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[IMAGE RESTORATION SOFTWARE.]

Blind Image Deconvolution User Manual Version 1.0

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1. Introduction

As part of the Computer Engineering Final Project, supervised by Prof. Rafael Molina in collaboration with Dr. Javier Mateos, members of the Department of Computer Science and Artificial Intelligence (CCIA) at the University of Granada (Spain), we have developed a software package that is able to perform Blind Deconvolution using a variational approach to parameter, image and blur estimation [1]. This software is divided into three modules: the first one degrades a given original image, applying blur and noise to it. The second module actually performs the Blind Deconvolution. The third gives useful information about the deblurring process, such as the improvement in signal-to-noise ratio (ISNR) as an objective measure of the process quality.

1.1. Purpose of this Document

The aim of this document is to easily explain how each of the modules works, so it would be easy for anyone to use them. Each and every one of the features the programs allow us to use will be explained here step by step using many pictures and diagrams.

First of all, the Noise and Blur application will be explained with a series of snapshots of the program itself, and all the menus and functionalities will be shown.

Secondly, the main program will be explained in a similar fashion, covering the full functionality of the Blind Deconvolution Algorithm developed.

The third part stands for a brief explanation of the last module, so it can make clear its purpose and functionality, and instructions for use will be given as well.

The last part of this document contents an example of use that may assist a first-time user of the application.

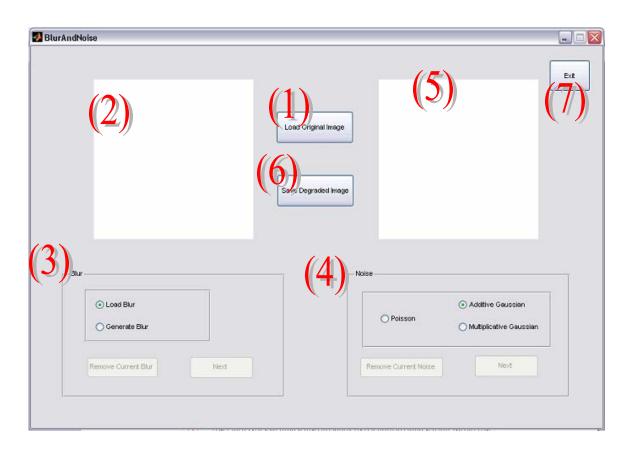
2. Blur and Noise Application

This application performs the functionality to degrade an image with blur and noise determined by the user. To start the module, we must run the "BlurAndNoise.m" file in the Matlab console. Another option is to run the Guide application in Matlab, and run the "BlurAndNoise.fig" file with it. Do not forget to change the Matlab Current Directory in the Matlab console to the one in which the BlurAndNoise files are stored in order to be able to run it.

The following sections show how to use the program and describe the functionalities implemented on it.

2.1. Main Window

Here we can see what the program Blur and Noise looks like when it is started, and a brief explication is given of the main buttons and menus:

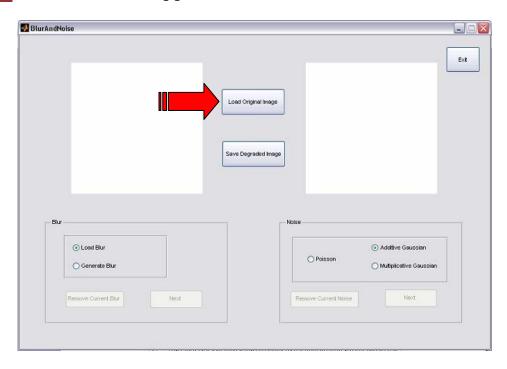


- (1) The Load Original Image button allows us to load an image from within the system, in order to work with it.
- (2) This space will display the image we loaded before.
- (3) The Blur panel allows user to apply a blur mask to the loaded image.
- (4) The Noise panel allows user to apply noise to the previously blurred image.
- (5) This space will show the observed image, first the blurred image and later, if this is the case, the blurred and noisy image.
- (6) The Save Degraded Image button allows us to save the observed image in the system.
- (7) The Exit button closes the application.

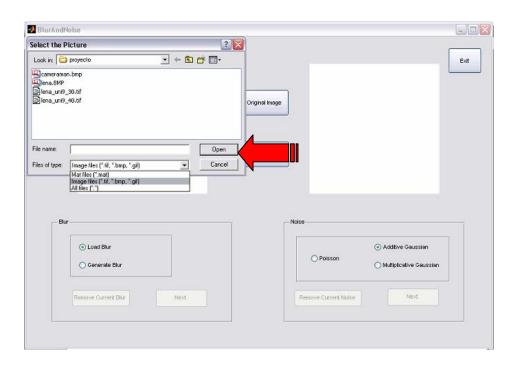
2.2. Load an Image

First thing we need to start working in order to obtain an observed image is to load an image, so we click on the Load an Image button as it is shown in the picture:

Image Restoration Software. Blur and Noise Application



Then we will need to select and open an image using the browser that pops up. We are able now to search the system looking for an image to degrade. When the image is found, the next step is to click on the button "Open" in the browser, as it is shown in the picture:



When selected, the image will be shown in the left square of the interface, looking like this:



Note that the button "Next" is now available in the Blur panel, so we are now able to start working on the image.

2.3. Blurring the selected Image

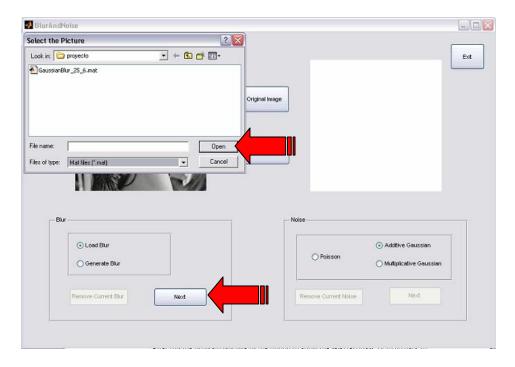
We are now going to use the Blur panel to blur the loaded image. The panel gives us two options:

2.3.1. Load Blur

This option allows us to choose a blur mask stored in a .mat file to apply it to the loaded image. It must be taken into account that the blur kernel must be stored in the first variable stored in the .mat file. If the file in question has been saved with the Blur and Noise application, there will be no problem loading it. We have to click on the Next button while the Load Blur option is selected, as it is shown in the next picture. The center of the blur is the center of the mask.



Next thing we have to do is select the desired blur mask using the browser that comes up, and click on "Next" button on the Blur panel:



After this the program will give us the option to apply the selected mask, or to go back to the main window and start again the blurring process:



2 Image Restoration Software. Blur and Noise Application

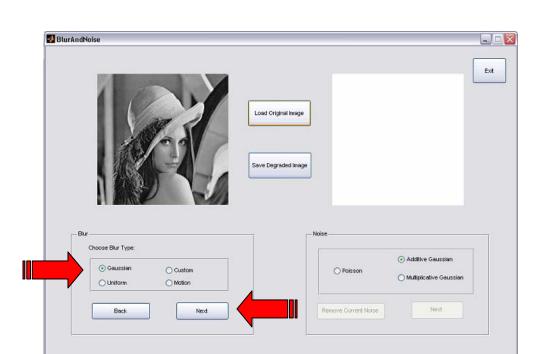
If we choose to Apply, the blurred image will be shown in the right white square, showing that blur has been applied successfully.

2.3.2. Generate Blur

In case we want to generate a blur mask instead of loading it from a file, we have to select the Generate Blur option as it is shown in the picture:

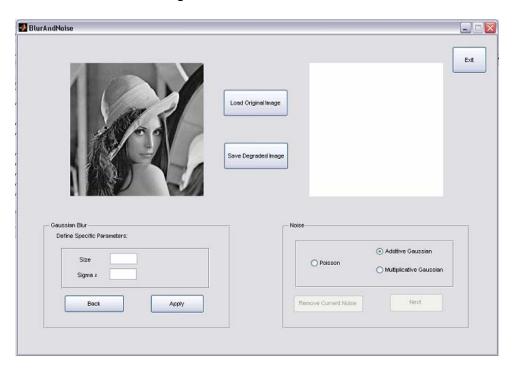


The interface will show the four possibilities we have for blur: which are Gaussian, Uniform, Customized and Motion, and user should select one and then click on "Next" button.



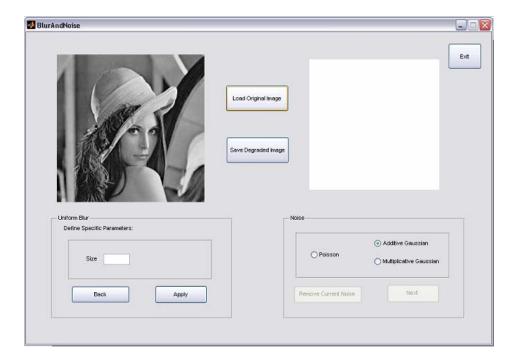
2.3.2.1. Gaussian Blur

To apply this blur, we will be asked to introduce two parameters that define the blur: Size and Sigma 2 . This creates a [Size x Size] Gaussian kernel filter with variance value of Sigma 2 :



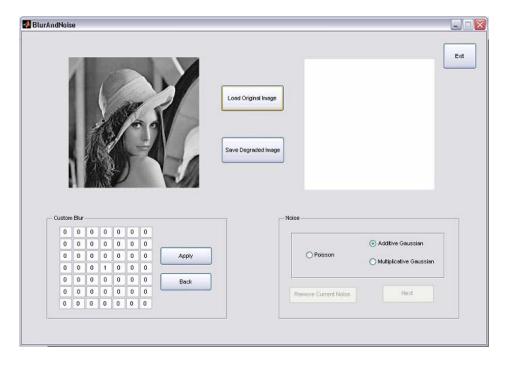
2.3.2.2. Uniform Blur

This blur requires a parameter that is the size of the blur kernel, and so the interface will ask us for it:



2.3.2.3. Customized Blur

This option gives us the possibility to configure a blur kernel according to our own preferences, giving us a 7x7 matrix to specify it. The kernel must be centered in the middle of the square (4th row, 4th column).



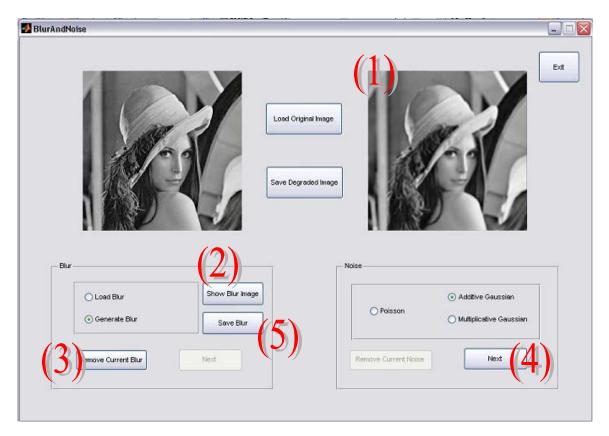
2.3.2.4. Motion Blur

To apply this kind of blur, we will be asked to introduce two parameters that define the blur: Size and Theta. The motion blur approximates the linear motion of a camera by Size pixels, with an angle of Theta degrees in a counterclockwise direction. It is so that the user must introduce the Size in pixels and the angle in degrees to obtain correct results:



2.3.3. Situation after blur application.

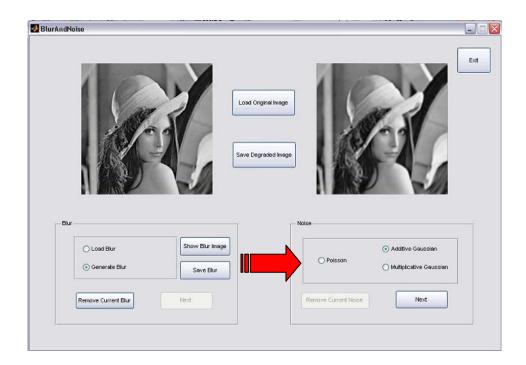
After any of the Blur types have been applied, we will show the main Blur panel view again. In the next picture we give details about the new situation:



- (1) Here we have the blurred image.
- (2) This Show Blur Image button allows us to see the blur matrix as an image.
- (3) The Remove Current Blur button deletes blur from the image and lets us start from the beginning.
- (4) The Next button in the Noise panel is now active, so we can apply noise to the blurred image.
- (5) With the Save Blur button we have the possibility to save the applied blur into a .mat file.

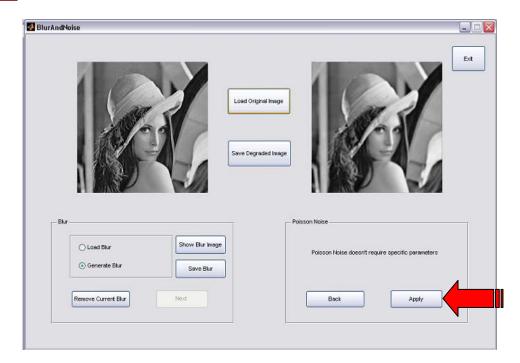
2.4. Applying noise to an image.

The second transformation we can do to the image is noise application. We now show how to add noise to the blurred image. The interface gives us different possibilities: Poisson noise, Additive Gaussian noise or Multiplicative Gaussian noise.



2.4.1. Poisson noise.

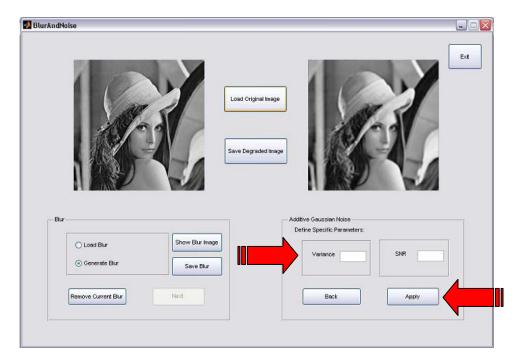
This type of noise does not require any kind of parameters to be provided, so the interface directly will ask us for confirmation, by clicking on "Apply" button, as it is shown in the picture:



After pressing "Apply", the right image window will be updated with the desired noise added to the blurred image.

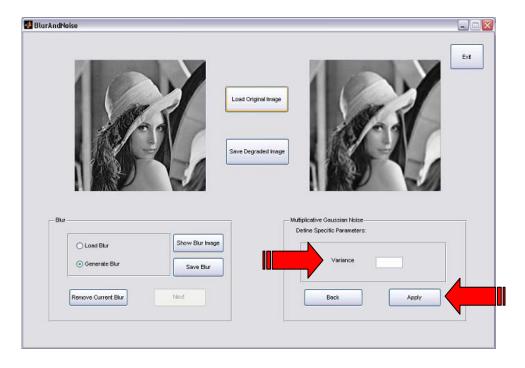
2.4.2. Additive Gaussian noise.

In order to introduce this kind of noise, we will be asked to provide the noise variance or the signal-noise ratio. If we press the Enter key in our keyboard after introducing any of the parameters, the other will be automatically actualized, so we will see if the noise is the one desired before actually applying it:



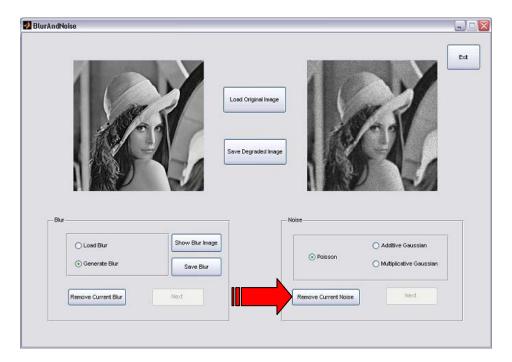
2.4.3. Multiplicative Gaussian noise.

This type of noise requires the parameter that multiplied by the blurred observation corresponds to the variance of the noisy observation, so it will be requested through the interface as it is shown below:



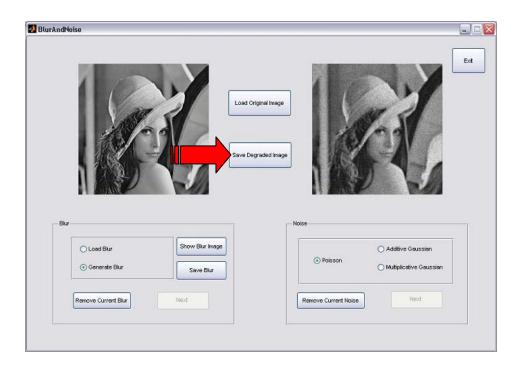
2.4.4. Situation after noise application.

After applying any noise to the blurred image, the interface will look like the image below. Note that we will not be able to introduce any other kind of noise into the image unless the "Remove Current Noise" button is clicked on, in that case the interface will delete the current noise and we will be able to start from the beginning of the noise-application process.

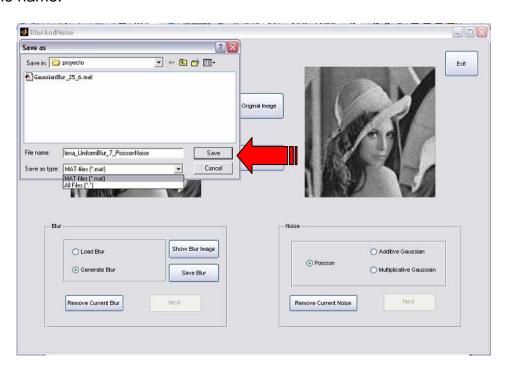


2.5 Saving Results.

We are able to save the degraded image at any time in the degradation process, only by pressing the "Save Degraded Image" button, as it is shown in the picture. Keep in mind that the image being saved is the one showed in the right square of the interface:

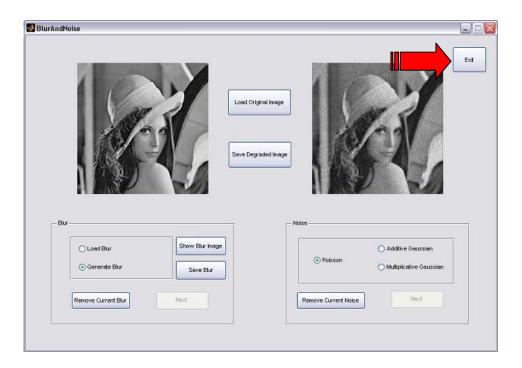


A saving window will pop up so we are able to specify the name and the extension of the image. The extension .mat will be given as a default, but we are able to specify any other file format by specifying it in the window at the end of the file name.



2.6. Closing the application.

To close the application and all its windows, we just have to press the "Exit" button, as it is shown in the picture:

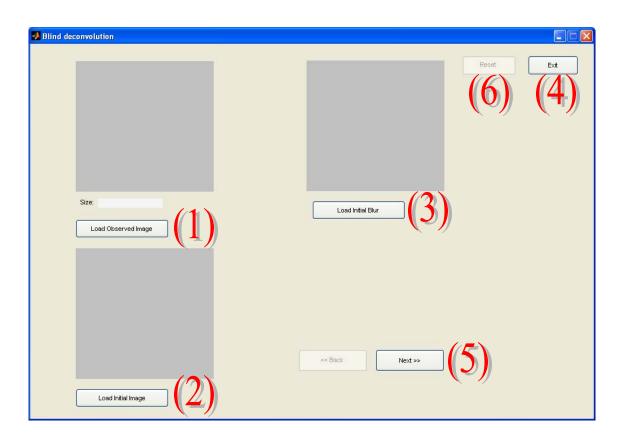


3. Blind Deconvolution Application

This application implements the Blind image restoration method proposed in [1]. To start the module, we must run the "Blind_deconvolution.m" file in the Matlab console. Another option is to run the Guide application in Matlab, and run the "Blind_deconvolution.fig" file with it. Do not forget to change the Matlab Current Directory in the Matlab console to the one in which the Blind_deconvolution files are stored in order to be able to run it.

3.1. Main Window

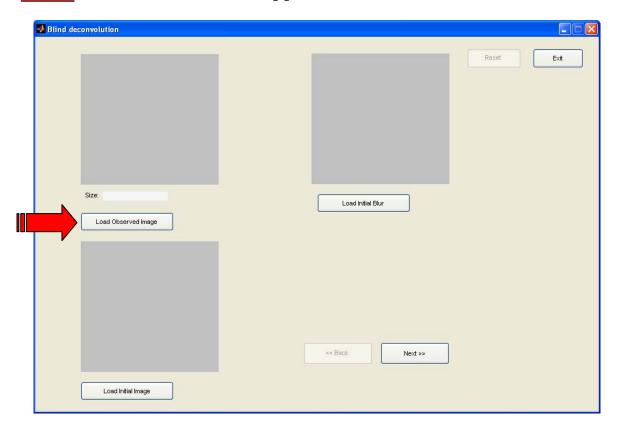
Here we can see what the program looks like when it is started, and a brief explanation is given of the main buttons. In this step we must load an Observed Image, an Initial Image and the Initial Blur for the Blind Deconvolution process:



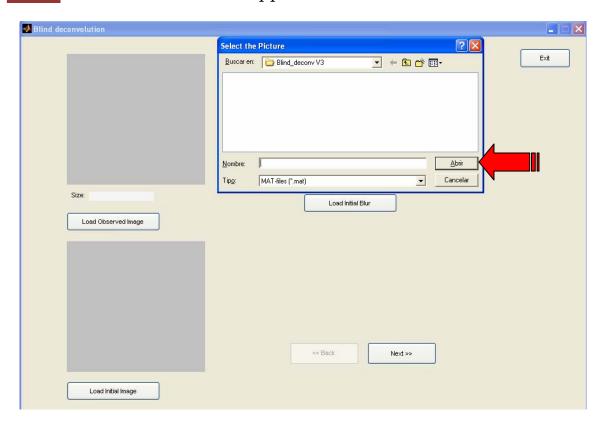
- (1) The "Load Observed Image" button allows us to load an image from within the system which will be the degraded Observed Image.
- (2) The "Load Initial Image" button allows us to load an image from within the system which will be the Initial Image for the restoration process.
- (3) The "Load Initial Blur" button allows us to load an image from within the system which will be the Initial Blur for the restoration process.
- (4) The "Exit" button closes the application.
- (5) The "Next" button takes us to the next window of the application in which we can set up the parameters for the Blind Deconvolution process.
- (6) The "Reset" button takes us to the main window of the application.

3.2. Load an Image

First we click on the Load Observed Image button in order to load the image we want to restore.

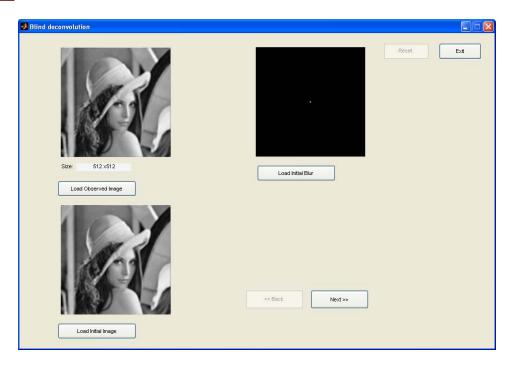


Then we will need to select and open a picture using the browser that pops up. Allowed file formats are .mat and common image formats like .bmp, .tif, .png, .gif or .jpg. When the image is selected, the next step is to click on the button "Open" in the browser, as it is shown in the picture:



When selected, the image will appear in the square over the button. By default, the Initial Image for the restoration process will be the same image, and the Initial Blur will be a Gaussian Blur with deviation Sigma=2. The size in pixels of the Observed Image is shown below the image:

Image Restoration Software. Blind Deconvolution Application



We can load a different Initial Image by clicking on the Load Initial Image button:

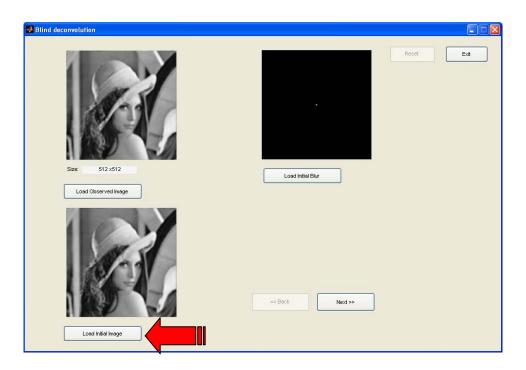
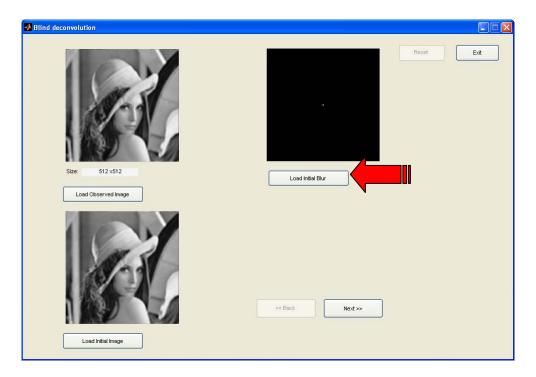
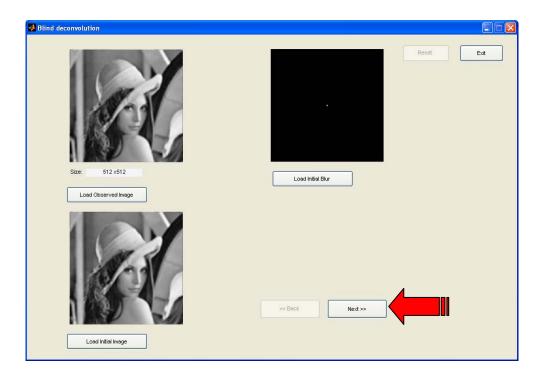


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We can load a different Initial Blur by clicking on the Load Initial Blur button:



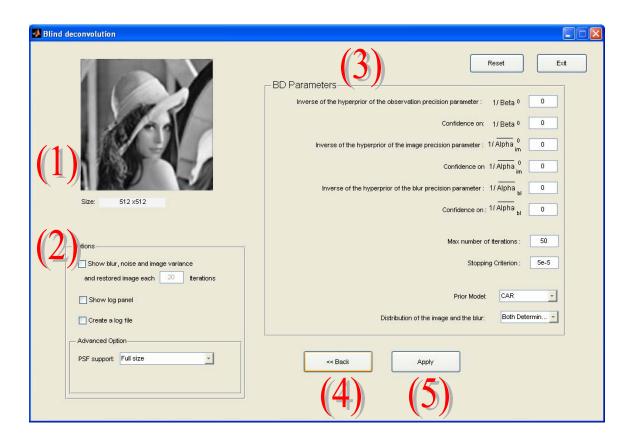
To go to the next step we must click on the Next button:



3.3. Parameters Window

3.3.1. General Description

Here we can see what the window looks like. A brief description now is given of the main elements:

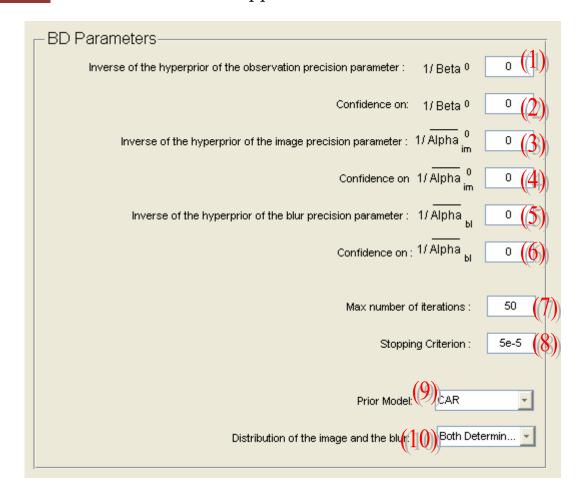


- (1) Here we can see the Observed Image and its size.
- (2) The "Options" Panel has different options that we can choose to show information of the restoration process. For further information see chapter 3.3.3.

- (3) The "BD Parameters" panel has fields with the different parameters which are used by the Blind Deconvolution algorithm. For further information see chapter 3.3.2.
- (4) The "Back" button takes us to the previous window of the application.
- (5) The "Apply" button starts the Blind Deconvolution process with the selected parameters and options.

3.3.2. Blind Deconvolution Parameters

Here we can see the different parameters and a short description of each of them:



- (1) Inverse of the hyperprior of the observation precision parameter $1/\beta^0$. The default value for this parameter is 0.
- (2) Confidence on the previous parameter. Must be a value between 0 and 1, with 0 meaning no confidence on the given parameter $1/\beta^0$, that is, the value of the parameter will be estimated from the data, and 1 meaning that it fully enforces the value of the parameter, i.e., no estimation is performed on the parameter.
- (3) Inverse of the hyperprior of the Image precision parameter 1/Alpha The default value for this parameter is 0.
- (4) Confidence on the previous parameter. Must be a value between 0 and 1, with 0 meaning no confidence on the given parameter 1/Alpha , that is, the value of the parameter will be estimated from the data, and 1 meaning that it fully

enforces the value of the parameter, i.e., no estimation is performed on the parameter.

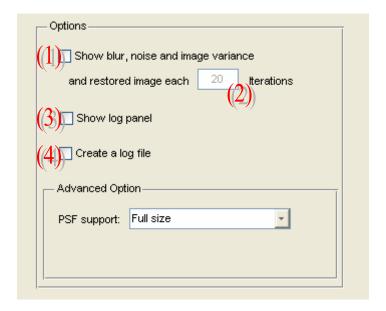
- (5) Inverse of the hyperprior of the Blur precision parameter $1/\overline{Alpha_{bi}}$. The default value for this parameter is 0.
- (6) Confidence on the previous parameter. Must be a value between 0 and 1, with 0 meaning no confidence on the given parameter $1/\overline{Alpha_{bi}}$, that is, the value of the parameter will be estimated from the data, and 1 meaning that it fully enforces the value of the parameter, i.e., no estimation is performed on the parameter.
- (7) Maximum number of iterations of the algorithm. The process stops if the stopping criterion is met. If not it stops when it reaches the maximum number of iterations.
- (8) Stopping criterion. The algorithm stops if the result of divide the norm of the difference between the restored image of the actual iteration and the restored image in the previous iteration by the norm of the restored image of the actual iteration is less than this value.

(Mathematically: $\frac{\|x^{k}-x^{(k-1)}\|^{2}}{\|x^{k}\|^{2}} \le$ Stopping criterion)

- (9) Prior model of the image and the blur. We can choose between a Simultaneous Auto-Regressive prior model and a Conditional Auto-Regressive prior model.
- (10) Distribution of the image and the blur. We can choose between:
 - Both deterministic.
 - Deterministic distribution of the blur and Random distribution of the image.
 - Both Random.

3.3.3. Options

The options of this panel enable us to see information about the Blind Deconvolution process. We can run the Blind Deconvolution method without any log information or select one or more options.



- (1) With this option the application displays the image, blur and noise variance and it also shows you the restored image. This information is refreshed every given number of iterations. See (2).
- (2) Number of iterations to refresh the information in (1).
- (3) With this option the application creates a panel where all the information that the application generates during the restoration process is displayed.
- (4) With this option the application creates a file where all the information that the application generates during the restoration process is stored.

3.3.4. Advanced Options

This panel inside the Option panel allows us the possibility of choosing between three different PSF sizes.

- Full size: the PSF support will be the same size of the image during the Blind Deconvolution process. Components of the PSF could be positive or negative values.
- Set (height and width): with this option you have to set the size of the PSF support.



This option will set to 0 all the values of the PSF that are outside the kernel size. The default value is [20 x 20]. Components of the PSF could be positive or negative values, but normalization is applied to the PSF in order to keep its components (positives and negatives) making 1. An example is given here to illustrate the process:

If we have this PSF and we select a 4x4 PSF support:

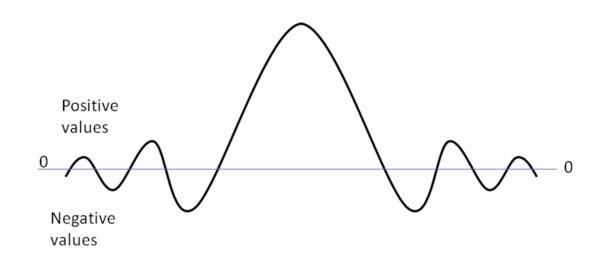
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0					0	0
0	0					0	0
0	0					0	0
0	0					0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

The program will set to 0 all the values out of the grey squares and then normalize all the PSF in order to keep the values making 1. The program will do this each iteration.

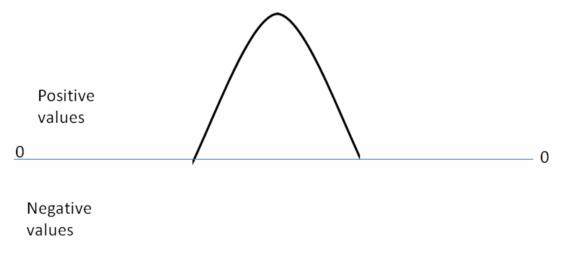
Automatic: with this option the program sets automatically the PSF. It sets
to 0 all the values from the border of the PSF until it founds a negative
value, so no negative value will remain in the support. Here again it is
necessary to normalize the PSF in order to keep the values making 1.

Example:

We have a PSF like this.



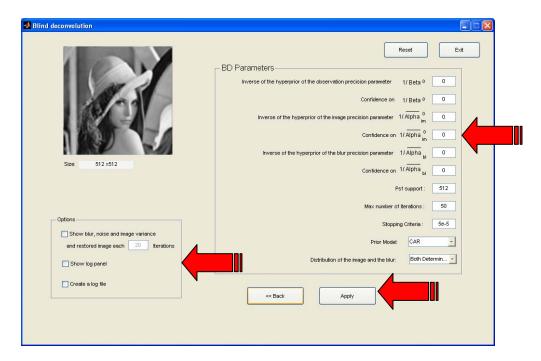
The program will set to 0 all the values since it founds a negative value starting from the center to the borders. The resulted PSF will be like this:



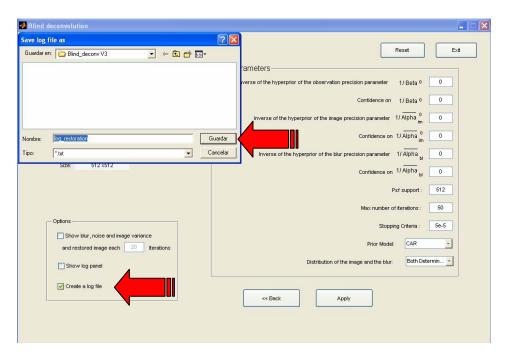
The program will do this every iteration.

3.4. Starting the restoration

Once we have set all parameters we click on the Apply button. We can select the different options to see information on the iterative process:



If we choose the Create a log file option a window to select the output file pops up:



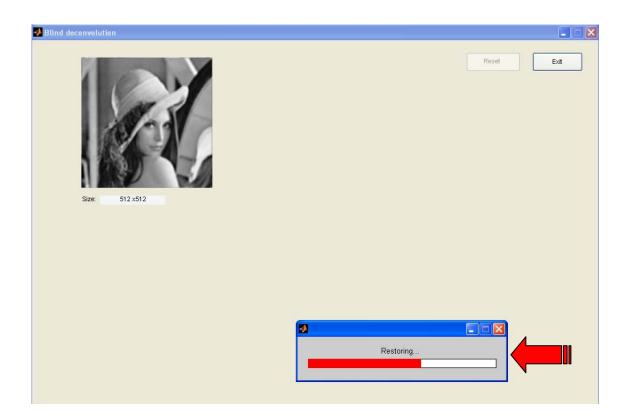
We must write the name that we want for the log file and click on the save button.

3.5. During the restoration process

Here we will see the result of choosing different options. We show the options one by one but we can combine two or more options.

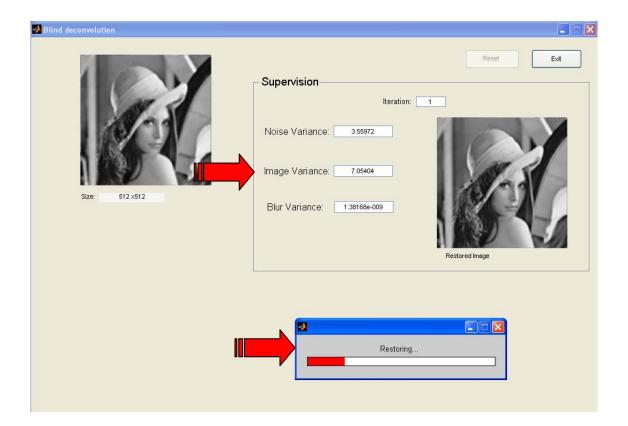
3.5.1. No option selected

After clicking on the Apply button we will see a window with information. If we did not choose any option then the application shows only a progress bar:



3.5.2. Show blur, noise and image variance and restored image

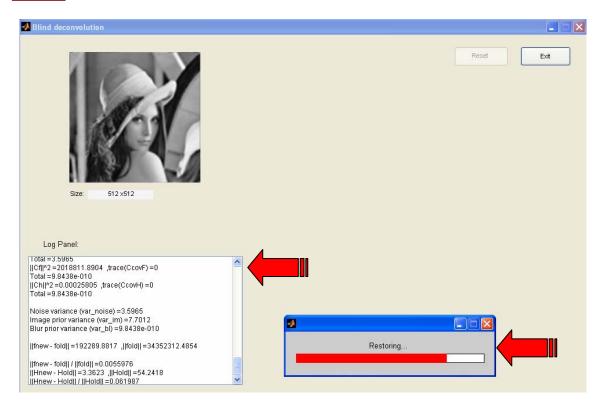
If this option is selected we will see some information and the progress bar. The window will look like the one below:



The information that we see is the noise, image and blur estimates and the restored image. This information is refreshed every the set number of iterations that we specified on the options on the previous window.

3.5.3. Show Log Panel option selected

If this option is selected more information will be shown than with the previous option and the progress bar. The window will have this aspect:



3.5.4. Create a Log file option selected

If this option was selected a log file will be created. The log file is a .txt file with information. A typical log file is shown below:

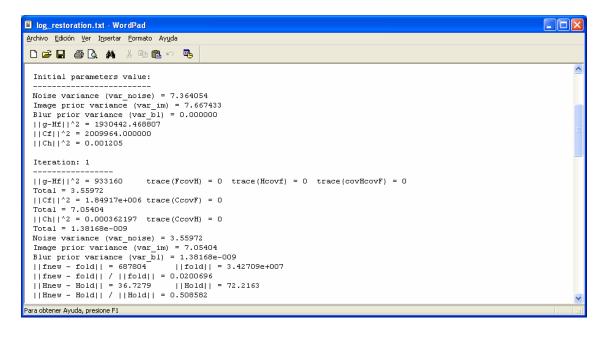
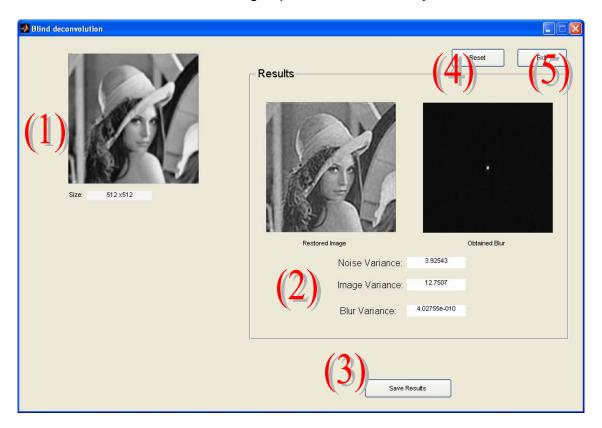


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3.6. Results

When the Blind Deconvolution process finishes we can see the results. This final window has the following aspect and functionality:



- (1) Observed image and its size in pixels.
- (2) Results panel. We can see the restored image, the estimated blur and the noise, image and blur estimates.
- (3) Save results button. It allows the user to save the image, the blur and the image and blur covariance.
- (4) The Reset button takes us to the starting window of the application.

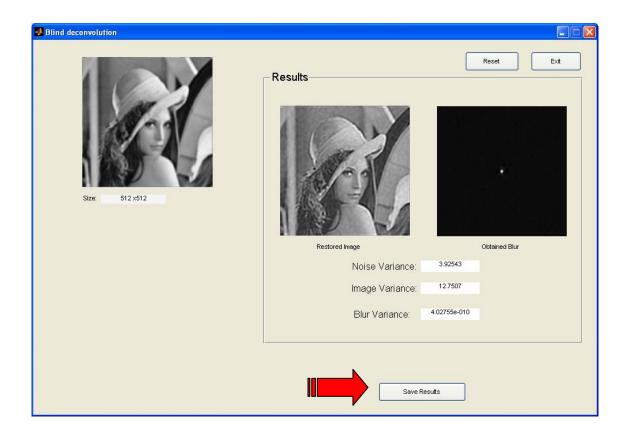
.

Image Restoration Software. Blind Deconvolution Application

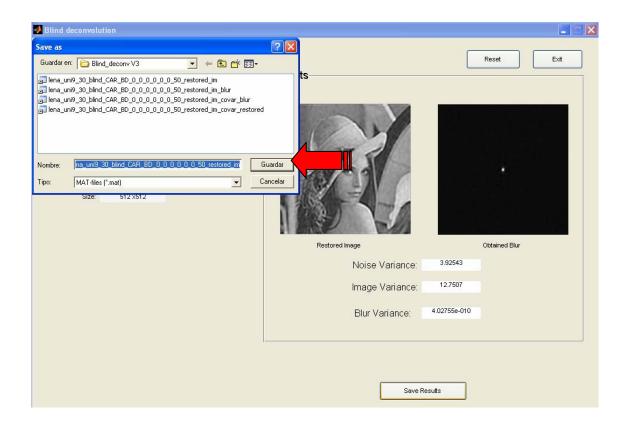
(5) We can leave the application by clicking on the Exit button.

3.7. Saving the results

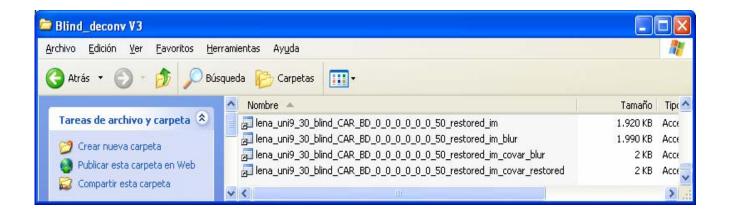
We can save the results by clicking on the Save Results button:



After this, a window to select the name of the file where we are going to save the restored image is opened. The default name to save the file is the name of the Observed image plus the value of the parameters and the string 'rest_im'. The selected name will be the same for the obtained blur, blur covariance and image covariance files by adding the strings 'blur', 'covar_blur' and 'covar_restored' respectively.



Here we can see the saved files with their names.



4. Study results Application

This application has been designed to help users of Blind Deconvolution processes to test results obtained. It is divided into two main functionalities, that are Blur comparison and Calculation of the ISNR as a measure of the quality of the restoration process. To start the module, we must run the "Study_results.m" file in the Matlab console. Another option is to run the Guide application in Matlab, and run the "Study_results.fig" file with it. Do not forget to change the Matlab Current Directory in the Matlab console to the one in which the Study_results files are stored in order to be able to run it.

4.1. Main Window

This program allows us to examine and compare results obtained with the previous two applications. The window that first appears when the program is started displays a menu with three options, as it is shown in the picture below:

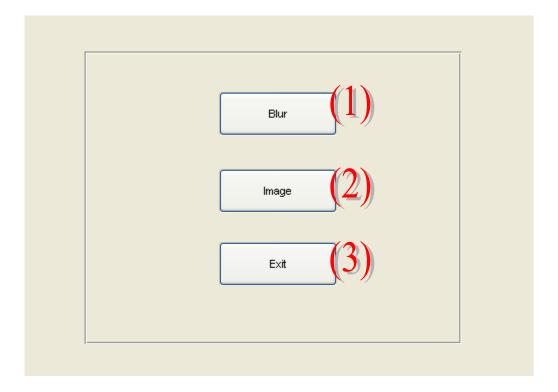
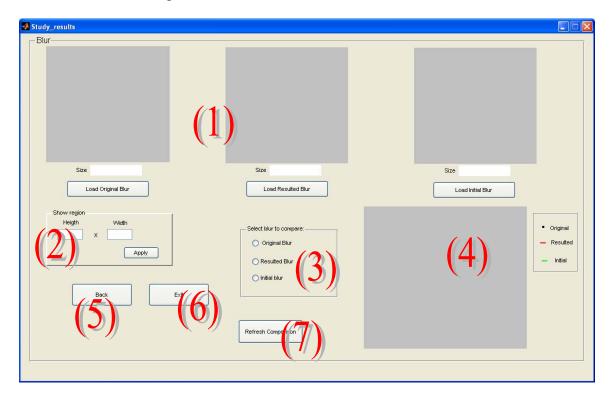


Image Restoration Software. Study Results Application

- (1) The Blur button takes us to the blur window. In that window we can load different blurs and see the differences between them.
- (2) The Image button takes us to the image window. In that window we can load three images, show them and calculate the ISNR.
- (3) The Exit button closes the application.

4.2. Blur Comparison

It is shown here the blur window appearance and a brief explanation of the main buttons is also given:



(1) There are three areas where you can load different blurs. You will see the size of each blur in pixels in the white rectangles.

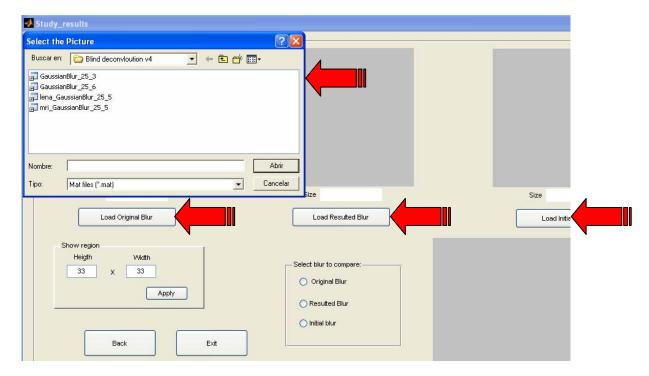
Image Restoration Software. Study Results Application

- (2) The show region panel allows you to make zoom in or zoom out in the blurs.
- (3) This panel allows you to select the blur or blurs that you want to plot (see 4).
- (4) Here is where the application shows the 3D graph of the selected blurs when you click on the refresh comparison button.
- (5) The back button takes you to the main window of the application.
- (6) The exit button closes the application.
- (7) The Refresh Comparison button shows a 3D graph with the selected blurs in the graphics region (see 3 and 4).

4.2.1. Loading the blurs

If we click on any of the Load buttons a window to select the blur file will be opened.

Image Restoration Software. Study Results Application



If we select a file and click on the Open button the blur and its size are shown.

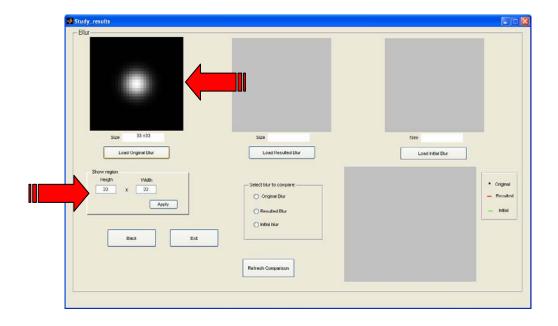


Image Restoration Software. Study Results Application

- The default region that you can see is of the size of the smaller blur matrix and an additional frame of 3 pixels is added around the blur in order to display it better. You can modify this region in the show region panel.
- The original blur refers to the real blur of the degraded image.
- The initial blur refers to the blur that we used as initial in the Blind Deconvolution process.
- The Estimated blur is the blur that we obtain as result in the Blind Deconvolution process.

4.2.2 Making a 3D comparison

We can compare the blurs in a 3D graph by clicking on the Refresh Comparison button. It will show only the selected blurs on the Select blur panel.

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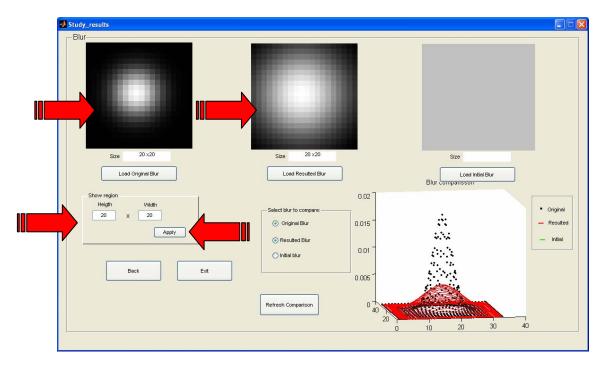
As we can clearly see in the picture, each three blur functions are superposed in a three-dimensional plot to allow us to compare the blurs in every direction. Black color stands for the Original Blur, red for the estimated Blur and Green for the Initial Blur used in the Blind Deconvolution process.

We are able to rotate the 3D graph by moving the mouse pointer while the left button is pressed.

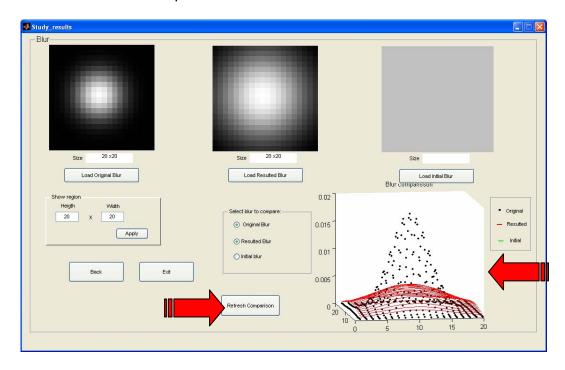
4.2.3 Modifying the shown region

We can also zoom in or zoom out the blurs using the panel shown in the next picture. We can set the size of the region by setting its height and width. Then, if we click on the Apply button, the new region is shown.

Image Restoration Software. Study Results Application



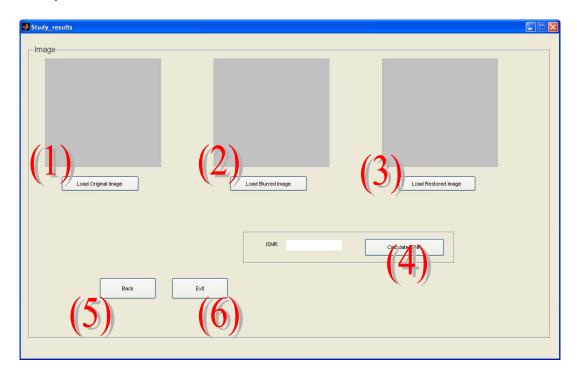
Note that the new psf regions will not be displayed in the 3D plot until we click on the Refresh Comparison button.



4.3. Image comparison

Image Restoration Software. Study Results Application

Here we can see what the image comparison window looks like and a brief explanation of the main buttons.

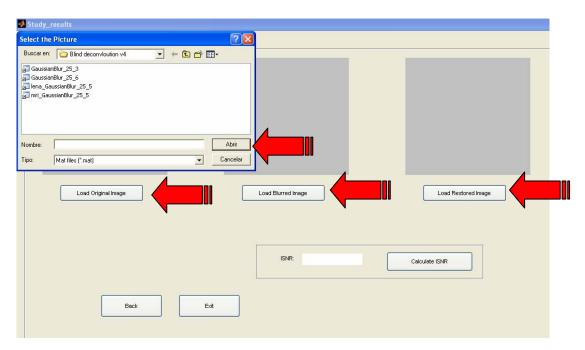


- (1) By clicking on the "Load Original Image" we are able to select a picture that represents the original image.
- (2) By clicking on the "Load Blurred Image" we are able to select a picture that represents the observed image.
- (3) By clicking on the "Load Restored Image" we are able to select a picture that represents the restored image.
- (4) The Calculate ISNR button allows you to calculate the ISNR of the restored image.
- (5) The back button takes you to the main window of the application.
- (6) The exit button closes the application.

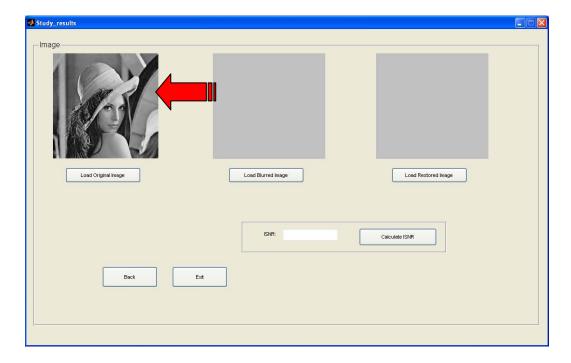
4.3.1. Loading the images

Image Restoration Software. Study Results Application

If we click on any of the Load buttons a window to select the image file will be opened.



If we select a file and click on the Open button, the selected image is shown.



4.3.2. Calculating the ISNR

Image Restoration Software. Study Results Application

Once the three images are loaded it is possible to calculate the ISNR using the following calculation:

$$ISNR = 10 \log_{10}(\frac{\sum_{l=1}^{N} \sum_{j=1}^{M} (l(t_{r}j) - l)^{2}}{\sum_{l=1}^{N} \sum_{j=1}^{M} (r_{RMS})^{2}})$$

Where I stands for the original image, \overline{I} is the average of the image I and stands for the root mean square error.

The next step is to click on the "calculate ISNR" to visualize the numeric value. The state of the window after this is shown in the next picture:



5. Example of Use

To represent the functionality of the software, we present here an example of use: First of all we degrade an image using the BlurAndNoise application:



Then we convolve the image with a Gaussian Blur with variance 5 and size 25:

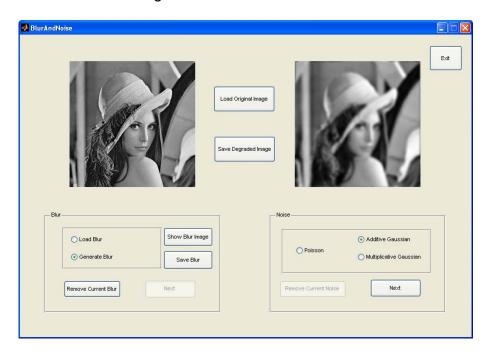
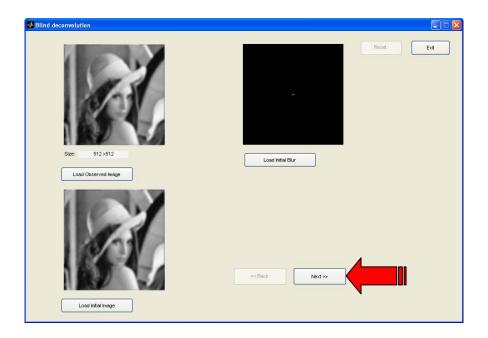


Image Restoration Software. Example of Use

Then we add additive Gaussian noise with variance 4 and save the degraded image and the blur. Now we start the Blind Deconvolution application and load the degraded image we have just created:



We can keep the default initial blur and image given by the program. Now we click on "Next" button and proceed to set the parameters for example the number of iterations equal to 3 and for the rest of parameters we use the default options. In the advanced options we set the PSF support to automatic:

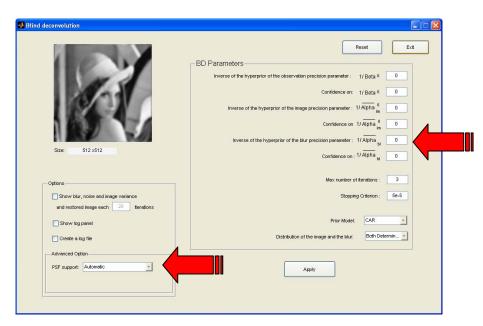
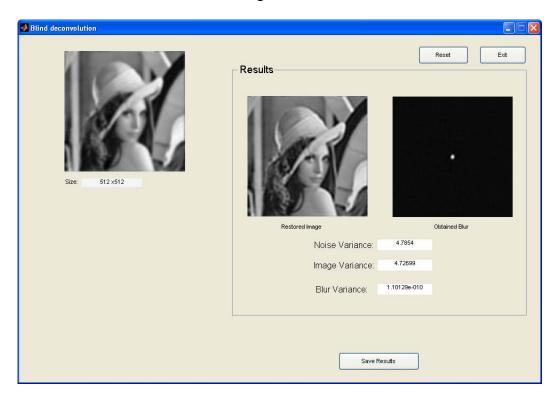


Image Restoration Software. Example of Use

Now we press Apply and start the Blind Deconvolution process. At the end of the restoration, we see the following screen:



Finally we analyze the restored image and the estimated psf using the third application "Study Results". We start by visualizing the blur images:

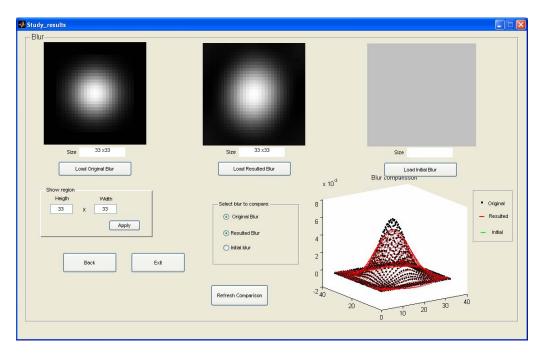
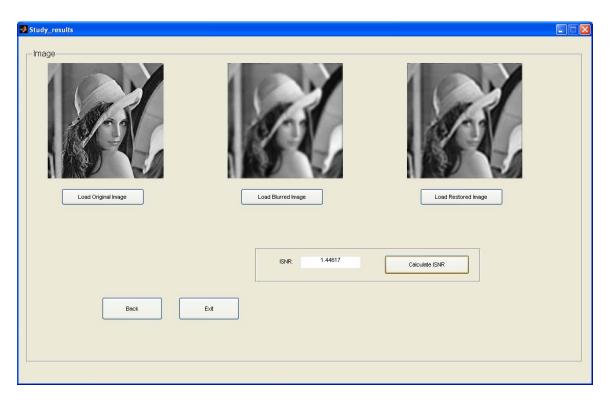


Image Restoration Software. Example of Use

Now, and just to finish, we can calculate the ISNR by pressing the "Calculate ISNR" button:



We can see that we have obtained an ISNR of 1.446.

Image Restoration Software. Authors of this Document

6. Authors of this Document

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7 Image Restoration Software. Bibliography

8. Bibliography

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