

Deep Learning Traction Force Microscopy

Software Installation

1. MATLAB and its Deep Learning Toolbox. MATLAB must be version 2019a or newer with the support for 3D convolution deep learning layer.
2. ImageJ or Fiji.
3. Iterative particle image velocimetry plugin for ImageJ, from <https://sites.google.com/site/qingzongtseng/piv>. Need to install system-dependent library file, OpenCV and javacv, as described in the sections of Downloads and Installation of the web page. See also the tutorial at <https://sites.google.com/site/qingzongtseng/piv/tuto>
4. Files for deep learning traction force microscopy from <https://github.com/yuliwang8177/DL-TFM>

Procedure

1. Plate cells on polyacrylamide substrates embedded with 0.2 μm diameter fluorescent beads. To prepare the substrate, see Polyacrylamide Sheets as Cell Culture Substrates at <https://yuliwang.bme.cmu.edu/Methods/Materials/Artificial%20Materials/PAAsubstrates.pdf>. Density of the beads should be one bead per 5x5 to 10x10 pixels under a 40x objective lens.
2. Acquire a bead image underneath a cell using a 40x objective lens. The image should be focused near the surface of the substrate. The cell should be entirely within the imaging. Also acquire a phase contrast image of the cell that shows cell border clearly.
3. Without changing the position of the sample, remove the cells (e.g., with trypsin solution), and acquire a bead image after moving the cell and its traction forces.
4. Place the two bead images in a stack in ImageJ (Image->Stacks->Images to Stack). The first slice of the stack should be the bead image after cell removal.
5. Align the two bead images as much as possible based on a motif of beads far away from the cell. See for example <https://sites.google.com/site/qingzongtseng/template-matching-ij-plugin/tuto2>
6. Crop the two bead images at identical locations to a square shape of NxN pixels where N must be a multiple of 104, 160 or 256. The cell should be entirely within the cropped area with a margin of 10-20 pixels all around. The multiplication factor should be between 5 and 10. If this is not possible due to the limited number of camera pixels, then crop the image to a multiple of 52, 80, or 128 pixels.
7. Crop the phase contrast image in the same way without including it in the stack. Using the polygon selections tool of ImageJ, trace cell border in the phase contrast image as a single closed polygon. Save the trace as "XY Coordinates ...", to generate a text file with X coordinates occupying the first column and Y coordinates occupying the second column.
8. Run ImageJ Plugins -> PIV -> iterative PIV (Basic). See the attached example for setting parameters. PIV3 interrogation window size should be 2x the multiplication factor in step #6. PIV2 interrogation window size should be 2x PIV3 interrogation window size, and PIV1 interrogation window size should be 2x PIV2 interrogation window size. Search window size should be 2x to x the corresponding PIV interrogation size.
9. Run the function pivToDspl in the piv-ftc folder of the package, in the format of dspl = pivToDspl (pivFn, sz, spacing) where pivFn is the file generated by the above plugin, sz is N for an NxN output array of PIV, spacing is the multiplication factor in step #6. An (N/spacing) (N/spacing) x 2 dense array should be created in the Workspace, where the first plane carries X components of the displacement and second plane carries Y components.

10. Run the function `txtToBrd` to generate the array for cell border, in the format of `[brdx, brdy] = txtToBrd (brdFn, sz, spacing)`, where `brdFn` is the file of cell border generated in step #7, `sz` is the size N of $N \times N$ image used for tracing, `spacing` is the multiplication factor in step #6.
11. Run the function `filtDspl` in the main folder, in the format of `dsplFilt = filtDspl(dspl, brdx, brdy, 15, 3, 9, 3.5)`, where `dspl` is the tensor generated by step #9, `brdx` and `brdy` are border coordinates generated by step #10. The last four arguments control the noise filtration behavior and may be optimized by trial and error. The first argument (15) is the distance from cell border separating the near and far field. The second and third arguments (3, 9) specify the orders of median filter for filtering the near and far displacement fields. The last argument is a filtration threshold for the gradient of displacements, applied throughout the displacement field. If a displacement vector shows a drastic change relative to neighboring displacements, then it will be replaced with the average of neighboring vectors.
12. If the displacement field from #9 is at half size (52x52, 80x80, or 128x20 pixels), then generate full-size field from the output of step #11, using MATLAB `interp2` function. See the short program `80To160.m` as an example for generating 160x160 displacement field from a 80x80 field. Also generate the corresponding border coordinates by repeating step #10, using a spacing that is half that in step #6.
13. Run the function `predictTrac` in the main folder, in the format of `trac = predictTrac(dspl, E)`, where `dspl` is the filtered displacement field from step #12, `E` is Young's modulus of the substrate. The output, `trac`, is a tensor of traction stress field of the same size as displacement tensor, where the first plane carries X components of the stress and second plane carries Y components.
14. Traction stress field may be visualized using the `plotTrac` function in the main folder, in the format of `plotTrac(trac,brdx,brdy,scale,thinning)`, where `trac` is the traction tensor generated by step #13, `brdx` and `brdy` are border coordinates generated by step #10 or 12. The argument "scale" controls the lengths of vectors and `thinning` allows a lower density to be plotted than plotting at every pixel.

(All sizes are in pixels)

1st pass PIV parameters:

PIV1 interrogation window size

(If search window size=window size, conventional xcorr will be used)

SW1 :search window size

2nd pass PIV parameters: (set window size to zero to do only 1pass PIV)

PIV2 interrogation window size

SW2 :search window size

3rd pass PIV parameters: (set window size to zero to do only 2pass PIV)

PIV3 interrogation window size

SW3 :search window size

correlation threshold