## Contents

1	$\mathbf{U}\mathbf{se}$	er documentation	3		
	1.1	blockmatching	3		
		1.1.1 Basic use	3		
		1.1.2 Options and parameters (general informations)	3		
		1.1.3 Transformation estimation	4		
		1.1.4 Vector field transformations	4		
		1.1.5 Initial transformations	4		
		1.1.6 Result transformation	5		
	1.2	blockmatching versus baladin	5		
	1.3	applyTrsf	6		
	1.4	composeTrsf	7		
	1.5	copyTrsf	8		
	1.6	createGrid	8		
	1.7	cropImage	9		
	1.8	invTrsf	10		
	1.9	printTrsf	10		
2	Developper documentation / Notes 11				
	2.1	Frame conversion: $real \leftrightarrow voxel \dots \dots \dots \dots$	11		
		2.1.1 Image	11		
		2.1.2 Transformations	11		
		2.1.3 Linear transformations	12		
		2.1.4 Vector fields	12		
	2.2	blockmatching versus baladin	12		
		2.2.1 Blocks management	12		
3	Mis	oc	14		
	3.1	Blocs	14		
		3.1.1 Définition des blocs	14		
	3.2	Recalage	15		
		3.2.1 Transformation initiale	15		
		3.2.2 Boucle de recalage	15		
	3.3	Transformations	15		
	3.4	Passage d'une transformation "réelle" en "voxels"	15		

		3.4.1 Passage d'un référentiel voxel à un référentiel réel 1
		3.4.2 Transformation linéaire
		3.4.3 Transformation non-linéaire
	3.5	Calcul d'une transformation aux moindres carres
		3.5.1 Rappels
		3.5.2 Translation + scaling
4	Mis	sc 1
	4.1	Notes
		4.1.1 Block_Matching()
		4.1.2 Pyramidal block matching
	4.2	Pyramidal_Block_Matching()
	4.3	Block_Matching()
	4.4	Fonctions
		4.4.1 ChangeGeometryTransformation(), transformation.h 2
	4.5	Notes

### User documentation

### 1.1 blockmatching

#### 1.1.1 Basic use

blockmatching registers a floating image  $I_{flo}$  onto a reference image  $I_{ref}$ , and yields two results: the transformation from the reference image frame towards the floating image frame,  $T_{res} = T_{I_{flo} \leftarrow I_{ref}}$ , and the floating image resampled in the same frame than the reference image,  $I_{res} = I_{flo} \circ T_{I_{flo} \leftarrow I_{ref}}$ .

% blockmatching -flo  $I_{flo}$  -ref  $I_{ref}$  -res  $I_{res}$  -res-trsf  $T_{res}$  ...

 $T_{res} = T_{I_{flo} \leftarrow I_{ref}}$  allows to resample  $I_{flo}$ , or any image defined in the same frame than  $I_{flo}$ , into the same frame than  $I_{ref}$ , which can also be done afterwards with applyTrsf.

% applyTrsf  $I_{flo}\ I_{res}$  -trsf  $T_{res}$  -template  $I_{ref}$ 

For instance, this allows to *visualize* the deformation undergone by  $I_{flo}$  by applying the transformation to a grid image (see createGrid).

### 1.1.2 Options and parameters (general informations)

Running the program without any options gives the minimal syntax:

% blockmatching

Running it with either '-h' or '--h' gives the option list:

% blockmatching -h

Running it with either '-help' or '--help' gives some details about the options:

### % blockmatching -help

[PAY ATTENTION] Default parameters depend on the transformation type (linear or non-linear). The '-print-parameters' allows printing the values of the parameters, so running blockmatching with this option along with the chosen type of transformation (with '-trsf-type') may be a good idea.

% blockmatching ... -print-parameters ...

If a logfile name is given (with option '-logfile'), parameter values will be printed out in this file.

### 1.1.3 Transformation estimation

The principle of **blockmatching** is to pair blocks from the floating image  $I_{flo}$  with blocks of the reference image  $I_{ref}$ , i.e. for each blocks in the floating image  $I_{flo}$ , we are looking in a neighborhood of the reference image  $I_{ref}$  for the best similar block.

### 1.1.4 Vector field transformations

#### 1.1.5 Initial transformations

There are two (not exclusive) ways to specify an initial transformation. These two ways of instanciating an initial transformation are related to the way the result transformation is calculated:

 $T_{init}$  and  $T_0$  are respectively initialized by '-initial-transformation' and '-initial-result-transformation', but  $T_{init}$  will remain unchanged during the computation while  $T_0$  will be iteratively updated.

• the option '-initial-[voxel-]transformation' is used to specify a transformation  $T_{init}$  that is applied to the floating image  $I_{flo}$ . Therefore, it comes to register  $I_{flo} \circ T_{init}$  with  $I_{ref}$ . In other words, the transformation  $T_{res}$  obtained with

% blockmatching -flo  $I_{flo}$  -ref  $I_{ref}$  ... -initial-transformation  $T_{init}$  -res-trsf  $T_{res}$ 

is comparable to the one,  $T_{res,2}$  obtained with the following commands

- % applyTrsf  $I_{flo}$   $I_{flo,2}$  -trsf  $T_{init}$
- % blockmatching -flo  $I_{flo,2}$  -ref  $I_{ref}$  ... -res-trsf  $T_{intermediary}$
- % composeTrsf -res  $T_{res,2}$  -trsfs  $T_{init}$   $T_{intermediary}$

<sup>&</sup>lt;sup>1</sup>should be equal, but due to resampling effect, differences can occur.

• the option '-initial-result-[voxel-]transformation' is used to specify the initial value of the transformation to be computed. This can be used to continue a registration done at the higher scale.

For instance, the result transformation  $T_{res}$  computed in one shot by

```
% blockmatching -flo I_{flo} -ref I_{ref} ... -res-trsf T_{res} -py-11 0 -py-h1 3
```

is equal to the result transformation  $T_{res,2}$  that is computed in two step (the first step uses the scales 3 and 2, while the second one uses the scales 1 and 0).

```
% blockmatching -flo I_{flo} -ref I_{ref} ... -res-trsf T_{intermediary} -py-ll 2 -py-hl 3
```

```
% blockmatching -flo I_{flo} -ref I_{ref} ... -init-res-trsf T_{intermediary} -res-trsf T_{res,2} -py-ll 0 -py-hl 1
```

This may allow to qualitatively evaluate the intermediary result before running the algorithm at the lower scales that are computationally expensive.

[Note] This can somewhow be viewed as registering  $I_{flo}$  with  $I_{ref} \circ T_0^{-1}$ , but with blocks that would not be square but deformed by  $T_0^{-1}$ .

#### 1.1.6 Result transformation

'-result-[voxel-] transformation' is used to specify the name of the output transformation  $T_{res} = \circ T_{I_{flo} \leftarrow I_{ref}}$  that allows to resample  $I_{flo}$  onto  $I_{ref}$ . When initial transformations are given, they are "included" in the result transformation (see Eq. 1.1).

### 1.2 blockmatching versus baladin

A typical call to blockmatching is

```
% blockmatching -flo I_{flo} -ref I_{ref} -res I_{block} -res-trsf T_{block} -res-voxel-trsf \hat{T}_{block} ...
```

where  $I_{block}$ ,  $T_{block}$ , and  $T_{block}$  denote respectively the result image, i.e. the floating image resampled in the frame of  $I_{ref}$ , the transformation result in real coordinates that allows to goes from  $I_{ref}$  frame towards  $I_{flo}$  frame (and then to resample  $I_{flo}$  in the frame of  $I_{ref}$ ), and the transformation result in voxel coordinates.

A typical call to baladin is

```
% baladin -flo I_{flo} -ref I_{ref} -res I_{balad} -result-matrix \hat{T}_{balad} -result-real-matrix T_{balad} ...
```

where  $I_{balad}$ ,  $T_{balad}$ , and  $\hat{T}_{balad}$  denote respectively the result image, i.e. the floating image resampled in the frame of  $I_{ref}$ , the transformation result in real

coordinates that allows to goes from  $I_{flo}$  frame towards  $I_{ref}$  frame, and the transformation result in voxel coordinates.

[PAY ATTENTION] The result transformation of baladin is then the inverse of that of blockmatching. We have

$$T_{block} \sim T_{balad}^{-1}$$
 and  $\hat{T}_{block} \sim \hat{T}_{balad}^{-1}$ 

Therefore  $T_{block} \circ T_{balad}$  and  $\hat{T}_{block} \circ \hat{T}_{balad}$  should be close to the identity, and this can be verified by computing  $T_{test} = T_{block} \circ T_{balad}$  and  $\hat{T}_{test} = \hat{T}_{block} \circ \hat{T}_{balad}$ :

```
% composeTrsf -res T_{test} -trsfs T_{block} T_{balad} % printTrsf T_{test} % composeTrsf -res \hat{T}_{test} -trsfs \hat{T}_{block} \hat{T}_{balad} % printTrsf \hat{T}_{test}
```

The transformations issued from baladin can be used to resample the floating image  $I_{flo}$  but require to be inverted beforehand. To compute the resampled floating image  $I_{balad}$  from the real transformation  $T_{balad}$ , the commands are:

```
% invTrsf T_{balad} T_{balad}^{-1} % applyTrsf I_{flo} I_{balad} -template I_{ref} -trsf T_{balad}^{-1}
```

 $I_{balad}$  can also be computed from from the *voxel* transformation  $\hat{T}_{balad}$  accordingly

```
% invTrsf \hat{T}_{balad} \hat{T}_{balad}^{-1} % applyTrsf I_{flo} I_{balad} -template I_{ref} -voxel-trsf \hat{T}_{balad}^{-1}
```

### 1.3 applyTrsf

applyTrsf allows to resample an image according to a transformation T. One has to recall that the transformation goes from the  $destination/result\ image$  towards the  $image\ to\ be\ resampled$ . This is counter-intuitive, but can easily be explained: to compute the value of the point M in the destination/result image, one has to know where this point comes from in the image to be resampled.

So, to resample the image  $I_{flo}$  in the same frame than the image  $I_{ref}$  with a transformation that T goes from  $I_{ref}$  towards  $I_{flo}$ , i.e.

$$\begin{array}{rcl} T & = & T_{I_{flo} \leftarrow I_{ref}} \\ I_{res} & = & I_{flo} \circ T \end{array}$$

the command is

% applyTrsf  $I_{flo}\ I_{res}$  -trsf T -template  $I_{ref}$ 

The '-trsf' implies that the transformation is in real frames (i.e. the coordinates of the points are in real units, for instance millimeters). We recall that to a voxel point  $M_{\mathbb{Z}}=(i,j,k)$  is associated a real point  $M_{\mathbb{R}}=(x,y,z)$  through a conversion matrix  $H_{I,\mathbb{R}\leftarrow\mathbb{Z}}$  (typically a diagonal matrix containing the voxel sizes along each direction).

The '-voxel-trsf' allows to specify the transformation in voxel frames. The transformation in the voxel frames,  $T_{I_{flo} \leftarrow I_{ref}, \mathbb{Z}}$  is obtained from the transformation in the real frames,  $T_{I_{flo} \leftarrow I_{ref}, \mathbb{R}}$ , by multiplying it by the conversion matrices:

$$T_{I_{flo} \leftarrow I_{ref}, \mathbb{Z}} = H^{-1}_{I_{flo}, \mathbb{R} \leftarrow \mathbb{Z}} \circ T_{I_{flo} \leftarrow I_{ref}, \mathbb{R}} \circ H_{I_{ref}, \mathbb{R} \leftarrow \mathbb{Z}}$$

Conversely,

$$T_{I_{flo} \leftarrow I_{ref}, \mathbb{R}} = H_{I_{flo}, \mathbb{R} \leftarrow \mathbb{Z}} \circ T_{I_{flo} \leftarrow I_{ref}, \mathbb{Z}} \circ H^{-1}_{I_{ref}, \mathbb{R} \leftarrow \mathbb{Z}}$$

### 1.4 composeTrsf

composeTrsf allows to compose a series of transformations. The transformations to be composed are introduced by the '-trsfs' option:

% composeTrsf 
$$\dots$$
 -res  $T_{res}$  -trsfs  $T_1$   $T_2$   $\dots$   $T_N$ 

Transformations are composed in the order they are given. The line '-trsfs  $T_1$   $T_2$  ...  $T_N$ ' assumes that the transformation  $T_i$  goes from image  $I_{i+1}$  to image  $I_i$  (then allows to resample  $I_i$  in the same frame than  $I_{i+1}$ ), i.e.

$$T_i = T_{I_i \leftarrow I_{i+1}}$$

The resulting transformation will goes from  $I_{N+1}$  to  $I_1$  (then allows to resample  $I_1$  in the same frame than  $I_{N+1}$ ). Thus

% composeTrsf  $\dots$  -res  $T_{res}$  -trsfs  $T_1$   $T_2$   $\dots$   $T_N$  computes

$$\begin{array}{lcl} T_{res} & = & T_1 \circ T_2 \circ \dots \circ T_N \\ & = & T_{I_1 \leftarrow I_2} \circ T_{I_2 \leftarrow I_3} \circ \dots \circ T_{I_N \leftarrow I_{N+1}} \\ & = & T_{I_1 \leftarrow I_{N+1}} \end{array}$$

**Example:** the following series of resampling

% applyTrsf  $I_0$   $I_1$  -trsf  $T_0$  ...

% applyTrsf  $I_1$   $I_2$  -trsf  $T_1$  ...

% applyTrsf  $I_2$   $I_3$  -trsf  $T_2$  ...

is equivalent to the transformation composition

% composeTrsf -res  $T_{I_0 \leftarrow I_3}$  -trsfs  $T_0$   $T_1$   $T_2$ 

that allows to get  $I_3$  directly from  $I_0$ 

% applyTrsf  $I_0$   $I_3$  -trsf  $T_{I_0\leftarrow I_3}$  ...

### 1.5 copyTrsf

copyTrsf allows to copy a transformation from one type to an other or/and to convert it from *real units* to *voxel units* or conversely.

The command

```
% blockmatching -flo I_{flo} -ref I_{ref} -res I_{res} -res-trsf T_{res,\mathbb{R}} -res-voxel-trsf T_{res,\mathbb{Z}} ...
```

allows to register the image  $I_{flo}$  onto  $I_{ref}$  and computes the transformation  $T_{res,\mathbb{R}}$  (in real units) that allows to resample  $I_{flo}$  in the same frame tham  $I_{ref}$ , the transformation  $T_{res,\mathbb{Z}}$  being  $T_{res,\mathbb{R}}$  expressed in voxel units).

The conversion from real to voxel units can also be achieved by

% copyTrsf  $T_{res,\mathbb{R}}$   $T_{res,\mathbb{Z}}$  -floating  $I_{flo}$  -template  $I_{ref}$  -input-unit real -output-unit voxel

while the conversion from voxel to real units can also be achieved by

% copyTrsf  $T_{res,\mathbb{Z}}$   $T_{res,\mathbb{R}}$  -floating  $I_{flo}$  -template  $I_{ref}$  -input-unit voxel -output-unit real

copyTrsf can also be used to copy a linear transformation  $T_{linear}$ , expressed as a matrice, in a vector field,  $T_{vector}$ . It is mandatory to provide a template image that defines the geometry of the vector field (which is nothing but a vectorial image).

% copyTrsf  $T_{linear}$   $T_{vector}$  -template  $I_{ref}$  -trsf-type vectorfield[2D,3D]

### 1.6 createGrid

createGrid creates an image containing a grid, which can be useful to "visualize" transformations or deformations.

Example: the following registration has been ran

% blockmatching -flo  $I_{flo}$  -ref  $I_{ref}$  ... -res-trsf  $T_{res}$  -res  $I_{res}$ 

One can create a grid image having the same geometry than  $I_{flo}$  (thanks to '-template  $I_{flo}$ ')

% createGrid  $I_{grid}$  -template  $I_{flo}$ 

and use  $T_{res}$  to resample this grid image into the geometry of  $I_{ref}$  (thanks to '-template  $I_{ref}$ ')

% applyTrsf  $I_{grid}$   $I_{resampled\_grid}$  -trsf  $T_{res}$  -template  $I_{ref}$ 

 $I_{resampled\_grid}$  exhibits the same transformation/deformation with respect to  $I_{grid}$  than  $I_{res}$  with respect to  $I_{flo}$ .

### 1.7 cropImage

cropImage allows to crop an image. As a side result, it can also write the transformation "summarizing" the crop.

**Example:** the following command crops, from  $I_{ref}$ , a subvolume  $J_{ref}$  of dimensions [100, 90, 80] from the point (25, 35, 45) [by convention, the default origin is (0,0,0)].

% cropImage  $I_{ref}$   $J_{ref}$  -origin 25 35 45 -dim 100 90 80 -res-trsf  $C_{ref}$  The transformation  $C_{ref}$  defines the "crop" operation as a transformation, i.e.  $J_{ref} = I_{ref} \circ C_{ref}$ , this the same "crop" can also be done by

% applyTrsf  $I_{ref}$   $J_{ref}$  -trsf  $C_{ref}$  -dim 100 90 80 -voxel  $\dots$ 

according one specifies the correct voxel sizes. In other words, we have

$$J_{ref} = I_{ref} \circ C_{ref}$$

This allows to compute a registration transformation from subvolumes, and then to estimate the transformation for the whole volumes.

1. The commands

% cropImage  $I_{ref}$   $J_{ref}$  ... -res-trsf  $C_{ref}$  % cropImage  $I_{flo}$   $J_{flo}$  ... -res-trsf  $C_{flo}$  generates the subvolumes  $J_{ref} = I_{ref} \circ C_{ref}$  and  $J_{flo} = I_{flo} \circ C_{flo}$  together with the crop transformations  $C_{ref}$  and  $C_{flo}$ .

2. The cropped images are co-registered, i.e.  $J_{flo}$  can be registered onto  $J_{ref}$  with

% blockmatching -flo  $J_{flo}$  -ref  $J_{ref}$  -res  $J_{res}$  -res-trsf  ${T'}_{res}$   $\dots$ 

3. The resampling of the cropped image  $J_{flo}$  into  $J_{res}$  with  $T'_{res}$  can cause some zeroed areas appearing at the  $J_{res}$  image border. Since we have

$$J_{res} = J_{flo} \circ T'_{res}$$
$$= I_{flo} \circ C_{flo} \circ T'_{res}$$

this effect can be reduced by resampling  $I_{flo}$  into  $J_{res}$  with the transformation  $C_{flo} \circ T'_{res}$ 

% composeTrsf -res  $T''_{res}$  -trsfs  $C_{flo}$   $T'_{res}$ % applyTrsf  $I_{flo}$   $J_{res}$  -trsf  $T''_{res}$  -template  $J_{ref}$ 

### 4. Last, we also have

$$\begin{split} J_{res} &= J_{flo} \circ T'_{res} &\sim J_{ref} \\ I_{flo} \circ C_{flo} \circ T'_{res} &\sim I_{ref} \circ C_{ref} \\ I_{flo} \circ C_{flo} \circ T'_{res} \circ C_{ref}^{-1} &\sim I_{ref} \end{split}$$

thus  $T_{res} = C_{flo} \circ T'_{res} \circ C_{ref}^{-1}$  allows to resample  $I_{flo}$  onto  $I_{ref}$ , with a transformation  $T'_{res}$  computed by the co-registration of the cropped images  $J_{flo}$  and  $J_{ref}$ .

- % invTrsf  $C_{ref}$   $C_{ref}^{-1}$  % composeTrsf -res  $T_{res}$  -trsfs  $C_{flo}$   $T'_{res}$   $C_{ref}^{-1}$ % applyTrsf  $I_{flo}$   $I_{res}$  -trsf  $T_{res}$  -template  $I_{ref}$
- 1.8 invTrsf
- 1.9 printTrsf

# Developper documentation / Notes

### 2.1 Frame conversion: $real \leftrightarrow voxel$

### 2.1.1 Image

Every image I is associated with a conversion matrix. Basically, it is simply a diagonal matrix with the voxel sizes (or their inverses) along the diagonal. Let  $(v_x, v_y, v_z)$  be the voxel size of image I, thus a point  $M_{\mathbb{R}} = (x, y, z)$  in the real frame  $\mathbb{R}$  correspond to the voxel point  $M_{\mathbb{Z}} = (i, j, k)$  in the voxel frame  $\mathbb{Z}$  with

$$M_{\mathbb{R}} = H_{I,\mathbb{R} \leftarrow \mathbb{Z}} M_{\mathbb{Z}} \quad \text{with} \quad H_{I,\mathbb{R} \leftarrow \mathbb{Z}} = \left( egin{array}{ccc} v_x & . & . \\ . & v_y & . \\ . & . & v_z \end{array} 
ight)$$

Accordingly,

$$M_{\mathbb{Z}} = H_{I,\mathbb{Z} \leftarrow \mathbb{R}} M_{\mathbb{R}}$$
 with  $H_{I,\mathbb{Z} \leftarrow \mathbb{R}} = \begin{pmatrix} 1/v_x & . & . \\ . & 1/v_y & . \\ . & . & 1/v_z \end{pmatrix}$ 

Obviously, we have  $H_{I,\mathbb{Z}\leftarrow\mathbb{R}}=H_{I,\mathbb{R}\leftarrow\mathbb{Z}}^{-1}$ .

### 2.1.2 Transformations

We simply use the composition rules to express the voxel transformation from image  $I_{ref}$  to image  $I_{flo}$ ,  $T_{flo\leftarrow ref,\mathbb{Z}} = T_{flo_{\mathbb{Z}}\leftarrow ref_{\mathbb{Z}}}$  from the same transformation in the real frame,  $T_{flo\leftarrow ref,\mathbb{R}} = T_{flo_{\mathbb{R}}\leftarrow ref_{\mathbb{R}}}$ .

$$T_{flo \leftarrow ref, \mathbb{Z}} = H_{flo, \mathbb{Z} \leftarrow \mathbb{R}} \circ T_{flo \leftarrow ref, \mathbb{R}} \circ H_{ref, \mathbb{R} \leftarrow \mathbb{Z}}$$

Conversely,

$$T_{flo \leftarrow ref, \mathbb{R}} = H_{flo, \mathbb{R} \leftarrow \mathbb{Z}} \circ T_{flo \leftarrow ref, \mathbb{Z}} \circ H_{ref, \mathbb{Z} \leftarrow \mathbb{R}}$$

### 2.1.3 Linear transformations

The composition is quite trivial, since it only uses matrices multiplication.

#### 2.1.4 Vector fields

The transformation is encoded by a vector field  $\mathbf{V}$  that indicates the displacement at every point. For a transformation from image  $I_{ref}$  to image  $I_{flo}$ , this vector is defined on the same frame than  $I_{ref}$ . Thus the vector in *real* coordinates  $\mathbf{V}_{\mathbb{R}}$  at  $M_{\mathbb{R}}$  gives the displacement of the point  $M_{\mathbb{R}}$ .

However, since  $\mathbf{V}$  is defined over a discrete lattice, the vector image stores the vectors  $\mathbf{V}_{\mathbb{R}}(M_{\mathbb{Z}})$ , thus  $\mathbf{V}_{\mathbb{R}}$  at  $M_{\mathbb{R}}$  is  $\mathbf{V}_{\mathbb{R}}(H_{\mathbb{Z}\leftarrow\mathbb{R}}M_{\mathbb{R}})$ .

The transformation T from image  $I_{ref}$  to image  $I_{flo}$  is then defined by

$$\begin{split} M_{flo,\mathbb{R}} &= T(M_{ref,\mathbb{R}}) = M_{ref,\mathbb{R}} + \mathbf{V}_{\mathbb{R}}(H_{ref,\mathbb{Z} \leftarrow \mathbb{R}} M_{ref,\mathbb{R}}) \\ \Leftrightarrow & \mathbf{V}_{\mathbb{R}}(H_{ref,\mathbb{Z} \leftarrow \mathbb{R}} M_{ref,\mathbb{R}}) = M_{flo,\mathbb{R}} - M_{ref,\mathbb{R}} = T(M_{ref,\mathbb{R}}) - M_{ref,\mathbb{R}} \end{split}$$

When expressing this formula in the discrete lattice, it comes

$$\begin{array}{cccc} H_{flo,\mathbb{R}\leftarrow\mathbb{Z}}M_{flo,\mathbb{Z}} & = & H_{ref,\mathbb{R}\leftarrow\mathbb{Z}}M_{ref,\mathbb{Z}} + \mathbf{V}_{\mathbb{R}}(M_{ref,\mathbb{Z}}) \\ M_{flo,\mathbb{Z}} & = & H_{flo,\mathbb{R}\leftarrow\mathbb{Z}}^{-1} \circ H_{ref,\mathbb{R}\leftarrow\mathbb{Z}}M_{ref,\mathbb{Z}} + H_{flo,\mathbb{R}\leftarrow\mathbb{Z}}^{-1} \circ \mathbf{V}_{\mathbb{R}}(M_{ref,\mathbb{Z}}) \end{array}$$

The displacement in *voxel* coordinates  $V_{\mathbb{Z}}$  is then defined by

$$\begin{aligned} \mathbf{V}_{\mathbb{Z}}(M_{ref,\mathbb{Z}}) &= & M_{flo,\mathbb{Z}} - M_{ref,\mathbb{Z}} \\ &= & \left(H_{flo,\mathbb{R}\leftarrow\mathbb{Z}}^{-1} \circ H_{ref,\mathbb{R}\leftarrow\mathbb{Z}} - \mathbf{Id}\right) M_{ref,\mathbb{Z}} + H_{flo,\mathbb{R}\leftarrow\mathbb{Z}}^{-1} \circ \mathbf{V}_{\mathbb{R}}(M_{ref,\mathbb{Z}}) \end{aligned}$$

(where **Id** denotes the identity matrix) and may be different from a simple scaling of the vector field defined in *real* coordinates.

### 2.2 blockmatching versus baladin

### 2.2.1 Blocks management

There are two issues.

- The number of blocks calculated in the earlier versions of baladin was erroneous (and may yield an overflow).
- As a consequence, some blocks (that should have been considered) were discarded.
- the ordering of the blocks in the earlier versions of baladin was z varies first, then y and finally x, so that the index of a block is given by  $z + (y + x * dim_y) * dim_z$ .

This behavior can be mimicked with the define <code>\_ORIGINAL\_BALADIN\_BLOCKS\_MANAGEMENT\_</code> in the latest version of <code>baladin</code> (except for the overflow).

It seems that the indexing order is important (experiments have been conducted by changing the indexing, with the same blocks being discarded), since results may numerically differ. It can be suspected (but has not be proven) that it may change the "best" pairing, because of the scan order, when several blocks result in the same criteria value.

### Misc

### 3.1 Blocs

#### 3.1.1 Définition des blocs

La dimension d'une image est D (les coordonnées des points vont de 0 à D-1), on ne veut pas de blocs dans les  $\mathit{offset}_p$  premiers points, ni dans les  $\mathit{offset}_d$  derniers points. La dimension d'un bloc est B et les blocs sont espacés de S. On a donc

• coordonnée du premier point inclus dans le bloc  $i, i \ge 0$  :

$$x_0 = offset_n + i * S$$

Donc le point x est le premier point (origine) d'un bloc si

$$(x - offset_n)\%S = 0$$

(le reste de la division euclidienne est 0), et l'indice du bloc est alors

$$(x - offset_n)/S$$

ullet coordonnée du dernier point inclus dans le bloc i:

$$x_1 = \mathit{offset}_p + i * S + (B-1)$$

Pour qu'un bloc soit valide, il faut donc

$$\begin{aligned} \textit{offset}_p + i * S + (B-1) &\leq D - 1 - \textit{offset}_d &\iff i * S \leq D - 1 - \textit{offset}_d - B + 1 - \textit{offset}_p \\ i * S &\leq D - B - \textit{offset}_d - \textit{offset}_p \end{aligned}$$

Le dernier indice valide est donc

$$i_d = (D - B - offset_d - offset_p)/S$$

Comme les indices commencent à 0, il y a donc  $i_d + 1$  blocs avec

$$i_d + 1 = (D - B - offset_d - offset_p)/S + 1$$

### 3.2 Recalage

#### 3.2.1 Transformation initiale

Si une transformation initiale  $T_{init}$  est donnée, elle est utilisée pour une première transformation de l'image flottante. Typiquement, c'est la transformation résultat d'un premier recalage. Cela revient donc à recaler  $I_{flo} \circ T_{init}$  avec  $I_{ref}$ .

### 3.2.2 Boucle de recalage

Dans chaque boucle de recalage, à l'itération i, on cherche à recaler  $I^i_{flo} = I^0_{flo} \circ T^i$  avec  $T_{ref}$ , et on calcule  $\delta T^i = T_{I^i_{flo} \leftarrow I_{ref}}$ . On a donc

$$T^{i+1} = \delta T^i \circ T^i$$

S'il y a une transformation initiale, on a  $I_{flo}^0 = I_{flo} \circ T_{init}$ , donc la transformation pour rééchantillonner  $I_{flo}^i$  à partir de  $I_{flo}$  est  $T_{init} \circ T^i$ .

### 3.3 Transformations

### 3.4 Passage d'une transformation "réelle" en "voxels"

### 3.4.1 Passage d'un référentiel voxel à un référentiel réel

 $H_{ref_{\mathbb{R}}\leftarrow ref_{\mathbb{Z}}}$ : matrice diagonale des tailles de voxel, permet de passer d'un référentiel voxel à un référentiel réel

$$H_{ref_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}} = \left( \begin{array}{ccc} v_x & . & . \\ . & v_y & . \\ . & . & v_z \end{array} \right) \quad \text{et} \quad H_{ref_{\mathbb{Z}} \leftarrow ref_{\mathbb{R}}} = \left( \begin{array}{ccc} 1/v_x & . & . \\ . & 1/v_y & . \\ . & . & 1/v_z \end{array} \right)$$

où  $v_x$ ,  $v_y$  et  $v_z$  sont les dimensions du voxels selon les 3 directions. On a donc

$$(x, y, z)^t = H_{ref_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}(i, j, k)^t$$

### 3.4.2 Transformation linéaire

On passe de la transformation "réelle"  $T_{flo_{\mathbb{R}}\leftarrow ref_{\mathbb{R}}}$  à une transformation "voxels"  $T_{flo_{\mathbb{Z}}\leftarrow ref_{\mathbb{Z}}}$  par

$$T_{flo_{\mathbb{Z}} \leftarrow ref_{\mathbb{Z}}} = H_{flo_{\mathbb{Z}} \leftarrow flo_{\mathbb{R}}} \circ T_{flo_{\mathbb{R}} \leftarrow ref_{\mathbb{R}}} \circ H_{ref_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}$$

C'est la transformation qui permet, en pratique, de rééchantillonner l'image flo dans la géométrie de l'image ref.

### 3.4.3 Transformation non-linéaire

Elle est codée par une image de vecteurs  $\mathbf{V}_{flo_{\mathbb{R}}\leftarrow ref_{\mathbb{Z}}}$ , donc définie sur une image, a priori,  $I_{ref}$  pour pouvoir rééchantillonner l'image flottante dans la géométrie de l'image référence.

Ces vecteurs sont un déplacement dans le monde réel, qui indique de combien un voxel se déplace. La transformation dans le référentiel réel se définit donc par

$$T_{flo_{\mathbb{R}} \leftarrow ref_{\mathbb{R}}}(x, y, z) = (x, y, z) + \mathbf{V}_{flo_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}} \left( H_{ref_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}^{-1}(x, y, z) \right)$$

La transformation dans le référentiel voxel se définit donc par

$$T_{flo_{\mathbb{Z}} \leftarrow ref_{\mathbb{Z}}}(i,j,k) = H_{flo_{\mathbb{Z}} \leftarrow flo_{\mathbb{R}}}^{-1} \circ H_{ref_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}(i,j,k) + H_{flo_{\mathbb{Z}} \leftarrow flo_{\mathbb{R}}}^{-1} \mathbf{V}_{flo_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}(i,j,k)$$

# 3.5 Calcul d'une transformation aux moindres carres

### 3.5.1 Rappels

$$\sum_{i} (x_{i} - \bar{x})^{2} = \sum_{i} (x_{i}^{2} - 2x_{i}\bar{x} + \bar{x}^{2})$$

$$= \sum_{i} x_{i}^{2} - 2\bar{x} \sum_{i} x_{i} + N\bar{x}^{2}$$

$$= \sum_{i} x_{i}^{2} - 2\bar{x}N\bar{x} + N\bar{x}^{2}$$

$$= \sum_{i} x_{i}^{2} - N\bar{x}^{2}$$

$$\sum_{i} (x_i - \bar{x}) (x'_i - \bar{x}') = \sum_{i} x_i x'_i - \bar{x} \sum_{i} x'_i - \bar{x}' \sum_{i} x_i + N \bar{x} \bar{x}'$$

$$= \sum_{i} x_i x'_i - \bar{x} N \bar{x}' - \bar{x}' N \bar{x} + N \bar{x} \bar{x}'$$

$$= \sum_{i} x_i x'_i - N \bar{x} \bar{x}'$$

### 3.5.2 Translation + scaling

Le critère est de la forme

$$\sum_{i} \left( a_x x_i + t_x - x_i' \right)^2 + \dots$$

La dérivée par rapport à  $t_x$  donne

$$\sum_{i} (a_x x_i + t_x - x_i') = 0 \iff a_x \sum_{i} x_i + Nt_x - \sum_{i} x_i' = 0$$
$$\iff t_x = \bar{x}' - a_x \bar{x}$$

La dérivée par rapport à  $a_x$  donne

$$\sum_{i} x_{i} \left( a_{x} x_{i} + t_{x} - x_{i}' \right) = 0 \iff a_{x} \sum_{i} x_{i}^{2} + t_{x} \sum_{i} x_{i} - \sum_{i} x_{i} x_{i}' = 0$$

$$\iff a_{x} \sum_{i} x_{i}^{2} + N \bar{x} \left( \bar{x}' - a_{x} \bar{x} \right) - \sum_{i} x_{i} x_{i}' = 0$$

$$\iff a_{x} \left( \sum_{i} x_{i}^{2} - N \bar{x}^{2} \right) + N \bar{x} \bar{x}' - \sum_{i} x_{i} x_{i}' = 0$$

$$\iff a_{x} \sum_{i} \left( x_{i} - \bar{x} \right)^{2} - \sum_{i} \left( x_{i} - \bar{x} \right) \left( x_{i}' - \bar{x}' \right)$$

$$\iff a_{x} = \frac{\sum_{i} \left( x_{i} - \bar{x} \right) \left( x_{i}' - \bar{x}' \right)}{\sum_{i} \left( x_{i} - \bar{x} \right)^{2}}$$

### Misc

### 4.1 Notes

### 4.1.1 Block\_Matching()

Arguments

- $\bullet\,$ image  $I^p_{ref}$  dans la géométrie sous-échantillonnée (niveau p de la pyramide)
- $\bullet\,$ image  $I_flo$  dans la géométrie initiale
- transformation permettant de passer de  $I_{ref}^p$  à  $I_{flo}$ .
  - cas linéaire : c'est

$$T_{flo_{\mathbb{R}} \leftarrow ref_{\mathbb{R}}}$$

et le rééchantillonnage se fait avec

$$H_{flo_{\pi} \leftarrow flo_{\mathbb{D}}} \circ T_{flo_{\mathbb{D}} \leftarrow ref^{p_{\mathbb{D}}}} \circ H_{ref^{p_{\mathbb{D}}} \leftarrow ref^{p_{\pi}}}$$

- cas non-linéaire : c'est une image vectorielle  $\mathbf{V}^p$  définie sur la même grille que  $I^p_{ref}$ 

$$T_{flo_{\mathbb{Z}} \leftarrow ref_{\mathbb{Z}}}(i,j,k) = H_{flo_{\mathbb{Z}} \leftarrow flo_{\mathbb{R}}}^{-1} \circ H_{ref_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}(i,j,k) + H_{flo_{\mathbb{Z}} \leftarrow flo_{\mathbb{R}}}^{-1} \mathbf{V}_{flo_{\mathbb{R}} \leftarrow ref_{\mathbb{Z}}}^{p}(i,j,k)$$

- • Allocation d'une image  $I^p_{flo}$  de même géometrie que  $I^p_{ref}$
- Allocation de la liste des blocs
  - Pour les non-linéaires, les tailles de blocs doivent être impairs
- $\bullet$  Calcul des paramètres de blocs pour  $I^p_{ref}$
- Boucle
  - 1. Rééchantillonnage de  $I_{flo}$  en  $I^i_{flo}$  (i : itération) avec

- 2. Calcul des paramètres de blocs pour  $I^i_{flo}$
- 3. Tri des blocs pour  $I_{flo}^i$
- 4. Calcul des appariements entre les blocs pour  $I^i_{flo}$  et ceux de  $I^p_{ref}$
- 5. Calcul de la transformation incrmentale  $\delta T_{flo^i \leftarrow ref^p}$ 
  - cas linéaire : c'est une transformation dans le référentiel réel

$$\delta T_{flo^i_{\mathbb{R}}\leftarrow ref^p_{\mathbb{R}}}$$

- cas non-linéaire : c'est un champ de vecteurs  $\delta \mathbf{V}_{flo^i_{\mathbb{R}} \leftarrow ref^p_{\mathbb{Z}}}$
- 6. Mise à jour de la transformation  $T_{flo^i \leftarrow ref^p}$ 
  - cas linéaire : C'est une transformation dans le référentiel réel

$$T_{flo^{i+1}\mathbb{R}\leftarrow ref^{p}\mathbb{R}}=\delta T_{flo^{i}\mathbb{R}\leftarrow ref^{p}\mathbb{R}}\circ T_{flo^{i}\leftarrow ref^{p}}$$

- cas non-linéaire :

$$\begin{aligned} \mathbf{V}_{flo^{i+1}_{\mathbb{R}} \leftarrow ref^{p}_{\mathbb{Z}}}(i,j,k) &= & \mathbf{V}_{flo^{i}_{\mathbb{R}} \leftarrow ref^{p}_{\mathbb{Z}}}(i,j,k) \\ &+ \delta \mathbf{V}_{flo^{i}_{\mathbb{R}} \leftarrow ref^{p}_{\mathbb{Z}}} \left( (i,j,k) + H^{-1}_{flo_{\mathbb{Z}} \leftarrow flo_{\mathbb{R}}} \mathbf{V}_{flo^{i}_{\mathbb{R}} \leftarrow ref^{p}_{\mathbb{Z}}}(i,j,k) \right) \end{aligned}$$

### 4.1.2 Pyramidal block matching

- 1. Construction des parametres pour chaque niveau
- 2. Boucle sur les niveau
  - (a) Allocation de la transformation du niveau
  - (b) matrice de reechantillonnage
  - (c) reechantillonnage de l'image de reference
  - (d) reechantillonnage de la transformation courante a la transformation du niveau
  - (e) filtrage eventuel de l'image flottante
  - (f) recalage
  - (g) reechantillonnage de la transformation resultat a la transformation courante
  - (h) liberation memoire

### 4.2 Pyramidal\_Block\_Matching()

1. Initialisation de la transformation. Rééchantillonnage de flo vers ref.

$$Tr\_result = T_{ref \leftarrow flo}$$

J'aurai vu l'inverse.

- 2. Contrôle sur la taille du voisinage d'exploration.
- 3. Calcul du nombre de niveau de la pyramide
- 4. Allocation d'une image en cas de pyramide filtrée.
- 5. Pyramide
  - (a) Mise à jour des paramtres (pas au 1e niveau)
  - (b) Calcul de l'image ref sous-échantillonnée et de la matrice de sous-'echantillonnage de ref vers ref\_sub
  - (c) Lissage éventuel de l'image flottante
  - (d) Appel de Block\_Matching() la matrice de transformation est en coordonnées voxel de ref vers flo

### 4.3 Block\_Matching()

Pourquoi on passe le type de Inrimage\_flo?

1. Composition de la matrice de sous-échantillonnage avec

### 4.4 Fonctions

### 4.4.1 ChangeGeometryTransformation(), transformation.h

### 4.5 Notes

- la position du centre d'un bloc (cf CalculChampVecteur2D() et CalculChampVecteur3D()) est donnée par  $x=a+param->bl\_dx/2.0$  avec a origine du bloc, et  $param->bl\_dx$  taille du bloc. Etant donné que a est au centre du bloc, il aurait fallu faire  $x=a+(param->bl\_dx-1)/2.0$ !! [DONE]
- dans CalculChampVecteur3D(), la taille du voisinage est de  $-param > bl\_size\_neigh\_x$  a  $+param > bl\_size\_neigh\_x$ , et on parcourt le voisinage a partir de  $a param > bl\_size\_neigh\_x$  et en avançant de  $param > bl_next_neigh_x$ , ce qui fait que l'on ne teste pas forcément le point central (ex: size = 3 et step = 2). A corriger.

- Le calcul des résidus devrait se faire par une distance de Mahalanobis.
  - Paires :  $(M_i, M_i')$
  - Transformation estimée :  $T = \arg\min \sum_i \|T \circ M_i M_i'\|^2$
  - vecteurs résidus :  $\mathbf{r}_i = T \circ M_i M_i'$
  - moyenne des résidus :  $\overline{\mathbf{r}} = \frac{1}{N} \sum_{i} \mathbf{r}_{i}$
  - matrice de covariance des résidus :  $C = \frac{1}{N} \sum_i ({\bf r}_i \overline{\bf r}) ({\bf r}_i \overline{\bf r})^T$
  - la distance de Mahalanobis s'écrit  $(\mathbf{r}_i \overline{\mathbf{r}})^T C^{-1} (\mathbf{r}_i \overline{\mathbf{r}})$

Maintenant, il faudrait calculer la distance par rapport à un résidu nul...

- tools = outils, basic = allocation, initialisation, ...
- transformation\_type n'a pas à être dans les paramètres de recalage, juste dans les paramètres locaux du 'main'