SMALL-LABS User Guide

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***If you obtained this code (and thus User Guide) from a source other than the Biteen Lab GitHub please visit https://github.com/BiteenMatlab/SMALL-LABS to obtain the latest version of the code.

1 Introduction

SMALL-LABS is an algorithm which allows single molecules to be localized even in the presence of a spatially arbitrarily complex, temporally low frequency background. Accurate background subtraction is enabled by separating the foreground from the background based on differences in the temporal variations of the foreground and the backgroundâĂŤfluorophore blinking, bleaching, or moving. Because the background subtracted is the true background (minimizing or eliminating subtraction of molecule images) the localization and intensity measurement of the molecule is extremely accurate. This document is a detailed guide for users on how to use the provided code. See the Quick Start Guide for a quick introduction to the using this code.

This code runs in Matlab (currently tested in versions 2014a through 2017b) and currently takes input movie data as .mat files or TIFF stacks with adaptability to other image types (TIFF stacks are read using TIFF-Stack to read the TIFFs and write a new movie as a .mat, see the note at the end of this section on how to install this package). If your data is in another format, the easiest thing to do would be to convert it to a .mat file (preferred) or TIFF stack (otherwise you can add other formats to the function Movie2mat.m as described in the function). Conversion to TIFF stack can be accomplished using a variety of programs including ImageJ's Bio-Formats plugin.

The function $SMALLLABS_main.m$ is the wrapper for the rest of the code, it performs all of the steps in in the SMALL-LABS algorithm in the correct order. Simply run $SMALLLABS_main.m$ in the Matlab workspace by specifying the directory containing your movies, specifying the three required parameters, and any optional parameters. The various steps can also all be done independently using $SMALLLABS_main.m$ by setting the appropriate action parameters. Furthermore, $SMALLLABS_main.m$ can be used to do localization without background subtraction if desired.

1.1 Workflow

The basic (default) workflow (doing full background subtraction) in SMALL-LABS is:

0. Convert the movie file to .mat if it's a different format, using Movie2mat.m

- 1. Average (or median) subtraction (make the avg sub movie) using $AVG-SUB_movs.m$
 - ⇒ Subtracting this background removes the low-frequency background
- 2. Molecule detection (guess molecule locations) in the avgsub movie, using Guessing.m
- 3. Identify frames before and after each guess in which there isn't another guess nearby, using Mol_off_frames.m
 - \Rightarrow This process gives an off_frames list for each guess
- 4. For each guess, time-average (or median) a small area around the guess using the off_frames list, using Subtract_then_fit.m
 - \Rightarrow This average is the True Background
- 5. Subtract the True Background, and fit the background-subtracted image, using Subtract_then_fit.m

Additional optional steps currently included in the SMALL-LABS package

- 1. Track the fit results
- 2. Make a View-Fits movie showing the fitting results.

1.2 The Measurement results

Several files containing the results from the various steps will be written to the data directory. Most importantly, the fit results will be collected in a .mat file called <code>moviename_AccBGSUB_fits.mat</code> which contains the fits structure. Each individual guess will generate a row in the fits struct, the fields are:

```
frame number of the fit
       frame
       molid
                the molecule ID as defined in quessing.m
                row coordinate of the fit
          row
                column coordinate of the fit
          col
      widthr
                Gaussian standard deviation in the row dimension
                Gaussian standard deviation in the column dimension
      widthc
                angle of an asymmetric Gaussian fit
          ang
                intensity offset of the fit
      offset
                amplitude of the fit
          amp
          err
                error on the fit
                if qpufit was used, the final value of the estimator function
chi_squares
                sum of pixel intensities in ROI around the fit
          sum
                the 95% confidence interval on row,
       rowCI
                or if qpufit was used the estimated localization precision<sup>1</sup>
                the 95% confidence interval on col,
       colCI
                or if qpufit was used the estimated localization precision<sup>1</sup>
                if gpufit was not used, the 95% confidence interval on widthr
   widthrCI
   widthcCI
                if gpufit was not used, the 95% confidence interval on widthc
                if gpufit was not used, the 95% confidence interval on ang
       angCI
   offsetCI
               if qpufit was not used, the 95% confidence interval on offset
               if quality was not used, the 95% confidence interval on amp
       ampCI
                Boolean of whether or not the fit is a goodfit
    goodfit
      states
                if qpufit was used, convergence flag
                the value of the image region if a phase mask was used,
      roinum
                otherwise 1
```

2 Using SMALLLABS_main.m

 $SMALLLABS_main.m$ is the wrapper function for the SMALL-LABS algorithm.

Note: that by setting 'bgsub' to false SMALLLABS_main.m will do fitting without doing background subtraction. Doing this obviates a lot of parameters, it doesn't matter what they're set to, importantly the required parameters of avgwin and moloffwin can be set to anything.

2.1 Inputs

 $SMALLLABS_main.m$ has four required inputs:

file_or_directory_name is the name of the directory where the movies will be selected OR the filename of a single movie OR a list of movies to be fit. If a directory is entered, then uigetfile will open and allow movie files

 $^{^1{\}rm Localization}$ precision based on Thompson R. E.; Webb, W. W.; Biophys. J., 2002, 82, 2775–2783.

(of any extension) to be selected. If the filename of a single movie is entered the SMALL-LABS will analyze that movie. If a list of movies is entered, then SMALL-LABS will sequentially analyzed the movies in that list. For a list of movies that file should be a .txt file with each full filename (e.g., directory\moviename.ext) on a separate line.

dfrlmsz is the size of a diffraction limited spot in pixels. It's the nominal diameter, NOT the FWHM or something similar. Must be an integer! Given the diffraction limit size of an imaging system d in pixels (d converted to pixels using the pixel size in the imaging plane) we find that a value for dfrlmsz $\approx 1.4d$ works well

$$d=rac{\lambda}{2NA} \ \Rightarrow \ \mathrm{dfrlmsz} pprox 1.4d$$

avgwin is the length of the temporal window (in frames) to be used for the average subtraction.

moloffwin is the length of the temporal window (in frames) to be checked to determine in which frames that molecule was off and are thus safe to subtract. Needs to be an even integer.

The inputs are entered with the order as shown below

```
>>SMALLLABS_main(file_or_directory_name, dfrlmsz, avgwin, moloffwin,'optional_parameter_name', optional_parameter_value)
```

SMALLLABS_main.m also takes a number of optional parameters (a complete list can be found in Appendix A. Further details about the function of each optional parameter can be found in their corresponding section throughout this guide. All optional inputs are input as name-value pairs, for example setting to set 'bpthrsh' to 93, include 'bpthrsh', 93 in the function call to SMALLLABS_main.m. NOTE if you reference the default values in SMALLLABS_main.m that you only need the field name and not the name of the struct, e.g., 'offset', 2500 NOT 'params.offset', 2500.

For example the function call

```
>>SMALLLABS_main('Test data and simulations', 7, 300, 100, 'check_guesses', true)
```

opens the *Test data and simulations* directory to select movies there. dfrlmsz=7, avgwin=300, moloffwin=100, and the optional parameter 'check_guesses' is set to true.

If no checking commands (for example 'check_guesses') were sent, SMALLLABS_main.m will automatically proceed through the entire calculation implementing the SMALL-LABS algorithm. After each step, the resultant data is saved in the data directory. A progress bar shows the overall progress for the current batch of movies and the displays what step is currently being run on which movie, this information is also logged (with timestamps) in the Matlab command window.

In general SMALL-LABS is a fairly fast and memory-efficient program. This is especially true if a CUDA enabled GPU is available and/or if Matlab's parallel computing toolbox is available. If you run into speed or memory problems, see Sec. 9 for strategies to overcome this.

3 Average Subtraction

This step is skipped if 'bgsub' is set to false.

This step is skipped if 'makeAvgsub' is set to false.

The first step in SMALL-LABS is approximate background subtraction by subtracting a moving temporal mean (or median). This is accomplished in $AVGSUB_movs.m$. The parameter avgwin is the length of the temporal window over which the mean (or median) is calculated. Because this step can be somewhat slow, first there is a check to determine if the avgsub movie has already been created. If so, then there's a further check to determine whether or not any of the parameters have changed. If they're identical, this step is skipped. To bypass this process, simply delete the avgsub movie from the directory.

The avgsub movie is saved in the data directory as the original movie file name, but with "avgsub" appended.

3.1 Optional parameters

'do_avg', is a Boolean parameter.² Set to true to subtract the average, or set to false to subtract the median. The default is true (subtract the mean).

'offset', this is a constant offset to be added to all pixels in the avgsub movie after the subtraction. This is to avoid negative pixels. Because the avgsub movie is only used for guessing, the absolute value of these pixels isn't very important and 'offset' should be large enough to avoid negative pixels. The default value is 1000.

3.2 Considerations

Choosing avgwin should balance the characteristic on time for the molecules and the characteristic timescale for background changes. avgwin should be much longer (at least approximately one order of magnitude is ideal) than the characteristic on time of the molecules to minimize the amount of the molecule intensity being subtracted and affecting the guessing. Conversely, avgwin should be smaller than the characteristic time of the low frequency

²Boolean variables are either true or false. In Matlab they can be set using true or false, or 1 or 0.

background changes, so that over the course a window, the background is essentially constant.

You can check if you chose an appropriate avgwin value qualitatively by watching the avgsub movie (which is shown during the guess checking procedure): if you see that during part of a molecule's track it appears as a dark spot instead of a bright spot, then you know that you need to increase avgwin. Conversely, if you see that the background features appear and disappear instead of never being present, then you know that you need to reduce avgwin. If large portions of the movie look saturated, or if there were warnings printed to the command window about negative pixels, then you need to increase offset.

Setting 'do_avg' to false causes the median to be subtracted instead of the average. This is actually a more accurate way to calculate the background because the median is less sensitive to outliers (in this case molecules appearing). However, because calculating a median first requires sorting, it is slightly slower than calculating a mean, so if you have the extra time or computing power, using the median would be advantageous, but it will cause this step to take longer.

4 Guessing

This step is skipped if 'guessing' is set to false.

The next step in SMALL-LABS is molecule detection, called here guessing³ This is the only step in which molecules are detected, and though there are a number of false positive checks later, there are no further false negative checks. So it is critical to ensure that as many molecules are detected as possible.

4.1 Optional parameters

'bpthrsh' is the main parameter to increase or decrease the sensitivity of the detection during guessing. 'bpthrsh' sets the intensity threshold over which molecule shaped groups of pixels will be searched for. 'bpthrsh' is the value of the percentile of intensities in the movie (or individual frame, see 'pctile_frame' below) after the movie was spatially bandpassed to suppress pixel noise. Default is 95.

'egdesz' is the number of pixels around the edge of the frame to ignore. Default is dfrlmsz.

'pctile_frame' is a Boolean determining whether or not to calculate the intensity percentile for the threshold (using 'bpthrsh') frame by frame,

³Called guessing for two reasons, firstly, the molecule location is imprecisely measured as compared with later super-resolution fitting. Secondly, because the molecules haven't gone through a series of false positive checks yet to be sure that it is truly a molecule.

or using the entire movie. If set to true the percentile is calculated frame by frame, if set to false the entire movie is used. Default is false.

'mask_fname' is the filename of a mask to set the boundaries of where guessing will occur in frame. To not use a mask simply leave 'mask_fname' empty (in Matlab empty is []). If 'mask_fname' is set true (or 1), then the program will look for a file in the same directory as the movie with "_PhaseMask" appended to the name of the movie. See Sec. 4.3 for more details. Default is [], no mask.

'make_guessmovie' is a Boolean determining whether or not to save a .avi movie showing the guess results to the data directory. If set to true the movie will be made and saved, if set to false this will be skipped. Default is false.

4.2 Checking the guessing

It is highly recommended that the guessing parameters are checked for every new movie analyzed (or at least one or several representative movies in a batch of movies). To do this, set 'checkGuesses' to true. This causes Guessing.m to pause in the Matlab debugger once guessing has finished for the first frame. A figure appears showing those results, as shown in Fig. 1. Look through the movie frames to check the guessing. This is accomplished

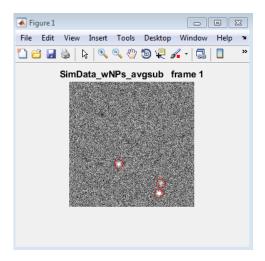


Figure 1: Guessing results as shown in the check guess procedure.

either by pressing the *Continue* button in the editor tab, or entering dbcont in the command window. When ready to stop checking the guesses, stop the debugger, either by pressing the *Quit Debugging* button or entering dbquit in the command window.

If satisfied with guessing rate, then simply rerun SMALL-LABS with 'checkGuesses' set to false. If not staisfied, change the relevant param-

eter and rerun SMALL-LABS with 'checkGuesses' still set to true.

In SMALL-LABS it's best to over-guess (include more false-positives) slightly. The reason for this is that there are a series of false-positive checks that occur later, but no further chance to reduce the false-negative rate, so it's best to get it as low as possible here. Furthermore, the accuracy of the true background removal in SMALL-LABS depends on not including images of the molecules in the foreground. So if the false-negative rate is too high images of molecules will be included in the background and reduce the accuracy of the subtraction.

The easiest way to change the guessing rate is by increasing or decreasing 'bpthrsh'. To increase the detection rate, lower 'bpthrsh', and to decrease the detection rate increase 'bpthrsh'.

If you see that the guessing missing a lot of molecules and reducing the threshold isn't helping discriminate molecules from pixels, then consider changing dfrlmsz.

If you're having a hard time determining if guessing is going well or not, try making saving a movie by setting 'make_guessmovie' to true. This enables you to inspect the movie more closely than with the simple frame viewer in SMALL-LABS. I recommend using ImageJ to view the .avi movie, which allows easy navigation through the frames and easy scaling of the grayscale.

4.3 Considerations

For SMALL-LABS it is best to have a slightly high false-positive rate in guessing for the reasons discussed above. If the false-positive rate gets too high though, then it will obviously take more time to analyze the all of those guesses. Therefore it is important to balance accuracy here with speed by setting a reasonable false-positive rate, in practice a false-positive rate $\approx 10-25\%$ is probably a good target.

If the movie being analyzed has large variations (in molecule density, brightness, background, etc.) over the course of the movie, then it's probably best to guess frame by frame, by setting 'pctile_frame' to true. If the variations are small though, it's likely more robust to use the entire movie to calculate the percentile.

The mask file is a .mat file which has a matrix $(m \times n)$ called PhaseMask that is the same size as a frame $(m \times n)$ in the current movie. SMALL-LABS will ignore pixels set to zero in PhaseMask for guessing. Pixels in PhaseMask set to any other value are grouped together as having a roinum of that value. Later, in tracking, SMALL-LABS will only organize molecules in the same track if they have the same roinum.

5 Constructing the off-frames list

This step is skipped if 'bgsub' is set to false.

This step is skipped if 'makeOffFrames' is set to false.

The next step in SMALL-LABS is determining the off-frames list for each detected molecule. This is accomplished in *Mol_off_frames.m*. For each detection a local off-frames list is constructed; this list enumerates all frames in which no molecule was detected in the local region around the molecule. A local region is defined as a square around the detection with edge size $2\times dfrlmsz+1$ (in pixels). The off-frames list is only constructed for a temporal window around the detection. The length of this temporal window is set by moloffwin. There are no optional parameters for this step.

5.1 Considerations

A warning will print to the command window if a detection has fewer than 5% off frames in its moloffwin. If you get this warning at all, or especially for many molecules, you should consider increasing moloffwin.

The same discussion about choosing the length of avgwin applies to choosing moloffwin. Briefly, it should be a long as possible, without including low frequency changes in the background. Basically, the characteristic on/off time of the molecules should be small compared with moloffwin, but the characteristic time for the background to change should be large compared with moloffwin.

6 Subtracting and Fitting

This step is skipped if 'fitting' is set to false.

The subtraction of the true background and PSF fitting are accomplished in the same step in SMALL-LABS, in the $Subtract_then_fit.m$ function. If 'bgsub' is set to false, then subtraction is skipped and just fitting is done. The subtraction calculates the mean (or median) of the off-frames (as determined in $Mol_off_frames.m$) in a local region around the guess. The local region is the same $2 \times dfrlmsz+1$ (in pixels) square around the guess as was used in $Mol_off_frames.m$.

After fitting, a number of false-positive checks are done. The results of these false-positive checks determine whether or not the fit is a *goodfit* and should be used for further analyses.

For background subtraction ('bgsub' set to true) fit results are saved in a .mat file in the data directory called <code>moviename_AccBGSUB_fits.mat</code>, where <code>moviename</code> is the name of the movie being analyzed. If background subtraction is not being used, then the file is called <code>moviename_fits.mat</code>.

6.1 Optional parameters

'MLE_fit' is a Boolean determining whether or not to use MLE (maximum likelihood estimation) fitting or to use least-squares fitting. If set to true MLE fitting will be used, if set to false least-squares fitting will be used. Default is false. ***Currently using MLE fit on a GPU is not functioning, this will be fixed as soon as possible.

'stdtol' is one of the goodfit (false-positive) parameters. *stdtol* is the tolerance on the width (standard deviation of the fitted 2D Gaussian). See Sec. 6.3 for a more detailed discussion on the goodfit parameters. Default is 1.5

'maxerr' is second changeable goodfit parameter. It is the maximum error on the fit, defined using normalized residuals. Default is 0.10.

'do_avgsub' is a Boolean determining whether or not to subtract the mean or the median of the off-frames. If set to true the mean will be subtracted, if set to false the median will be subtracted. Default is true.

'which_gaussian' is a flag determining which Gaussian function to fit to. Set to 1 to use a symmetric 2D Gaussian, set to 2 to use a fixed angle asymmetric 2D Gaussian, set to 3 to use a freely rotating asymmetric 2D Gaussian. See Sec. 6.2 for more details. Default is 1, the symmetric 2D Gaussian.

'fit_ang' is the angle (in radians) to which the fixed angle asymmetric 2D Gaussian will be fit. Default is 0.

'usegpu' is a Boolean determining whether or not to use a CUDA enabled GPU for the fitting if one is available. If set to true the GPU will be used, if set to false the GPU will not be used. Default is true.

6.2 Gaussian fit parameters

There are currently three options for the functional form of PSF to fit to. NOTE: because all of the math is here is done on images (arrays) in Matlab, the coordinate system is rows and columns, r & c, as opposed to something potentially confusing like x & y. See the document included in this package titled $Image\ Coordinates\ in\ Matlab\ and\ Image\ J.pdf$ for more details.

The first functional form is the symmetric 2D Gaussian

1
$$A \exp\left(-\frac{(r-r_0)^2 + (c-c_0)^2}{2\sigma^2}\right) + B$$

the fit results are:

$$egin{array}{ll} {
m row} &= r_0 \ {
m col} &= c_0 \ {
m widthr} &= \sigma \ {
m widthc} &= \sigma \ {
m ang} &= 0 \ {
m (meaningless in this context)} \ {
m offset} &= B \ {
m amp} &= A \ \end{array}$$

The second functional form is the fixed angle symmetric 2D Gaussian, where the angle $\theta = ang$.

2
$$A \exp\left(-\frac{((r-r_0)\cos\theta - (c-c_0)\sin\theta)^2}{2\sigma_r^2} + \frac{((r-r_0)\sin\theta + (c-c_0)\cos\theta)^2}{2\sigma_c^2}\right) + B$$

the fit results are:

$$\begin{array}{ll} \text{row} &= r_0 \\ \text{col} &= c_0 \\ \text{widthr} &= \sigma_r \\ \text{widthc} &= \sigma_c \\ \text{ang} &= \theta = ang \text{ (not a fit parameter here)} \\ \text{offset} &= B \\ \text{amp} &= A \end{array}$$

The third functional form is the same as #2 except that now the angle θ is an additional fit parameter.

Finally, the sum isn't a fit parameter, but rather is the sum of all pixel intensities in the background subtracted image of the molecule (the local area in the 2×dfrlmsz+1 square).

6.3 Goodfit (false positive) checks

SMALL-LABS does a number of a goodfit checks to keep the false positive rate low. The three non-customizable checks are

- 1. Checking the fit coordinates (row & col), the amplitude amp, or the sum sum are all positive. If any are negative, then it's a bad fit.
- 2. Checking that the amplitude is less than the sum (amp<sum). If it's larger then it's a bad fit.
- 3. Checking that the error on the localization (rowCI & colCI) are smaller than the dfrlmsz.

The two customizable goodfit checks are

- 1. Check the width of the Gaussian fit, defined by the standard deviation σ , as compared to an expected width. For a given nominal diffraction limit size dfrlmsz, the expected width, σ_E , is $\sigma_E = dfrlmsz/(2\sqrt{2\log 5})$. A goodfit is a width that satisfies the condition $(\sigma_E/stdtol) \leq \sigma \leq (\sigma_E \times stdtol)$. For an asymmetric Gaussian $\sigma = (\sigma_r + \sigma_c)/2$.
- 2. Check the error on the fit. The error is defined as a psuedo \mathbb{R}^2 value. For a fitted function F of a dataset D, we calculate this psuedo \mathbb{R}^2 as

$$R^{2} = 1 - \frac{\sum (D - F)^{2}}{\sum (D - \langle D \rangle)^{2}}$$

If $R^2 \ge \max$ then it's a goodfit.

The best way to determine if the goodfit checks are accurately discriminating between false positives and true positives is to watch the ViewFits movie, as described in Sec. 8. If they seem too stringent or too lenient, change them and remake the ViewFits movie to check again. The easiest way to do this is to use the provided function <code>Change_GoodFits.m</code> which allows a fit's goodfit status to be reevaluated with new goodfit parameters <code>without</code> having to re-fit the movie, and thus can proceed much faster. Similarly, one doesn't need to make the entire ViewFits movie, instead setting <code>'write_mov'</code> to false puts the ViewFits function into debug mode which allows you to inspect a small number of frames carefully, and not have to wait for the entire movie to be made.

7 Tracking

This step is skipped if 'tracking' is set to false.

After fitting, SMALL-LABS calls a single-particle tracking algorithm using the Hungarian method. Note that if a mask with distinct ROI #'s (roinum) was used, only molecules in the same roinum will be organized into a track together. The tracks are saved to the fits .mat file in the tracks variable.

To aid in intensity measurements SMALL-LABS also creates a track filter logical vector for all guesses called trk_flt which indicated if a molecule was succesfully organized into a track AND the particular detection was not the first or last frame of the track. This is to avoid including molecules which turned on or off partway through a frame, and thus will have their intensity reduced. A true indicated that the detection passed the track filter, and a false that it did not.

Note: only goodfits are tracked. So if you change the goodfits (for instance with *Change_GoodFits.m*) then you need to re-run tracking.

SMALL-LABS saves the tracking results to the tracks array in the fits .mat file. Each row in the tracks array corresponds to a successfully tracked molecule and the columns are:

- 1. frame #
- 2. row position (px)
- 3. column position (px)
- 4. track #
- 5. ROI #
- 6. MolID # for correlating with the fits struct

7.1 Optional Inputs

Tracking in SMALL-LABS uses the function $Track_3D2.m$ (written by David Rowland), further details about the meaning of the track parameters can be found in that function.

'savetracks' is a Boolean determining whether to save the output of $Track_3D2.m$ directly in its own .mat file. The tracks & trk_flt variables will still be saved to the fits .mat file. Set to true to additionally save the raw output from $Track_3D2.m$, and set to false not to. Default is false.

The next inputs are the tracking parameters, these are inputted to SMALL-LABS as a single vector. I'll only give a cursory explanation of these parameters here, see $Track_3D2.m$ for more details. The default values are [0.01,200,0.5,3,3,1,0]

minimum merit

trackparams(1) = 0.01

Integration time (ms)

trackparams(2) = 200

gamma

trackparams(3)=0.5

maximum step size

trackparams(4)=3

minimum track length

trackparams(5)=3

speed estimation window halfsize

trackparams(6)=1

time delay between consecutive frames (ms)

trackparams(7)=0

8 The ViewFits movie

This step is skipped if 'makeViewFits' is set to false.

Lastly, SMALL-LABS makes a ViewFits movie to show the results of detection, fitting, and tracking. This is an especially useful tool as humans

are excellent at looking at most single-molecule movies and determining whether the program incorrectly identified some feature as molecules (false-positives) or missed a lot of molecules (false-negatives). The ViewFits movie is saved in the data directory as moviename_ViewFits.avi.

8.1 Optional Inputs

'orig_movie' is a Boolean determining whether or not to use the original movie, or to use the avgsub movie. Set to true to use the original movie, and set to false to use the avgsub movie. Default is true.

'circ_D' is the diameter (in pixels) of the circles shown in ViewFits movie to indicate molecule positions. Default is dfrlmsz

'linewidth' is the linewidth of the circles. Default is 1.

'write_mov' is a Boolean determining whether or not to make the entire ViewFits movie and write it to the data directory, or to go into debug mode and allow the user to click through frames and inspect them there. Set to true make the entire movie and save it, and set to false to enter debug mode. Default is true.

'autoscale_on' is a Boolean determining whether or not to set the grayscale frame-by-frame or use a single grayscale for the entire movie. If using the entire movie 100 equally spaced frames are taken from the movie to set the grayscale. Set to true set the grayscale frame-by-frame, and set to false to use one for the entire movie. Default is false.

'trackingVF' is a Boolean determining whether or not to use the "standard" ViewFits format showing guesses, fits, and the track filter, OR to show only color coded tracks. Set to true to make the tracking ViewFits movie, and set to false to make the "standard" ViewFits movie. Default is false.

8.2 ViewFits color scheme

For the "standard" ViewFits a green circle indicated a goodfit, a red circle indicates a guess that didn't pass the goodfit checks, and a pink circle indicates a molecule that passed the track filter. An example frame of a ViewFits movie is shown in Fig. 2

For the tracking ViewFits movie, the circles only indicate molecules which were successfully organized into tracks. Colors indicate unique tracks. For simplicity there are only five unique colors that are simply cycled through. An example frame (same movie and frame number as in Fig. 2) of a tracking ViewFits movie is shown in Fig. 3. Note: Two molecules in the same frame will never be organized into the same track, so when, as is the case in Fig. 3 there are multiple molecules in one frame with the same color they are indeed in different tracks.

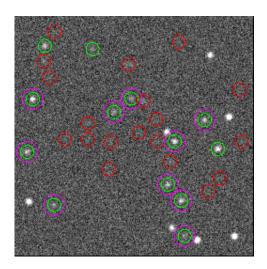


Figure 2: ViewFits frame. Note: this movie had several molecule shaped objects in the background, those aren't missed molecules but actually the background.

9 Speed and Memory Troubleshooting

SMALL-LABS is generally a fairly fast and memory efficient program, however a number of steps can be taken to make it faster or more memory efficient if that is needed.

Use smaller movies. Obviously using smaller movies will require less memory and time to analyze them. You can use the provided program $ROI_picker.m$ to pick a smaller region of interest (ROI) within your original movies. If you consistently run out of memory in SMALL-LABS you have to either increase the memory of your computer or analyze the movie as several smaller movies.

Analyze fewer molecules. Every molecule guessed has to be analyzed, this includes creating an off-frames list, subtracting the True Background, and fitting, thus increasing the number of guessed molecules adds a lot more computations which need to be performed. If you reduce the number of guesses, this can greatly reduce the time to run the program. You can accomplish this by increasing bpthrsh, but be careful not to increase it so much that you miss molecules. You can also increase egdesz to skip fitting molecules near the edge of the frame (which may not be meaningful). Finally using least squares fitting is much faster than MLE fitting, setting 'MLE_fit' to false accomplishes this.

Don't make a ViewFits movie. The optional step to make a ViewFits movie is fairly slow. If analyzing a batch of movies it's recommended to do all of the analysis first and then separately make ViewFits movies only for a few representative movies.

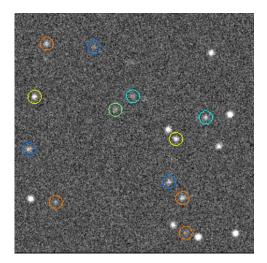


Figure 3: Tracking ViewFits frame. Note: this movie had several molecule shaped objects in the background, those aren't missed molecules but actually the background.

Use parallel computing. If you don't have the Parallel Computing Toolbox for Matlab, installing it allows SMALL-LABS to parallelize some steps. Additionally, running SMALL-LABS on a computer with a CUDA enabled GPU will allow the fitting step to proceed much faster.

10 Additional Programs Provided

In this package there are a number of additional programs provided which are not needed for the main operation of SMALL-LABS. The following are short descriptions of these programs; for additional details see the comments at the beginning of each program.

Change_GoodFits.m is a function which can be run after fitting to change the goodfit parameters (maxerr and stdtol) and also change dfrlmsz and consequently which fits are considered goodfits. This is much faster because it allows you to experiment with these parameters without having to fit the movie again.

ROI_picker.m is a function which allows you to pick an ROI in a series of movies and write a new TIFF stack movie of just that ROI⁴. This is helpful because it allows you to reduce the size of the movies being analyzed which will decrease how long it takes to analyze them.

 $stack_tiffs.m$ is a function which converts a folder of individual TIFF images into a single TIFF stack. By using TIFFStack and saveastiff it is

⁴At the time of writing it still saves the data as a TIFF stack, but will likely be soon updated to save .mat files instead.

fairly fast.

WriteListOfMovies.m gives an example of how to write such a list of movies using Matlab to be analyzed as a batch in SMALL-LABS. The beginning section of that script takes advantage of a specific naming convention for the movies (each is named mov_xxxx.mat), which likely won't be useful to your data, but it can be a good starting point for writing your own script.

In the Test data and simulations directory, there two programs for generating and working with simulated data:

Simulate Data Poisson.m is a simple script to simulate single-molecule data with various backgrounds. It generates data with Poissonian noise.

Check_Fitting_Simulated.m is a script which can be used to check how accurately simulated data was fit.

11 The modularity of this code

SMALL-LABS is written as modular code. It was designed so that different parts of the code can be easily modified or even completely replaced. Throughout the code we've tried to copiously comment and, in particular, explain the inputs and outputs of the various steps and functions. This should help make any modifications or replacements simpler to implement.

In particular, I anticipate users may wish to utilize a specific guessing (detection) method or specific fitting method. For example if a non-Gaussian PSF is desired then the provided fitting functions won't be helpful and the guessing algorithm may not work. By simply modifying those two steps SMALL-LABS should still function and accurately subtract the local background.

To modify the guessing step, the simplest approach would be to replace the entire guessing function. The function should output the guesses in the same format as the provided function, which is as a .mat file using the same naming convention, and with an array called guesses that has columns 1. frame #, 2. row position (pixels), 3. column position (pixels).

To modify the fitting step, the simplest approach would be to add another if statement in the fitting section in *Subtract_then_fit.m*. In this new section fit the same array as in the other sections, called dataset. Then enter the fit results into the fits structure using the column definitions described in the introduction of this guide. Note that the goodfit checks will likely need to be modified to be appropriate for the new fitting method.

A List of all optional parameters

All optional inputs are input as name-value pairs, for example to set 'bpthrsh' to 93 include 'bpthrsh', 93 in the function call to $SMALLLABS_main.m$. This is a complete list of all the optional parameters and their default

values, a duplicate list is in the comments in the beginning of $SMALL-LABS_main.m.$

SMALL-LABS prints to the command window for every step it takes. If you want to disable this feature, edit *SMALLLABS_main.m* and change the line verbose=true (immediately preceding the %%Parameter Defaults section) to verbose=false.

A.1 Actions

```
Do background subtraction
'bgsub'= true
Make the average subtracted movie
'makeAvgsub'= true
Do guessing
'guessing'= true
Check the guesses
'checkGuesses'= false
Make the off frames list
'makeOffFrames'= true
Do fitting
'fitting'= true
Do tracking
'tracking'= true
Make the ViewFits movie
'makeViewFits'= true
```

A.2 AVGSUB parameters

```
Subtract the temporal average? otherwise use median 'do_avg'= true AVGSUB offset 'offset'= 1000
```

A.3 Guessing parameters

```
the threshold percentile of the bandpassed movie
'bpthrsh'= 95
how many pixels to ignore around the edge of the frame
'egdesz'= dfrlmsz
compare brightnesses in each frame? otherwise use entire movie
'pctile_frame'= false
use a mask for guessing? Enter it's filename or set to true to look for .mat
file w/ "_PhaseMask" appended to movie name
```

```
'mask_fname'= []
make a movie (.avi) of the guesses to check parameters
'make_guessmovie'= false
```

A.4 Fitting parameters

```
do MLE fitting? If not least squares fitting will be used
'MLE_fit'= false
Goodfit parameters. See Subtract_then_fit.m for the details
'stdtol'= 1.5
'maxerr'= 0.10
subtract the mean of off frames? If not use median
'do_avgsub'= true
Which Gaussian function to fit to when using fitting? 1. symmetric, 2. fixed angle asymmetric, 3. free angle asymmetric
'which_gaussian'= 1
the angle to fit to for a fixed angle Gaussian
'fit_ang'= 0
use a GPU if one is a available?
'usegpu'= true
```

A.5 Tracking parameters

```
save the separate tracks .mat file?
'savetracks'= false
'trackparams' needs to be entered as a whole vector, the default is [0.01,200,0.5,3,3,1,0]
minimum merit
trackparams(1)=0.01
Integration time (ms)
trackparams(2) = 200
gamma
trackparams(3) = 0.5
maximum step size
trackparams(4)=3
minimum track length
trackparams(5)=3
speed estimation window halfsize
trackparams(6)=1
time delay between consecutive frames (ms)
trackparams(7)=0
```

A.6 ViewFits parameters

```
use the original movie? if not, use the avgsub movie
'orig_movie'= true
diameter of the circles showing the fits
'circ_D'= dfrlmsz
linewidth of the circles
'linewidth'= 1
write a .avi movie showing the fits. If not, goes to debug mode
'write_mov'= true
autoscale frame by frame?
'autoscale_on'= false
use the tracking viewfits instead
'trackingVF'= false
```

B The goodframe list

SMALL-LABS has a built-in functionality to ignore specific frames. This is accomplished using the goodframe vector, which is a logical vector whose length is equal to the number of frames in the movie (giving a one-to-one correspondence between each frame in the movie and an element in goodframe). Unless given a goodframe list SMALL-LABS assumes all frames are to be used.

To input a goodframe list, simply save the goodframe vector to the mat file containing the movie (mov array). The goodframe vector needs to be a logical vector, meaning either logical type variable or all of it's elements must be convertible to logical (0 & 1, etc.).

C Coordinate System

SMALL-LABS runs entirely in Matlab, and as such the coordinate system used is the most meaningful for Matlab arrays. Instead of returning x & y positions in some arbitrary coordinate system, SMALL-LABS uses, and returns, coordinates in row and column position using Matlab conventions for rows and columns and the origin. Throughout most of the program, the row and column numbers (integers) are tracked. The fitting step, which provides sub-pixel information, returns a non-integer row and column position. For example, fitting a guess at (r,c) = (41,153) may yield a position of (r,c) = (42.0597,153.9108).

For a more detailed tutorial on the coordinate system in Matlab and how it relates to the "normal" convention used in a Cartesian coordinate system, and also the coordinate system used in ImageJ (a free commonly used image viewer and analysis program), see the pdf included in this repository titled

D Example movie list file

To send a list of movies to SMALL-LABS enter the .txt file containing the list as the first input file_or_directory_name. The .txt file should have the full filename (e.g., directory\moviename.ext) for each movie on a separate line. For example to analyze the following list of movies

```
L:\Microscope Data\2_29_18\mov_001.mat

E:\Microscope Data\2_29_18\mov_002.mat

E:\Microscope Data\2_29_18\mov_003.mat

E:\Microscope Data\2_29_18\mov_005.mat

E:\Microscope Data\2_29_18\mov_008.mat

E:\Microscope Data\2_29_18\mov_013.mat

E:\Microscope Data\2_29_18\mov_021.mat

E:\Microscope Data\2_29_18\mov_034.mat

E:\Microscope Data\2_29_18\mov_034.mat

E:\Microscope Data\2_29_18\mov_055.mat

E:\Microscope Data\2_29_18\mov_089.mat

E:\Microscope Data\2_29_18\mov_089.mat

E:\Microscope Data\2_29_18\mov_089.mat
```

simply enter

```
>>SMALLLABS_main('list_file.txt', 7, 300, 100,)
```

The optional script WriteListOfMovies.m gives an example of how to write such a list of movies using Matlab. The beginning section of that script takes advantage of a specific naming convention for the movies (each is named mov_xxxx.mat), which likely won't be useful to your data, but it can be a good starting point for writing your own script.