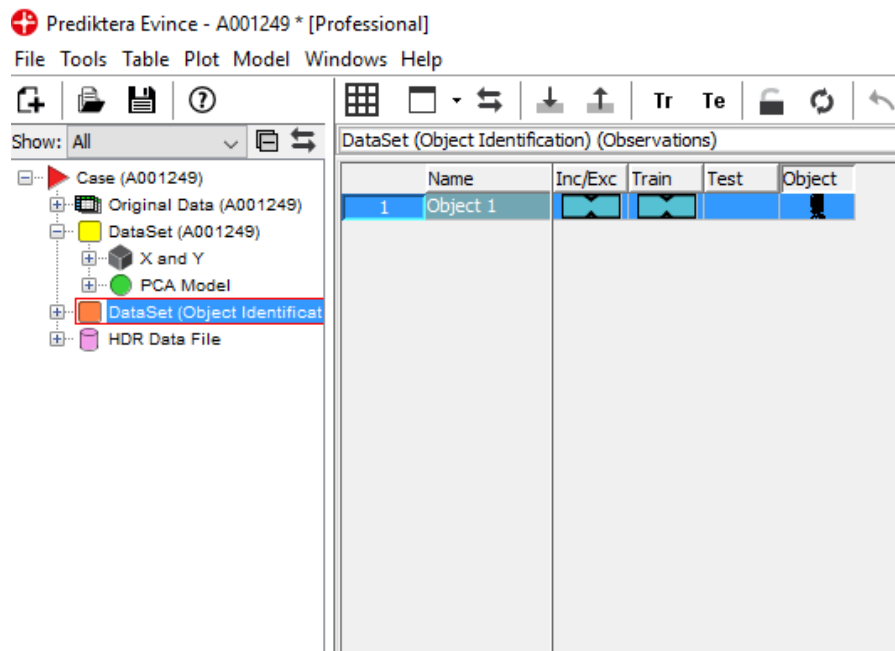
- j. When you are satisfied with the clean-up of the image, right-click on the *Contour Plot* and select *Analysis/Object identification*



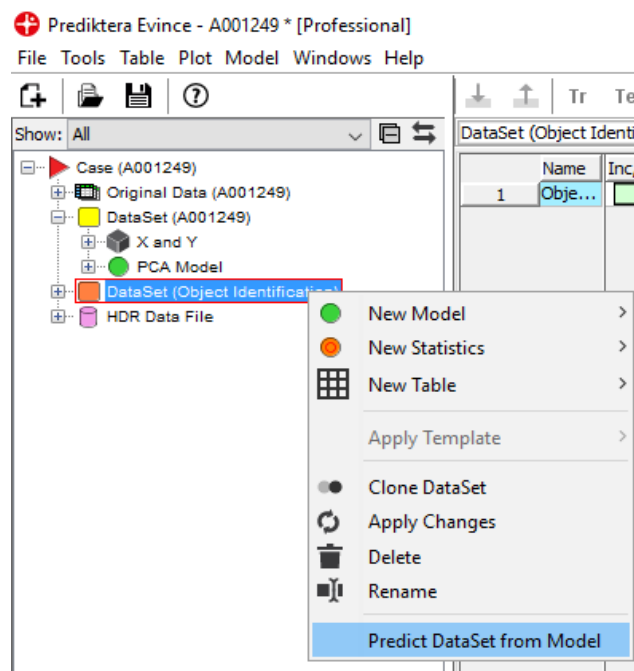
- k. Set the *Min area* to 5000 pixels. This means that any object under 5000 pixels will not be found. This can be useful to remove small objects like dust. Click *OK*.



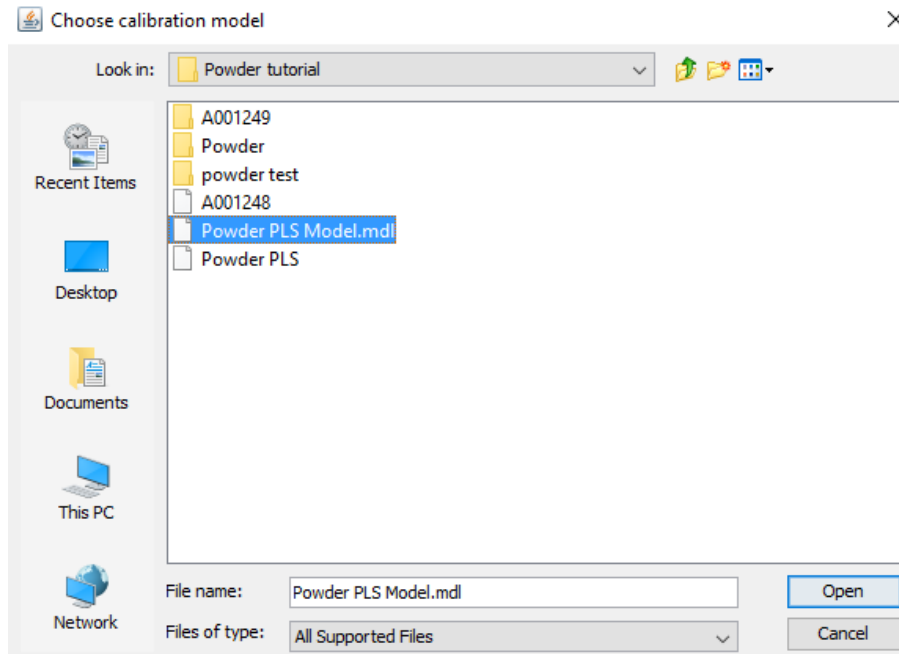
- l. We now have a new dataset consisting of the average spectra of the sample.



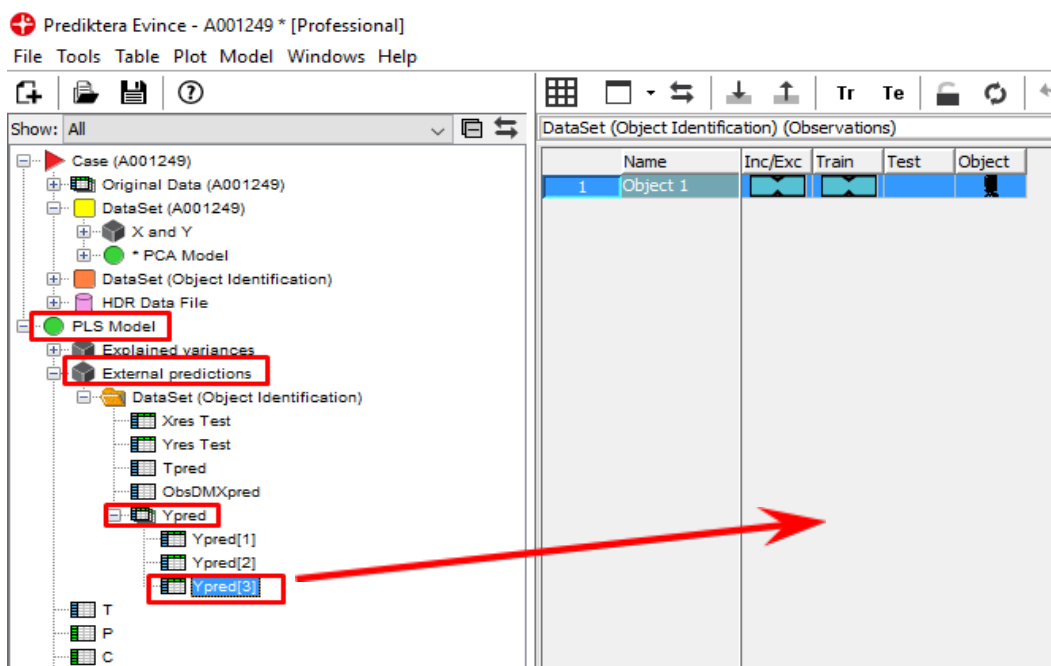
- m. Right click on the *DataSet* and select *Predict DataSet from Model*



- n. Select the PLS model that was created and saved earlier (.mdl file) and click *Predict* in the next window.



- o. We can now see the PLS model in the data tree. Click on *PLS Model/External predictions/Ypred/Ypred [3]* and drag *Ypred[3]* to the table area. Click *Finish* on the window that appears.



- p. A table is generated that shows the predicted values of the 3 materials for the whole plastic bag with powder (based on the average spectra of the sample). This sample actually contained a mix of 33% of each material so the prediction is pretty close.

Prediktera Evince - A001249 * [Professional]
File Tools Table Plot Model Windows Help

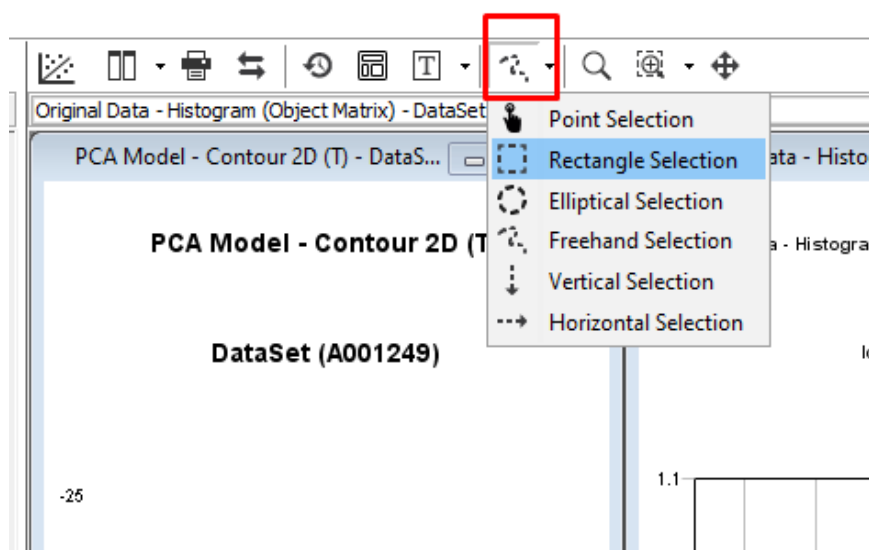
Show: All

Case (A001249)
Original Data (A001249)
DataSet (A001249)
X and Y
PCA Model
DataSet (Object Identification)
HDR Data File
PLS Model
Explained variances
External predictions
DataSet (Object Identification)
Xres Test
Yres Test
Tpred
ObsDMXpred
Ypred
Ypred[1]
Ypred[2]
Ypred[3]
T
P
C
W

Data (Ypred[3])

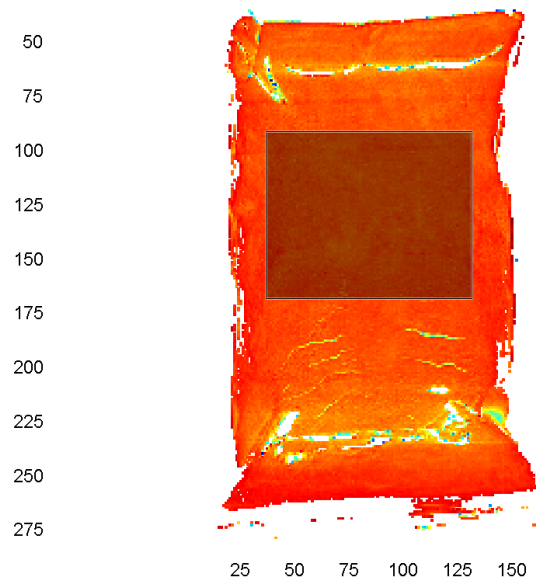
ID	1	2	3
ObsI...	Ypred.Vanill...	Ypred.Bakin...	Ypred.Potat...
1	1	33.406	31.883
		34.465	

- q. We are now interested to see the spatial distribution of the 3 materials in this sample. We can do this by using our model to predict the % of the materials in each pixel.
- r. First go to the menu for the selection tool and change to *Rectangle Selection*

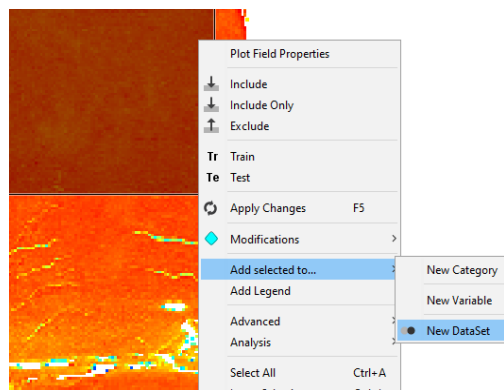


- s. Hold down the left mouse button and drag the selection tool over the area we want to analyse in the centre of the plastic bag

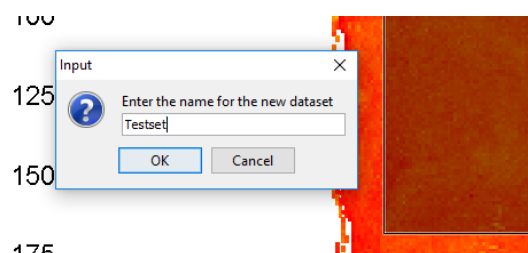
PCA Model - Contour 2D (T) DataSet (A001249)



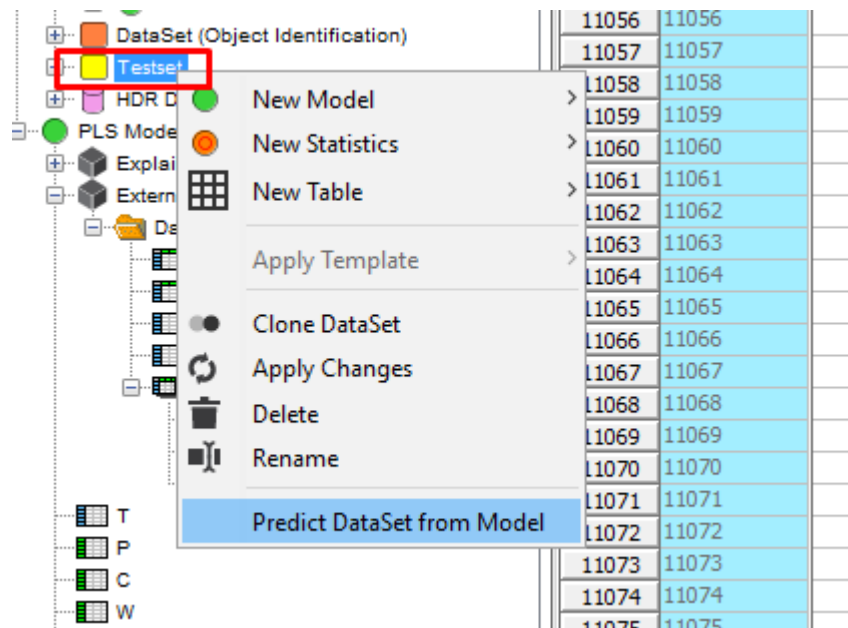
- t. Right click on the image and *Add selected to/New dataset*



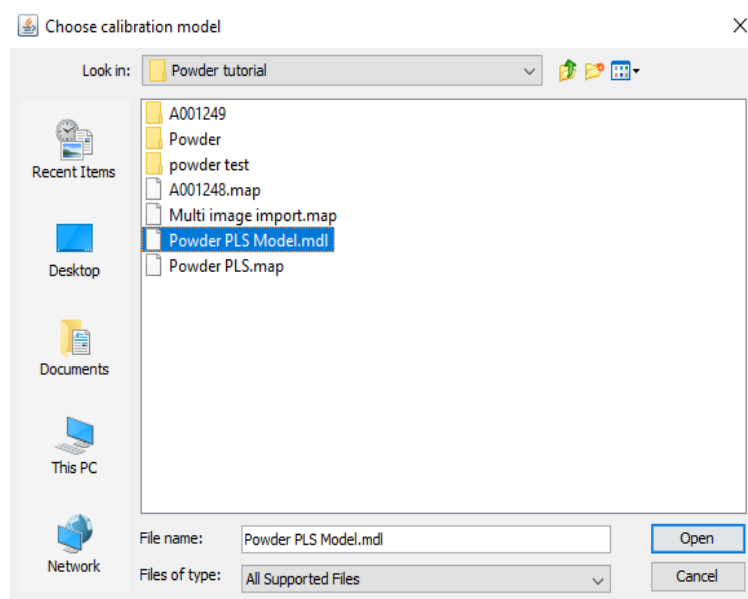
- u. Give the dataset a new name and click on *OK*



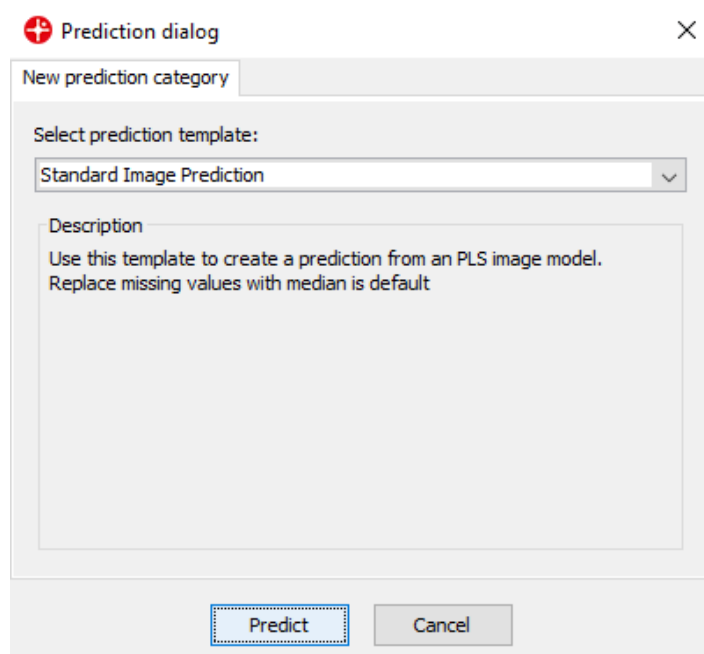
- v. Right click on the new DataSet in the data tree and select *Predict DataSet from Model*.



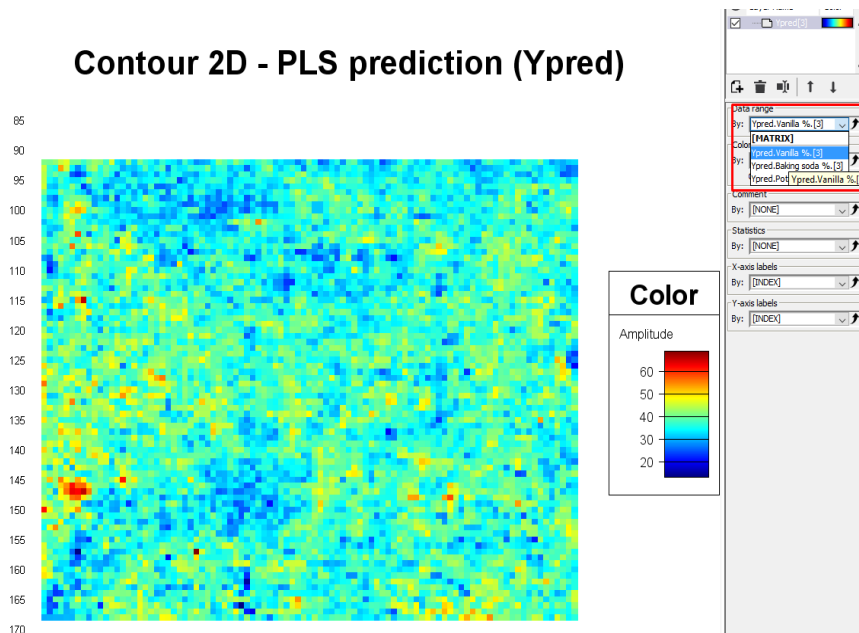
- w. Select the PLS model and click on *Open*



- x. Make sure the *Standard Image Prediction* is selected and click on *Predict*

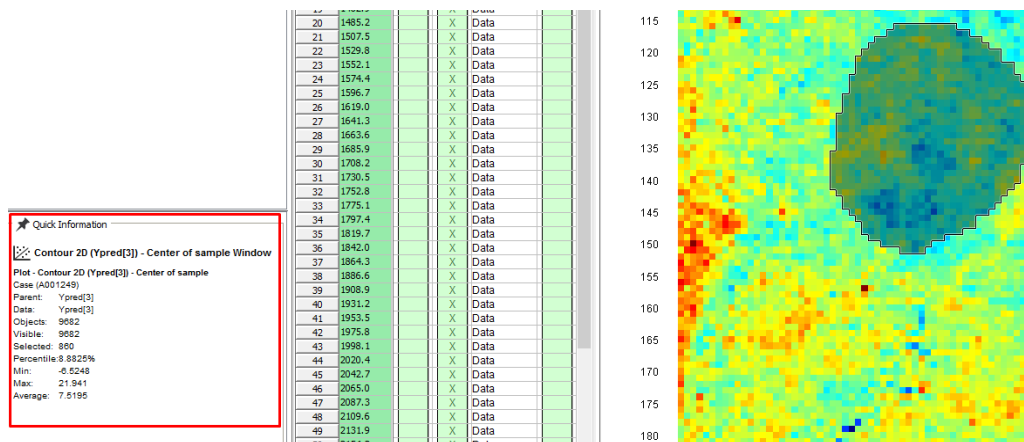


- y. A contour plot is now generated that shows the spatial variation of the % of the 3 materials. In the Settings menu under *Data range* you can change the variable to look at. After changing it, click on the *Contour plot* to make sure the color scale is updated.



The pixels that are red show areas that have a higher % of that specific material, and the dark blue pixels are the areas that have a lower %. If the powders were well mixed and therefore homogeneous in this plastic bag, one would expect that all pixels would be colored light blue/green corresponding to 33%.

- z. By selecting an area we can see the min, max and average value in the *Quick information* window



Conclusion

Congratulations on making it all the way to the end!

You have now learned how to use Evince to make a PLS quantification model using hyperspectral images. You also know how to first do a clean-up of your images before the analysis and how to apply the quantification model on new samples.

The model we developed in this tutorial enables us to analyse the content of new samples of plastic bags of powder with unknown % of 3 materials. The model seemed to perform well as confirmed when testing it on one new sample. As the next step it would be wise to validate this model by using additional samples with varying % of the 3 materials, though we will not cover that in this tutorial.