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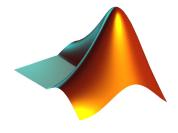
http://dmery.ing.puc.cl/index.php/balu/

# **Tutorial: Toolbox Balu**

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# **Toolbox Balu**



More than 200 functions for image processing, feature extraction, feature transformation, feature analysis, feature selection, data selection and generation, classification, clustering, performance evaluation, multiple-view analysis, image sequence processing and tracking with geometrical constraints, see examples.

http://dmery.ing.puc.cl/index.php/balu/

# Collaboration

Many improvements and codes were developed by:

Sandipan Banerjee

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If you want to collaborate please send me an e-mail

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#### NOTES:

Certain Balu functions use commands of the followings toolboxes: <u>VLFeat, Image Processing, Bioinformatics, and Neural Netowrks</u>. It is necessary to install this toolboxes if you want to use these Balu functions.

Certain neural network functions were implemented based on <u>NetLab Toolbox</u>: (c) 1996-2001, Ian T. Nabney, All rights reserved. <u>Nabney, I.T.</u> (2003): Netlab: Algorithms for Pattern Recognition, Advances in Pattern Recognition, Springer.

Certain Local Binary Patterns functions were implemented based on code written by Heikkila & Ahonen (see <a href="http://www.cse.oulu.fi/MVG/Research/LBP">http://www.cse.oulu.fi/MVG/Research/LBP</a>) all rights reserved.

Partial Least Squares Regression was implemented based on code developed by Gelady (see <a href="http://www.cdpcenter.org/files/plsr">http://www.cdpcenter.org/files/plsr</a>).

### **Welcome to Balu Toolbox Matlab**

for computer vision, pattern recognition and image processing...



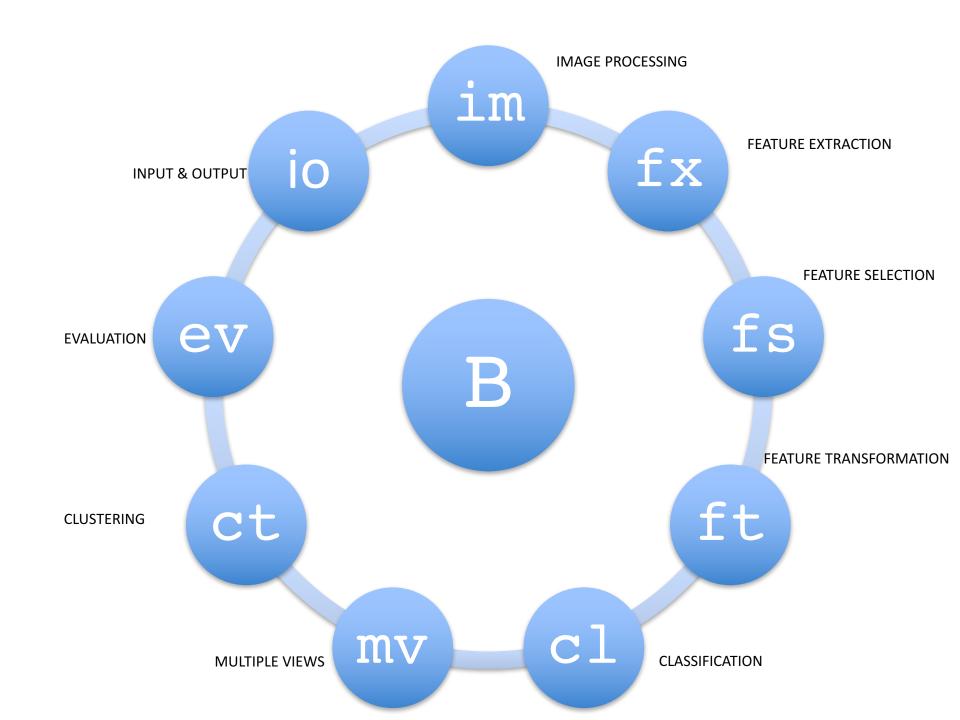
**Balu:** Kid, I only got so much room up in this noggin... and it's fillin' up fast!

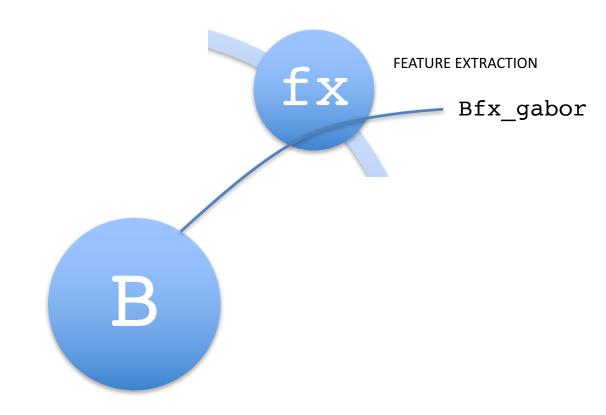
Mowgli: You just don't understand.

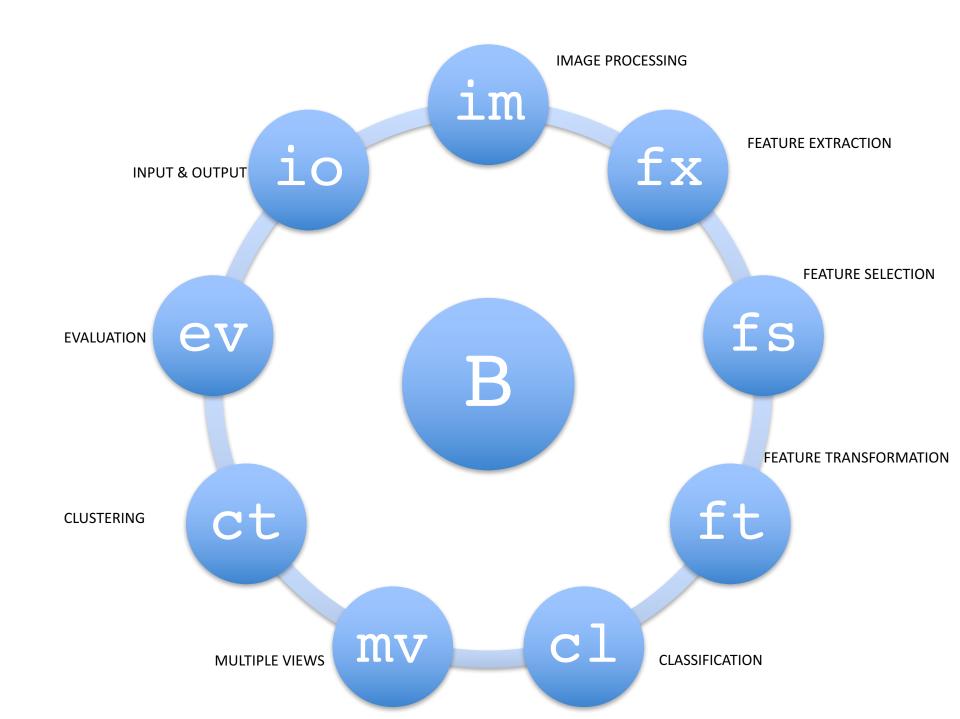
Balu: All right. How's about layin' it out for me.

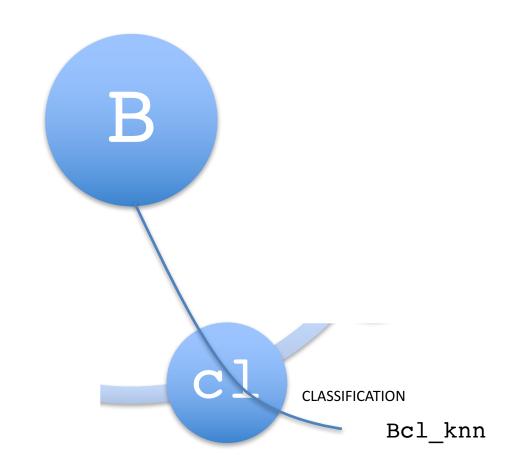
Balu could understand if Mowgli would explain and tell everything he knows... In this way, if we could extract a lot of features of an object we could recognize what the object is. This is the idea of this Toolbox!

Balu is the bear of The Jungle Book. He is the best friend of Mowgli. The story was written by Rudyard Kipling in 1894. Later in 1967, Disney produced a wonderful film

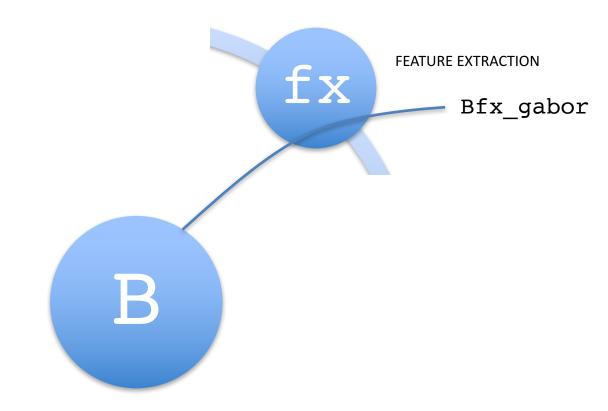


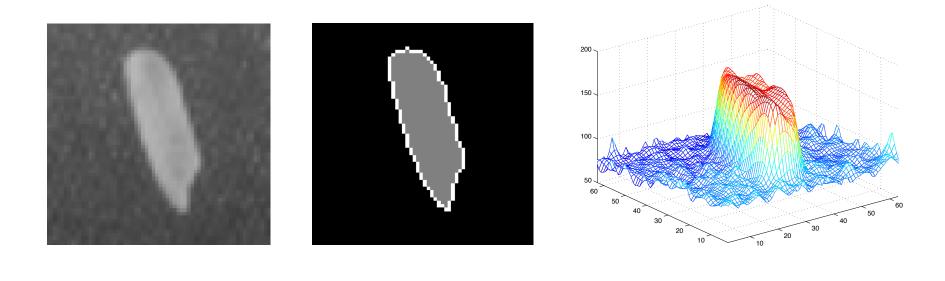






# **Feature Extraction**





There are two categories of features: Geometric Features and Intensity Features

b) Segmentation

a) Grayscale image

Geometric Features give information about location, orientation, shape and size. Intensity Features give information about how are the grayvalues.

c) 3D representation of a)

# How to extract Geometric Features with Balu

### Command:

```
[X,Xn] = Bfx_name(R,options);
```

X: row vector of extracted features

Xn: name of each extracted feature

name: name of the group of features

R: binary image

options: options of features (if any)

### Example: BASIC GEOMETRIC FEATURES

```
R = I>120;
[X,Xn] = Bfx_basicgeo(R);
Bio printfeatures(X,Xn);
```

I = imread('onerice.bmp');

```
1 center of grav i [px]
                             29.299832
                            33.705193
2 center of grav j [px]
 3 Height [px]
                            47.000000
 4 Width [px]
                             22.000000
 5 Area [px]
                            601.375000
 6 Perimeter [px]
                            107.500000
 7 Roundness
                             0.653941
 8 Danielsson factor
                             2.253736
                            1.000000
 9 Euler Number
10 Equivalent Diameter [px] 27.570347
11 MajorAxisLength [px]
                            48.089929
12 MinorAxisLength [px]
                            16.112265
13 Orientation [grad]
                             -73.896848
14 Solidity
                            0.937206
15 Extent
                            0.577369
16 Eccentricity
                            0.942202
17 Convex Area [px]
                             637.000000
18 Filled Area [px]
                             597.000000
```

### Example: HU MOMENTS

```
I = imread('onerice.bmp');
R = I > 120;
                                          1 Hu-moment 1
                                                                 0.269010
                                          2 Hu-moment 2
                                                                 0.046196
[X,Xn] = Bfx_hugeo(R);
                                          3 Hu-moment 3
                                                                 0.000291
Bio_printfeatures(X,Xn);
                                          4 Hu-moment 4
                                                                 0.000081
                                          5 Hu-moment 5
                                                                 0.000000
                                          6 Hu-moment 6
                                                                 0.000013
                                          7 Hu-moment 7
                                                                 0.000000
```

### Example: ELLIPSE

```
I = imread('onerice.bmp');
R = I > 120;
                                           1 Ellipse-centre i [px]
                                                                   33.691981
                                           2 Ellipse-centre j [px]
                                                                   28.915583
[X,Xn] = Bfx_fitellipse(R);
                                           3 Ellipse-minor ax [px]
                                                                   7.380073
Bio_printfeatures(X,Xn);
                                           4 Ellipse-major ax [px]
                                                                   24.353387
                                           5 Ellipse-orient [rad]
                                                                   -0.295048
                                           6 Ellipse-eccentricity
                                                                   0.303041
                                           7 Ellipse-area [px]
                                                                   564.637741
```

### Example: SEVERAL GEOMETRIC FEATURES

```
% Input Image
I = imread('rice.png');
% Segmentation
[R,m] = Bim segmowgli(I,ones(size(I)),40,1.5);
% Definition of features to be extracted
b(1).name = 'hugeo'; b(1).options.show=1; % Hu moments
b(2).name = 'basicgeo'; b(2).options.show=1; % basic geometric fetaures
options.b = b;
% Feature extraction
[X,Xn] = Bfx geo(R,options);
% Processing after feature extraction
figure; hist(X(:,12));xlabel([Xn(12,:)])
                                                  % area histogram
ii = find(abs(X(:,20))<15);
                                                  % rice orientation
K = zeros(size(R));
                                                  % between -15 and 15 grad
for i=1:length(ii);K=or(K,R==ii(i));end
figure; imshow(K);title('abs(orientation)<15 grad')</pre>
```







### Example: HOW TO WRITE A NEW BALU FUNCTION (for feature extraction)

```
% [X,Xn] = Bfx centroid(R,options)
% Toolbox: Balu
옹
     Centroid of a region.
용
용
     options.show
                     = 1 display mesagges.
      X(1) is centroid-i, X(2) is centroid-j
       Xn is the list of the n feature names.
    Example (Centroid of a region)
       I = imread('testimg1.jpg');
                                       % input image
용
      R = Bim segbalu(I);
                                       % segmentation
      imshow(R);
      options.show = 1;
       [X,Xn] = Bfx centroid(R,options);
용
       Bio printfeatures (X, Xn)
function [X,Xn] = Bfx centroid(R,options)
if options.show == 1
    disp('--- extracting centroid...');
[Ireg, Jreg] = find(R==1);
                                    % pixels in the region
ic = mean(Ireg);
jc = mean(Jreg);
X = [ic jc];
Xn = [ 'Centroid i
       'Centroid j
                                '1; % 24 characters per name
if options.show == 1
    clf
    imshow(R)
   hold on
   plot(X(2),X(1),'rx')
    enterpause
end
```

This example show how to compute the centers of mass

# How to extract Intensity Features with Balu

### Command:

```
[X,Xn] = Bfx_name(I,R,options);
```

X: row vector of extracted features

Xn: name of each extracted feature

name: name of the group of features

I: grayscale image

R: binary image -> [ ] for the whole image

options: options of features (if any)

### Example: BASIC INTENSITY FEATURES

```
I = imread('onerice.bmp');
R = I>120;

options.mask = 5; % Gauss mask
options.show = 1; % Display results
[X,Xn] = Bfx_basicint(I,R,options);
Bio_printfeatures(X,Xn);
```

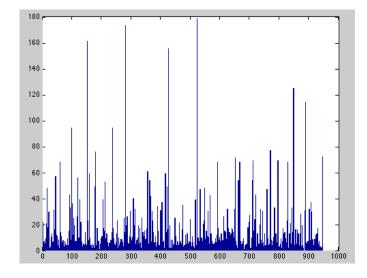


1 Intensity Mean	161.132328
2 Intensity StdDev	13.082633
3 Intensity Kurtosis	4.044382
4 Intensity Skewness	-1.096439
5 Mean Laplacian	-6.871022
6 Mean Boundary Gradient	41.875637

### Example: LBP

```
I = imread('face0304.bmp');
I = imresize(I,[110 90]);
options.vdiv = 4;
options.hdiv = 4;
options.samples = 8;
options.mappingtype = 'u2';
[X,Xn] = Bfx_lbp(I,[],options);
bar(X)
```





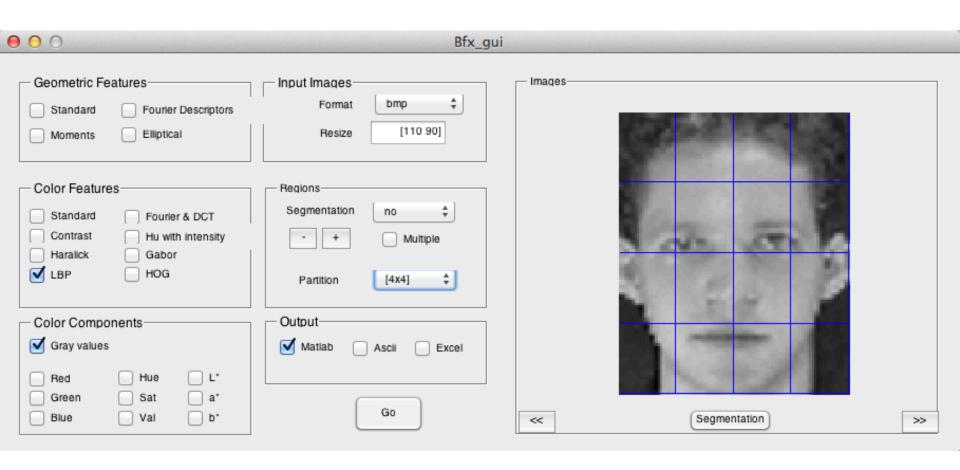
Example: SEVERAL INTENSITY FEATURES

See help Bfx\_int

# Graphic User Interface Bfx\_gui

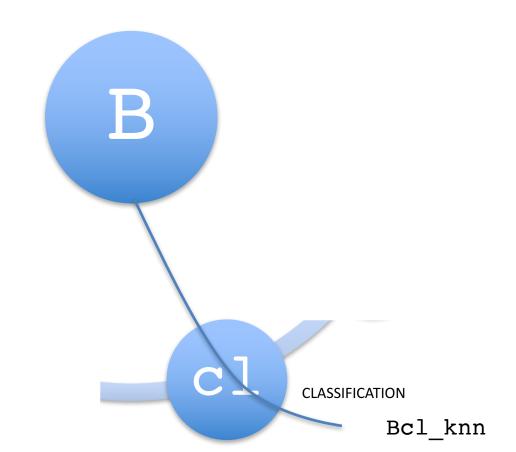
It is used to extract features in many image

- 1. go to the folder of the images
- 2. Bfx\_gui <Enter>



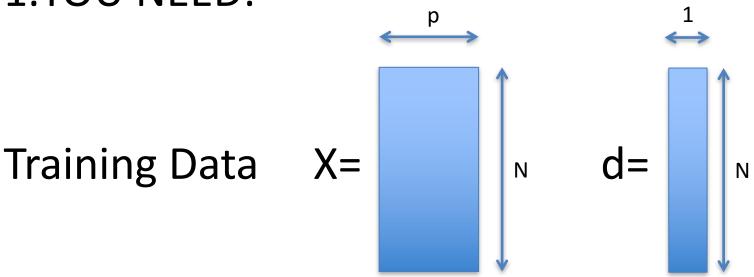
Press go, drink a coffee and wait!
The results will be stored in file Bfx\_results.mat

# Classification



# How to use the classifiers of Balu

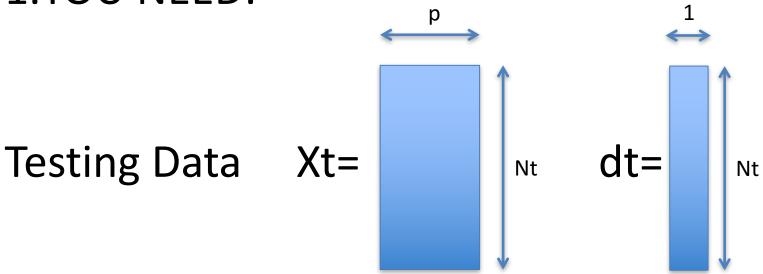
### 1.YOU NEED:



X: N samples, each sample is a vector of p features

d: Labels, annotations (class for each sample)

### 1.YOU NEED:



Xt: Nt samples (of p features)

dt: Nt Labels, annotations

### 1.YOU NEED:

### Classifier:

- Name of the classifier (KNN, LDA, SVM...)
- Options of the classifiers (k for KNN, kernel for SVM, etc...)

# 2. SYNTAX (Training & Testing)

ds = Bcl\_name(X,d,Xt,options)

# Example 1:

```
% KNN with k = 5
options.k = 5;
ds = Bcl_knn(X,d,Xt,options);
```

# Example 2:

```
% LDA with p = (1/4 3/4);
options.p = [0.25 0.75];
ds = Bcl_lda(X,d,Xt,options);
```

ds is a Nt x 1 vector with the classification of each testing sample. To compute the performance:

```
p = Bev_performance(ds,dt);
```

# 3. SYNTAX (Training only)

# op = Bcl\_name(X,d,options)

All parameters of the classifier that were estimated

# Example 1:

```
% KNN with k = 5
options.k = 5;
op = Bcl_knn(X,d,options);
```

# Example 2:

```
% LDA with p = (1/4 3/4);
options.p = [0.25 0.75];
op = Bcl_lda(X,d, options);
```

# 4. SYNTAX (Testing only)

You need the parameters 'op' computed in last step.

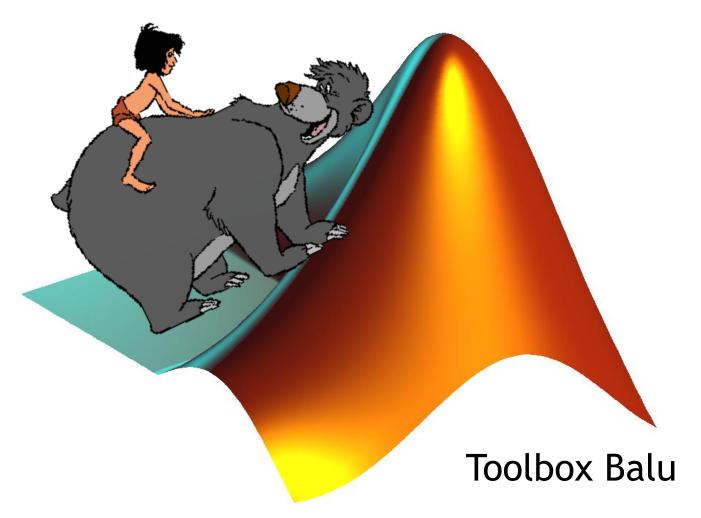
```
ds = Bcl_name(Xt,op)
```

# Example 1:

```
% KNN with k = 5
ds = Bcl_knn(Xt,op);
```

# Example 2:

```
% LDA with p = (1/4 3/4);
op = Bcl_lda(Xt,op);
```



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