

SAFT - Semi-automatic fluorescence trace analysis

The purpose of SAFT is to automate some steps in analysis of recordings of synaptic activity, namely fluorescence time series corresponding to the emission of a neurotransmitter indicator. The steps that can be automated are background subtraction and peak finding. The user can tune both of these algorithms, and check the consequences interactively. The main workflow is directed towards recordings that come from different 'regions of interest' ('ROIs') over the same neuron that is stimulated in a regular fashion. The stimulus protocol is not known, but is inferred from the statistics of the mean responses. This makes analysis possible in a coordinated and efficient way over multiple conditions using the same parameters.

Installing

SAFT is written in Python, but basic Python is not enough. SAFT has quite a few dependencies, meaning external Python libraries that must be downloaded. These are for calculations (`numpy` and `scipy`), data management (`pandas`) and the GUI (`PySide2` and `pyqtgraph`). You need the versions below at time of writing. Unfortunately, some unclear incompatibilities mean that some more modern versions of the relevant packages do not work.

Getting all these packages aligned is not easy. You can use `anaconda`, `pip` or compile from source. It is best to start with a fresh environment.

Conda currently provides Qt 5.9.7 and this makes it convenient to use conda to set up the package environment. To make getting the right environment in place easy, we include a conda environment `.yml` file in the distribution (`SAFTenv.yml`). To use this, you must have Anaconda or Miniconda. If you don't have Anaconda already, just get [Miniconda](# <https://docs.conda.io/projects/continuumio-conda/en/latest/user-guide/install/macos.html>).

To install the packages needed for SAFT into a fresh environment with Miniconda, go to the SAFT directory and enter the following in the Terminal,

```
conda env create --file SAFTenv.yml
```

This will create an environment called 'SAFT' with a working set of packages. As conda will tell you, to switch to this environment, enter the following,

```
conda activate SAFT
```

then navigate to the SAFT directory and execute the commands as above to launch SAFT.

If you happen to already have an environment named SAFT, you would need to remove it first:

```
conda env remove --name SAFT
```

Very important : Qt versions after 5.9 are not open source (breaking the conditions of our license), and coincidentally have serious bugs on macOS. We need Qt for the high-performance scientific plotting library `pyqtgraph`. `PySide2` versions up to 5.15 seem to run happily with Qt 5.9.7 but it may be difficult to avoid a concurrent Qt update, unless you have a separate version of Qt compiled from open source and know how to point `PySide2` at it. The latter solution is not stable.

Dependencies current as of 2020-11-12

```
Python 3.7.9
qt==5.9.7
PySide2>=5.9.0a1
numpy==1.19.2 scipy==1.5.2
pyqtgraph==0.11.0
pandas==0.24.0
matplotlib==3.3.2
xlrd==1.2.0
```

```
openpyxl==3.0.5
pyobjc-framework-Cocoa==6.2.2
python.app 2
```

To get SAFT as intended, launch it with the command from the directory where you unpacked it:

```
pythonw SAFT.py
```

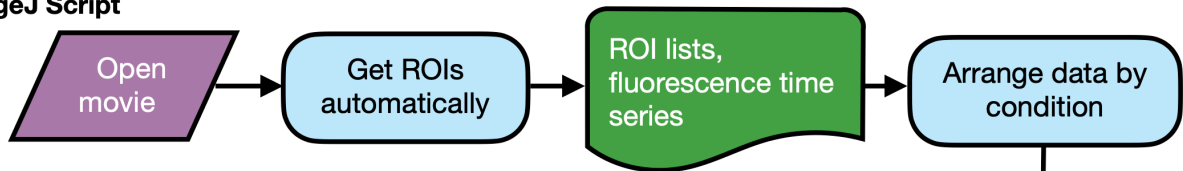
After launching SAFT, you are confronted with the main window, 'Semi-automatic Fluorescence Trace analysis'. A few commands are in the menu bar, but the advanced controls are presented directly in the interface.

The image shows the SAFT software interface with several callouts explaining its features:

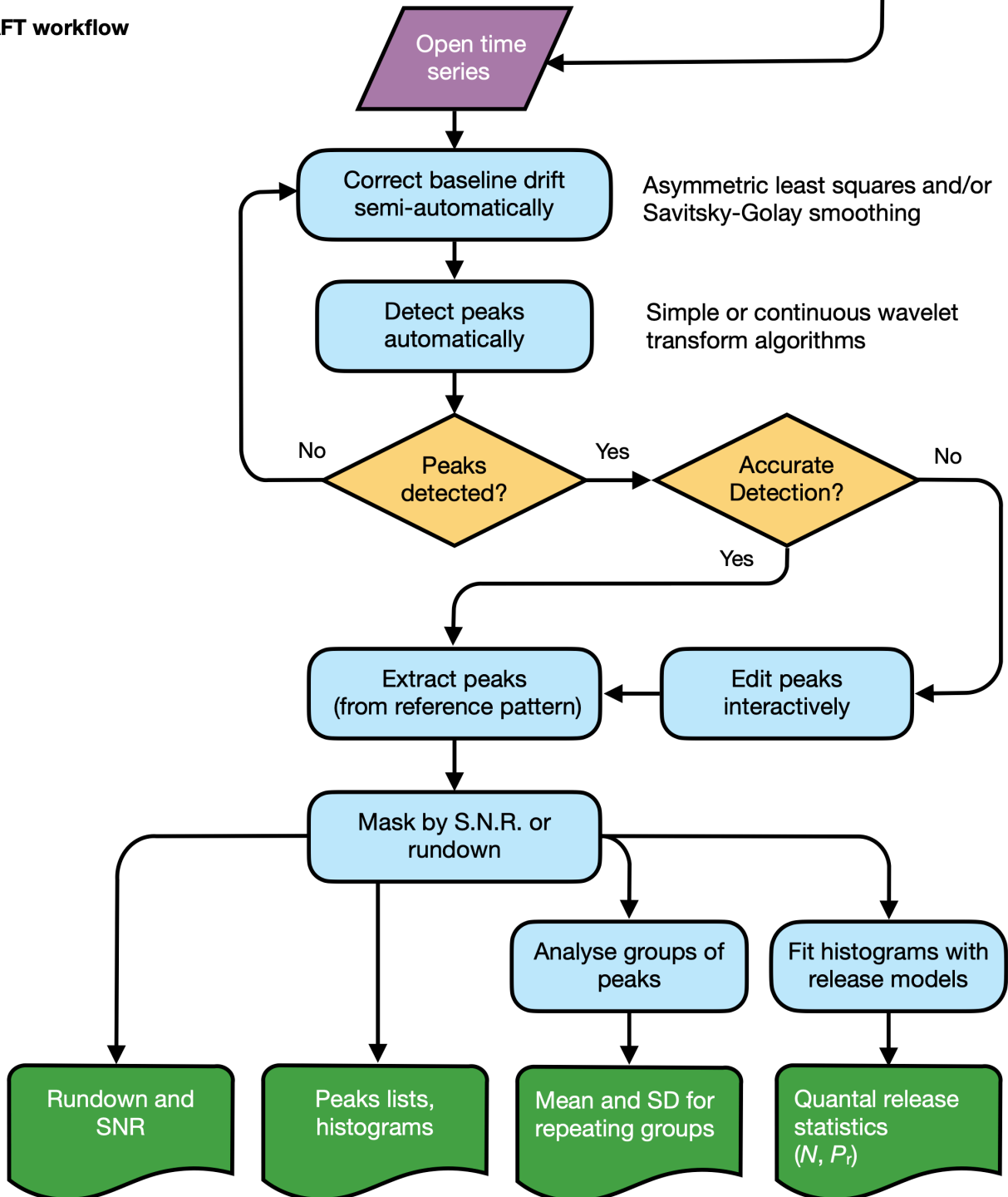
- Viewing controls, select dataset to analyse**: Points to the 'Data display and processing' panel on the right, which includes options for 'Load traces', 'Dataset' (SAFT_Data), 'Select ROI' (Mean), and radio buttons for 'Combined traces' and 'Split traces'.
- Select ROI, or mean or variance traces**: Points to the 'Select ROI' dropdown menu.
- Split the traces to see them separately**: Points to the 'Split traces' radio button.
- Choose the reference condition**: Points to the 'Reference condition for pattern extraction' dropdown menu, which is set to '4 mM'.
- Launch analysis wizards**: Points to the 'Extract peaks from all ROIs' and 'Extract grouped responses' buttons.
- Controls for automatic baseline removal**: Points to the 'Automatic baseline cleanup' section, including 'Baseline removal?' (Auto), 'p', 'Save baselined ROI traces', and 'lambda'.
- Select trace to show in zoom window**: Points to the 'Savitzky-Golay smoothing' section, including 'Off' and 'Window 15'.
- Auto peak finding controls**: Points to the 'Peak finding and editing' section, including 'Show 4 mM in zoom.', 'Auto find peaks', 'Auto-find peaks with wavelet algorithm.', 'Prominence / SNR 1.3', 'Width (wavelet only) 6', 'Ignore peaks < 30% of largest.', 'Show current peak data', and 'Save peak data'.
- Auto peak finding controls**: Points to the 'Histogram options' section, including 'Show histograms Separated', 'dF/F max 1', 'Fit Histograms', 'No. of bins 100', 'No. of Gaussians 5', 'Save Histograms', and 'dF ('q') guess 0.05'.
- Detected peaks are marked with squares**: Points to the zoomed-in trace plot where peaks are marked with small blue squares.
- Live histogram: peaks for this ROI**: Points to the histogram plot in the top left, which shows the distribution of peaks for the selected ROI.
- Auto/Manual peaks selection**: Points to the zoomed-in trace plot where a peak is being manually selected.
- Trace-locked crosshair for manual peak editing**: Points to the crosshair in the zoomed-in trace plot.
- Grey traces show the subtracted background**: Points to the 'Traces and background subtraction' plot, where grey traces represent the background after subtraction.
- Histogram Display and optional quick fits**: Points to the histogram plot in the top left.

SAFT main window with data file loaded.

ImageJ Script



SAFT workflow



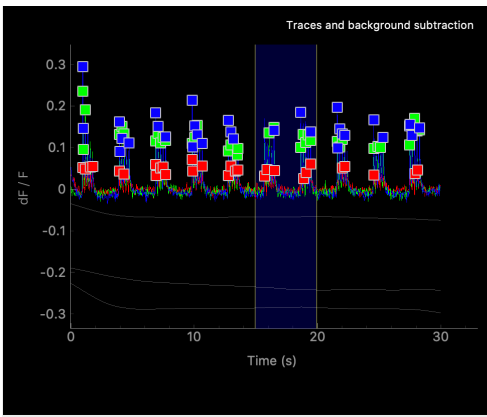
SAFT expects a set of time series as input. Current input format accepted is Excel. You can export from LibreOffice if you do not like Microsoft.

SAFT has four windows for analysing the peak responses.

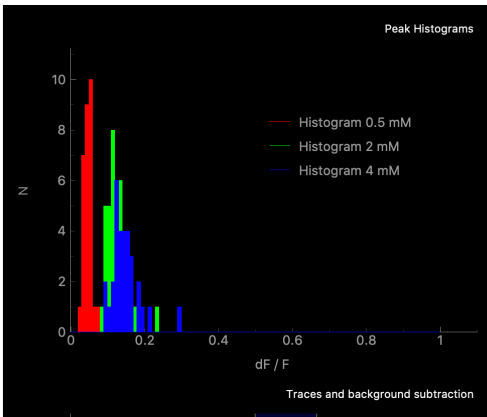
1. Main window (`SAFT.py`) for loading trace data and identifying the position of peaks, removing baseline. This window also shows histograms of the peak data.
2. Peak extraction dialog (`extractPeakResponses.py`, opened by 'Extract peaks from all ROIs' button in the main window) for extracting peak data from known timepoints across a large number of ROI and sets. Automatic baseline correction is done. On completion and return to the main window, the peaks can be seen (as well as failures), edited and compared with the baseline subtracted traces.
3. Group peaks dialog (`processGroupedPeaks.py` called by the "Extract group responses" button in the main window) where you can get statistics for repetitive responses, for example, if you repetitively stimulate with trains, you can get the average and SD of the 2nd, 3rd, nth response in the train. Data, including automatically generated graphs, can be saved here. This kind of analysis is quite easy to do in Excel for example, but takes a lot of cutting and pasting, which is time consuming and leads to errors.
4. Histogram fitting (`histogramFitDialog.py` which is opened by the 'Launch Histogram Fit' button) in which you can fit histograms with binomial and poisson models of vesicle release, if they represent quantal responses. Global fitting of models across conditions can also be done. No allowance is made for reporter characteristics, such as non-linearity.

To get started, load the file `SAFT_Data.xlsx` using the `File > Open File` command. These traces were automatically extracted from movies in imageJ using the `SNFR_ROI_Finder.ijm` script (written by Benjamin König). This script is also in the repository.

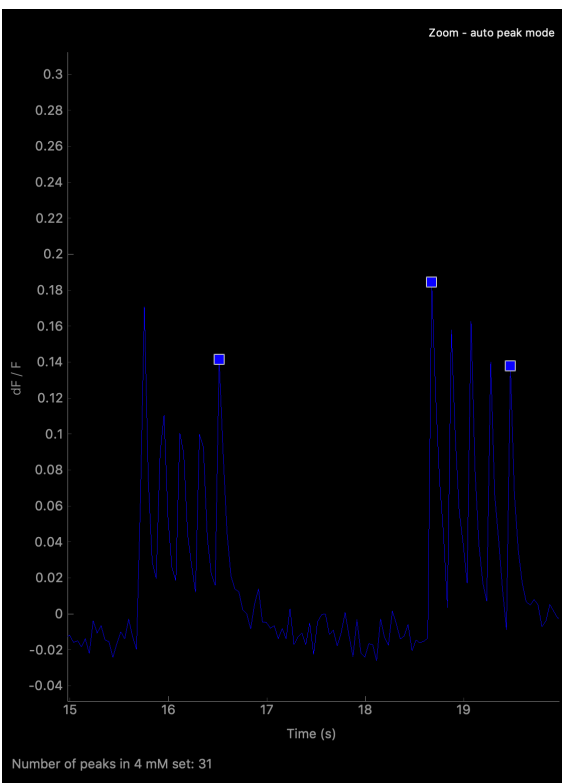
Traces load and are automatically colour-coded. Three panels show the entire traces for each condition with the baseline correction plotted separately ('Traces and background subtraction', bottom left), a zoom into a chosen trace ('zoom', the scope is indicated by the blue translucent region in the bottom left panel) and histograms of automatically found peak responses (upper right).



On the left hand side of the main window, a small graph shows all the traces overlaid and the automatically subtracted baselines. You can see here how “wobbly” the subtraction is. If you don’t want to subtract the steady-state response of the indicator, it should be smooth.



There is also a panel that shows you the live histograms of the peak responses for each trace in the current ROI.



In the centre, the zoom graph displays the trace (select which one in the “Peak finding and editing panel”). You can adjust the peak finding controls to collect the most peaks automatically - these are overlaid as square points on the trace, then switch to manual mode. A left click will add a peak, or remove it if you click on an existing one. You can look at any ROI but SAFT will use the “Mean” ROI for a reference (you can choose which condition in “Data display and processing”).

When you are happy that all the peak locations are accurately specified, you can launch “Extract peaks from all ROIs”.

On the right side of the main window, a set of panels gives you control over analysis and data display. These controls are divided into four sections:

'Data display and processing'

The dataset takes the name of the file, and you can select which ROI to view. Two automatically generated virtual ROIs, the mean and the variance are also viewable.

Here, a panel of some buttons give easy access to downstream analysis windows, saving data and you can choose which trace from the virtual ROI 'Mean' you want to use as the reference

'Automatic baseline cleanup'

Baseline removal can be switched on ('Auto'), off ('None') or locked with fixed parameters ('Lock'). Datasets generated following analysis will automatically turn off baseline removal. The baseline removal can be tuned with the p and λ (length) scale controls. The lower the value of λ , the shorter the region of a steady state response that will be removed. The baseline that is subtracted is drawn in the bottom left graph panel. Savitsky-Golay smoothing is also implemented but did not yet work well in out hands.

'Peak finding and editing'

Select which condition to show in the zoom graph panel (here it's the '4 mM' condition). You can switch between auto peak finding, and manual editing of peaks with the mouse. If you switch to manual editing, a crosshair appears and you can click to mark peaks (squares). Click any square to remove it. If *Auto find peaks* is enabled, you can choose between a simple threshold method and the wavelet algorithms. Parameters like *Prominence* (for the simple algorithm) or *SNR* and *width* for the wavelet algorithm can be adjusted. You can optionally ignore any small peaks too. There is a button ('*Show current peak data*') to give a quick popup of the underlying values.

'Histogram options'

There is an option to sum the histograms, which makes sense if the quantal size is consistent across conditions. The scale of the histogram display can be controlled here. There is also the option to fit the histograms with simple functions.

The screenshot displays the SAFT main window control panel, organized into several sections:

- Data display and processing:** Includes a 'Load traces' button, a 'Dataset' dropdown set to 'SAFT_Data', a 'Select ROI' dropdown set to 'Mean', radio buttons for 'Combined traces' (selected) and 'Split traces', a 'Reference condition for pattern extraction' dropdown set to '4 mM', and buttons for 'Extract peaks from all ROIs', 'Extract grouped responses', and 'Quantal Histogram Fit'.
- Automatic baseline cleanup:** Features a 'Baseline removal?' dropdown set to 'Auto', a slider for parameter p , a 'Save baselined ROI traces' button, a slider for parameter λ , and a 'Savitzky-Golay smoothing' dropdown set to 'Off' with a 'Window' dropdown set to '15'.
- Peak finding and editing:** Shows a 'Show' dropdown set to '4 mM' and 'in zoom.' radio buttons for 'Auto find peaks' and 'Edit peaks with mouse' (selected). It includes 'Auto-find peaks with' dropdown set to 'wavelet' and 'algorithm.', 'Prominence / SNR' set to '1.3', 'Width (wavelet only)' set to '6', and 'Ignore peaks <' set to '30 %' of largest. Buttons for 'Show current peak data' and 'Save peak data' are present.
- Histogram options:** Includes a 'Show histograms' dropdown set to 'Separated', a 'dF/F max' spinner set to '1', a 'Fit Histograms' checkbox, 'No. of bins' set to '100', 'No. of Gaussians' set to '5', a 'Save Histograms' checkbox, and 'dF ('q') guess' set to '0.05'.

SAFT main window control panel

Extract Peaks according to a reference pattern

Extracting 46 peaks from [28 28 28] ROIs (total 3864)
over the sets named 0.5 mM, 2 mM, 4 mM

Skipping 0 traces out of 84 for low SNR. 3

Search range around peak (data points) 3

Treat peaks as failures when < SD x 1.5

No peaks set to be failures.

Extract responses Cancel Accept and Return

The number of peaks in each trace, the number of traces (ROIs) and the theoretical maximum total of peaks to find over the entire set of conditions is shown. You can choose to skip individual traces on the basis of the signal to noise. You can adjust the range in each trace to search for a maximum around the peak location.

Extracting 46 peaks from [28 28 28] ROIs (total 3864)
over the sets named 0.5 mM, 2 mM, 4 mM

Skipping 18 traces out of 84 for low SNR. 5

Search range around peak (data points) 3

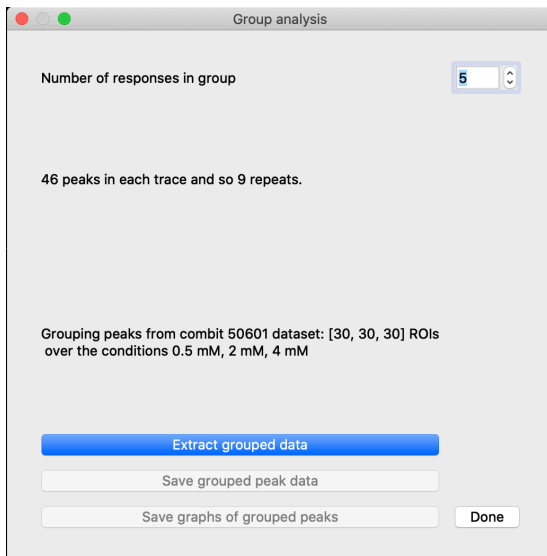
Treat peaks as failures when < SD x 1

451 peaks set as failures (11.7% of total).

Extract responses Cancel Accept and Return

Once you have clicked “Extract responses”, you have the option to treat detected peaks as “failures”, that is, set their amplitude to zero, when they are less than the SD x factor. The lower this value, the more peaks you will discard. The dialog tells you the number that were set to failures and the fraction.

When you click “Accept and Return”, you go back to the main window and a new dataset corresponding to the detected peaks (with the baseline-subtracted traces) is created. Some controls are disabled for this dataset. You can use it for analysing the responses according to repetitive groups and the statistics of the peak amplitudes in “*Histogram Fitting with Quantal parameters*”

Extract grouped responses

If each trace corresponds to repetitive grouped responses, for example trains of 5 action potentials, you can analyse these groups and get the mean of the first response in the group, second response in the group etc as well as their standard deviation. This can be useful for comparing to synaptic transmission measured with electrophysiology.

You select how many responses are in each group and the dialog will then indicate how many repeats are found.

You can only save the results of this analysis directly from the “*Group analysis*” dialog

Histogram Fitting with Quantal parameters

One goal of optical reporting is to gain access to quantal parameters from a large number of synapses at once. To do this, the peak amplitude distributions can be fitted with different models of vesicle release.

The screenshot displays the SAFT software interface for histogram fitting. It features three stacked histograms for different conditions: 0.5 mM (red), 2 mM (green), and 4 mM (blue). Each histogram shows the number of events (N) versus the change in fluorescence (dF/F). The interface includes several control panels and a results table.

Fit Results Table:

ROI	Fit	Pr	K-S	Pr	Pr	Pr	Pr	Pr	Pr	
ROI19	axqa	6	0.193	0.453	0.032	0.067	KS	0.200	0.032	GB
ROI19	axqa	6	0.431	0.453	0.032	0.067	KS	0.165	0.118	GB
ROI19	axqa	6	0.351	0.453	0.032	0.067	KS	0.114	0.502	GB
ROI19	gewd	6	0.183	0.800	0.041	0.071	KS	0.207	0.024	GB
ROI19	gewd	6	0.390	0.800	0.041	0.071	KS	0.161	0.133	GB
ROI19	gewd	6	0.371	0.800	0.041	0.071	KS	0.193	0.042	GB
ROI19	yghb	5	0.191	0.866	0.042	0.091	KS	0.265	0.001	GB
ROI19	yghb	5	0.369	0.866	0.042	0.091	KS	0.181	0.067	GB
ROI19	yghb	5	0.340	0.866	0.042	0.091	KS	0.167	0.111	GB
ROI19	vvjs	4	0.232	0.848	0.041	0.092	KS	0.260	0.002	GB
ROI19	vvjs	4	0.445	0.848	0.041	0.092	KS	0.165	0.116	GB
ROI19	vvjs	4	0.402	0.848	0.041	0.092	KS	0.153	0.172	GB

The histograms of peak responses for one region of interest are shown. The X- and Y-axis scales are automatically the same for each. You can reset these with the mouse or the histogram controls. You can also choose to display the histograms summed into a single histogram of peaks or separated by condition.

Binomial statistics assume a finite (small) pool of independent vesicles, and from this, you can estimate the release probability (P_r). Poisson statistics assume an infinite pool, but in doing so, one less parameter is needed to describe the shape of the distribution. However, the “rate” of release that is obtained from Poisson fit is harder to interpret than the release probability.

SAFT also offers the opportunity to fit the summed histogram, to find the width (w) and quantal spacing (called ‘dF(q)’ in the interface). You can also fix the Gaussian width, w , to be the same as the SD for the baseline of the trace (peaks are automatically blanked for this calculation). For some as yet incomprehensible reason, using the SD for the baseline seems to give Gaussian functions that are wider than expected.

When you do a fit, you choose the number of Gaussian components - this is not optimised. If you choose a global fit, the quantal spacing and width is taken to be the same for each condition. The width can be optimised.

Fit results are autosaved to a file HFtemp.xlsx in the SAFT directory every time you change ROI. If you click “save”, you get to pick a filename. Tick the box to save the fitted curves in the same excel file in a separate sheet.