

# Localization and Tracking Toolbox for Ultrasound Superresolution

# **User Guide**

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### **Authors:**

Baptiste Heiles, Arthur Chavignon, Vincent Hingot, Pauline Lopez, Eliott Teston, Olivier Couture Laboratoire d'Imagerie Biomedicale, Team PPM. 15 rue de l'Ecole de Medecine, 75006, Paris

### **Corresponding author:**

Baptiste Heiles, baptiste.heiles@gmail.com

### Academic references to be cited

Details of the code published in 2020 article by Heiles, Chavignon, Hingot, Lopez, Teston, and Couture. Open Platform for Ultrasound Localization Microscopy: performance assessment of localization algorithms



### 1. General information

### Aim

LOTUS is software for ultrasound localization microscopy. Individual and isolated microbubbles are localized with sub-pixel precision. Then a tracking algorithm pairs microbubbles' positions into long trajectories. It enables microvascular imaging in various organs.

### Minimum requirements

LOTUS software integrates MATLAB Runtime R2021a (9.9) (MathWorks). We recommend using Microsoft Windows 10 (version 1803 or higher), with 4 GB RAM minimum, and 5 GB of free space.

#### Installation instructions

- 1. Download LOTUS from Github repository
- 2. Unpack the archive in a preferred directory.
- 3. Launch the installer LOTUS\_v1\_2\_installer.exe
- 4. Follow the instructions
- 5. Restart your computer
- 6. LOTUS should be now available for use in the start-up menu

#### **Complementary scripts**

This GUI is part of a larger platform called PALA available on <a href="https://github.com/AChavignon/PALA/">https://github.com/AChavignon/PALA/</a>
This repository contains all the scripts run by PALA and we strongly recommend the users wanting to devise their own scripts or understand the algorithms called by LOTUS to visit the page. For all the variables defined in this user guide, we have added the name of their respective counterpart in the scripts in italic: "See value XX in the PALA\_scripts". The user can read and run the script PALA\_InVivoULM\_example.m as a starting point.

### Input data type

LOTUS software accepts a list of .mat file with images organized in a [space, space, time] matrix, or a list of folders containing these files. Images can be complex or real, without log compression. For long acquisition, data should be split into multiple individual files of a maximum of 2000 images to prevent time-consuming filtering (max 200 MB per file). The name of the variable containing the images is assumed to be IQ by default. In the case where LOTUS can not clearly identify the name of the variable, it will ask the user to define a name in a pop-up dialog box.



### **Image visualization**

Images will be saved in the specified folder. We recommend using ImageJ software to visualize tiff images and adjust brightness/contrast/color balance. (https://imagej.nih.gov/ij/)

Any questions should be addressed to the authors via the Github repository by opening an issue.

#### Disclaimer

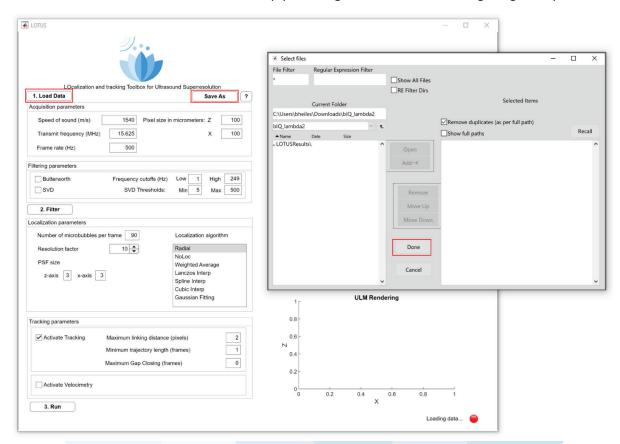
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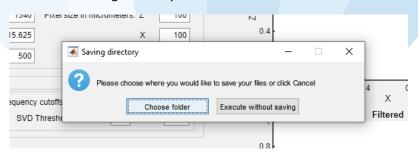
### 2. Open LOTUS and load data

Click on "Load Data" to import stacks of images. For .mat files, images must be stored in a variable  $IQ(n_x, n_z, n_t)$ . Pixel size must be provided in micrometers.

You can add both folders and files, LOTUS will take all ".mat" files including in the folder containing the files. WARNING: if you add files and there are other ".mat" files in the folder containing these files, LOTUS will load all of them. You should keep your images in a folder containing images only.

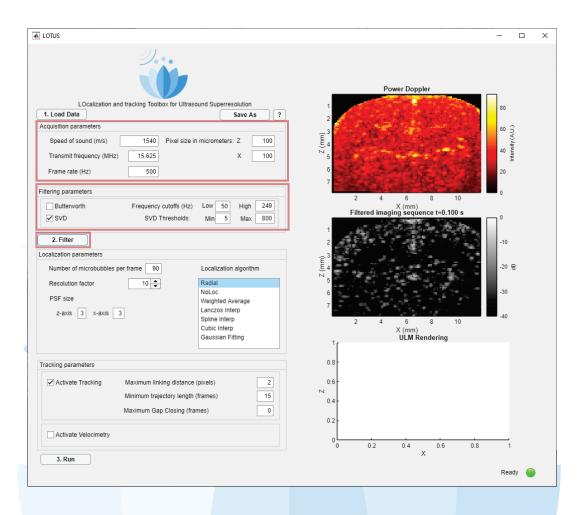


Click on "Save As" to select a saving directory.





### 3. Select acquisition and filtering parameters



### Acquisition parameters

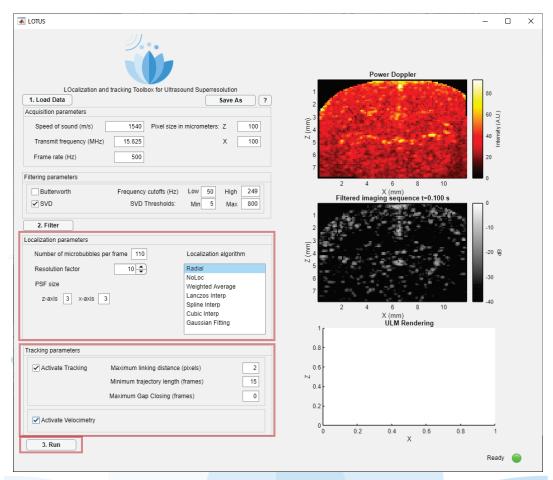
- Speed of sound: media speed of sound in meters per second
- Transmit frequency: in MHz, for wavelength estimation See value UF.TwFreq in the PALA\_scripts (available on Github <a href="https://github.com/AChavignon/PALA">https://github.com/AChavignon/PALA</a>)
- Framerate: compounded frame rate of the images fed to LOTUS in Hz See value framerate in the PALA\_scripts
- Pixel size in micrometers: height [z] and width [x] of pixels in micrometers See value ScaleOfPixel in the PALA\_scripts

### Filtering parameters

- Singular Value Decomposition: adjust the minimum and maximum kept eigenvalues *See value ULM.SVD\_cutoff in the PALA\_scripts*
- Butterworth: adjust the range of the bandpass filter in Hz See value ULM.ButterCuttofFreq in the PALA\_scripts

<u>Note:</u> You can click on "2. Filter" to visualize the result of the filtering in the middle figure. It is highly recommended to try a few parameters and then run the entire algorithm to avoid unnecessary calculations.

### Select localization and tracking parameters



### **Localization parameters:**

- Number of microbubbles per frame: estimated number of microbubbles in a unique frame (in 2D, a dozen to a couple of hundreds depending on the dataset) See value ULM.numberOfParticles in the PALA\_scripts
- Resolution factor: the resolution factor determines by how much the original pixel size in micrometers will be multiplied by (ex: an original 100x100 micrometers pixel size with a resolution factor of 10 will result in a final image with a pixel size of 10x10 micrometers) See value ULM.res in the PALA scripts
- PSF size: the estimated size of the Full Width at Half Maximum of the microbubbles in pixel (usually the size of the microbubble PSF is a few wavelengths in each axis). See value ULM.fwhm in the PALA\_scripts
- Localization algorithm: select one or multiple localization kernels *See value ULM.LocMethod in the PALA\_scripts*



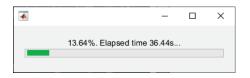
### **Tracking parameters**

- Maximum linking distance: the maximal distance between two microbubbles that can be paired in pixels See value ULM.max\_linking\_distance in the PALA\_scripts
- Minimum trajectory length: minimum length of a trajectory to be kept in frames *See value ULM.min\_length in the PALA\_scripts*
- Maximum Gap Closing: allowed gap between frames to link microbubbles together *See value ULM.max\_gap\_closing in the PALA\_scripts*

Press "Run" to launch LOTUS. If no saving directory has been define, you will be asked to select a saving directory.



LOTUS will then start ULM processing.

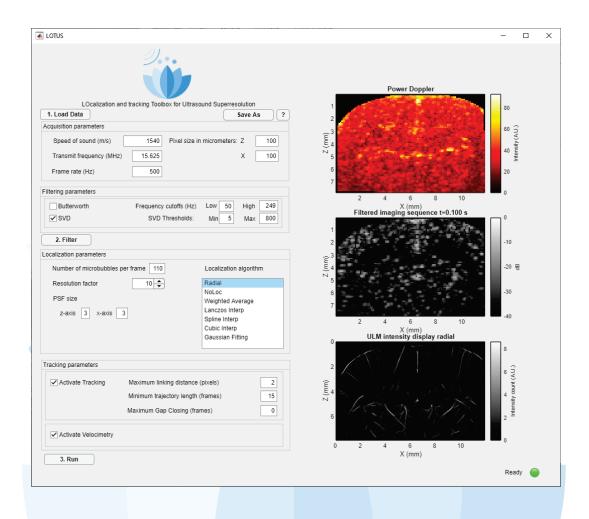


#### Parallel execution:

The software will try to execute the process on many parallel workers at once. This way, the calculation time is reduced as much as possible. If it can not run in parallel, it will run normally, executing one task after the other. The downside of parallel execution is that there is no way it can be stopped once it is launched so we recommend the user to start testing its parameters on a reduced dataset before executing the whole process.



## 4. Display results



When the processing ends, the intensity rendering is displayed in the GUI.

Additional renderings are directly saved in the saving directory given that one was chosen.



### **Saved files**

LOTUS software provides different rendering based on intensity, velocity, and direction of microbubbles' trajectories, saved in the folder called LOTUSResults\_XXXXXX in a folder containing the name of the algorithm used, for example: "./LOTUSResults\_2022\_02\_16\_11\_44\_54/radial/"

	LOTUS_MatrixLoc_xxxx_locAlgo.tif Intensity rendering with localization of microbubbles		
	LOTUS_MatrixTrack_xxxx_locAlgo.tif Intensity rendering with tracking of microbubbles and interpolation of trajectories		
	LOTUS_MatrixZdir_xxxx_locAlgo.tif Intensity rendering with upward trajectories in red, and downward trajectories in blue		
	LOTUS_MatrixVeLNORM_xxxx_locAlgo.tif Velocity rendering with average velocity norm		
Filtered imaging sequence 1=0.002 s  1  2  (iii)  3  4  N  5  6  7  2  4  6  7  2  4  8  10  30  35  40  X(mm)  Power Doppler	LOTUS_filtered_xxxx.gif  Movie of the filtered images		
Power Doppler  1 2 60 (M) / Mulling 2 5 6 7 2 4 6 8 10 X (mm)	LOTUS_PDoppler_xxxx.tif  Power Doppler extracted from the filtered images		

Raw data (localization, tracks, and rendering matrices) are saved in MatLab files:

- The file LOTUS\_Localizations\_All contains two variables
  - 1. ULM: A structure regrouping all the parameters of the ULM process



Field	Description		
numberOfParticles	Number of particles to be localized		
size	Size of the input image (z,x,time)		
scale	Scale of the pixel and time between frames		
res	Resolution factor		
seuil	Thresholds of the SVD filter		
max_linking_distance	Maximum distance allowed to pair two particles		
min_length	Minimum length of a trajectory (in number of particles)		
fwhm	Full Width at Half Maximum of the PSF of a particle		
max_gap_closing	Trajectories can be linked in between frames by setting this number		
	a non-zero		
interp_factor	Interpolation time factor on which trajectories are interpolated (time		
	between each points of the trajectory will be time between frames		
	times this factor)		
Tracking	Logical value (1 if tracking is required)		
Velocimetry	Logical value (1 if velocimetry is required)		
SRscale	Scale of the final pixel in the superresolved image		
SRsize	Size of the superresolved image		
ButterCutoffFreq	Butterworth filter values		
parameters	A parameter to hold various safeguard (NLocalMax is the maxin		
	number of local maxima allowed in the detection step)		
lambda	Wavelength parameter in mm		
LocMethod	Localization method		
MethodName	List of localization methods selected		
InterpMethod	Interpolation method		

2. Localizations: A number of cells matching the number of files input into LOTUS containing:

Localizations{1, 1}						
	1	2	3	4		
1	2.8279e+06	0.0022	0.0022	1		
2	3.3051e+06	0.0047	0.0047	1		
3	3.2622e+06	0.0019	0.0019	2		
4	2.6758e+06	0.0022	0.0022	2		
5	3.8631e+06	0.0031	0.0035	2		
6	3.5597e+06	0.0042	0.0046	2		
Pi	ixel intensity A	Frame index				

### LOTUS\_TrajectoriesAll:

- 1. ULM: A structure regrouping all the parameters of the ULM process (same as table above)
- 2. an ensemble of cells containing all trajectories computed and concatenated. If opened:

(meters)

	Trajectories{1, 1}						
	1	2	3	4	5		
1	0.0022	0.0022	0.0150	0.0100	0		
2	0.0022	0.0022	0.0150	0.0100	8.0000e-05		
3	0.0022	0.0022	0.0150	0.0100	1.6000e-04		
4	0.0022	0.0022	0.0150	0.0100	2.4000e-04		
5	0.0022	0.0022	0.0150	0.0100	3.2000e-04		
6	0.0022	0.0022	0.0150	0.0100	4.0000e-04		

Axial and lateral coordinates Axial and lateral velocities Time sampling (meters) (meters/second) (seconds)