# A Method for Quantifying Molecular Interactions Using Stochastic Modelling and Super-Resolution Microscopy

#### Supplementary Information

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Flowchart of algorithm to generate IF simulation. First, clusters of one color are placed randomly on the image. Then, clusters of the second color (reference color) are placed according to the flowchart. Workflow is repeated for each cluster in the experimental image.



Effects of increasing the size and number of green clusters in the calculation of R-G IF

(a) Plots of the percentage of green overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing green cluster number for R-G IF = 0 (i) and IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that the percentage of green overlaps (Kruskal-Wallis H test: p = 0.60) and R-G IFs (Kruskal-Wallis H test: p = 0.35) remain constant with increasing green cluster number. (ii) Simulations for R-G IF = 0.9 show that the percentage of green overlaps (Kruskal-Wallis H test: p = 0.24) and R-G IFs (Kruskal-Wallis H test: p = 0.08) remain constant with increasing green cluster number (means and SD: n = 20 images per cluster number). (iii-iv) Plots of the percentage of green overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing green cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the percentage of green overlaps increases with increasing green cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (One-way ANOVA: p = 0.23). (iv) Simulations for R-G IF = 0.9 show that the percentage of green overlaps increases with increasing green cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (One-way ANOVA: p = 0.21; means and SD: n = 20 images per cluster number). (a)(i)-(iv) show that increasing green cluster number/size doesn't affect the calculated R-G IF.

(b) Heat maps of the R<sup>2</sup> calculated from plotting the simulated R-G IF vs calculated R-G IF for simulations with different green cluster number and sizes show that the error range is greater in images with low green cluster number and size (left; n = 20 images per IF). Heat maps of the R<sup>2</sup> calculated from plotting the mean simulated R-G IF vs mean calculated R-G IF for the same simulations as left (right; n = 20 images per IF).



Effects of increasing the size and number of red and green clusters in the calculation of R-G IF

(a) Plots of the percentage of green overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing green and red cluster number for R-G IF = 0 (i) and R-G IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that the percentage of green overlaps increases with increasing cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (Kruskal-Wallis H test: p = 0.06). (ii) Simulations for R-G IF = 0.90 show that the percentage of green overlaps increases with increasing cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (Kruskal-Wallis H test: p = 0.18; means and SD: n = 20 images per cluster number). (iii-iv) Plots of the percentage of green overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing green and red cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the percentage of green overlaps increases with increasing cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the percentage of green overlaps increases with increasing cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IF = 0.90 show that the percentage of green overlaps increases with increasing cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the percentage of green overlaps increases with increasing cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IF = 0.90 show that the percentage of green overlaps increases with increasing cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (Kruskal-Wallis H test: p = 0.54; means and SD: n = 20

images per cluster number). (a)(i)-(iv) show that increasing both green and red cluster number/size doesn't affect the calculated R-G IF.

(b) Heat maps of the R<sup>2</sup> calculated from plotting the simulated R-G IF vs calculated R-G IF for simulations with different cluster number and sizes show that the error range is greater in images with low cluster number and size (left; n = 20 images per R-G IF). Heat maps of the R<sup>2</sup> calculated from plotting the mean simulated R-G IF vs mean calculated R-G IF for the same simulations as left (right; n = 20 images per R-G IF).



#### Comparison of the R-G IF with other Measures

(a) Plots of the number of overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster number for R-G IF = 0 (i) and R-G IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that the number of overlaps increases with increasing red cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (ii) Simulations for R-G IF = 0.90 show that the number of overlaps increases with increasing red cluster number (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster number). (iii-iv) Plots of the number of overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the number of overlaps increases with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the number of overlaps increases with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the number of overlaps increases with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the number of overlaps increases with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size).

(b) Plots of the area of overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster number for R-G IF = 0 (i) and R-G IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that the area of overlaps increases with increasing red cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (ii) Simulations for R-G IF = 0.90 show that the area of overlaps increases with increasing red cluster number (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster number). (iii-iv) Plots of the area of overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the area of overlaps increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the area of overlaps increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the area of overlaps increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the area of overlaps increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the area of overlaps increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the area of overlaps increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size).

(c) Plots of the Mander's coefficient 1 for the red overlaps (M1: gray) and calculated R-G IF (red) for simulations generated with increasing red cluster number for IF = 0 (i) and IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that M1 remains constant with increasing red cluster number (Kruskal-Wallis H test: p = 0.79). (ii) Simulations for R-G IF = 0.90 show that M1 decreases with increasing red cluster number (Kruskal-Wallis H test: p < 0.79). (ii) Simulations for R-G IF = 0.90 show that M1 decreases with increasing red cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster number). (iii-iv) Plots of M1 (gray) and predicted R-G IF (red) for simulations generated with increasing red cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that M1 remains constant with increasing red cluster size (Kruskal-Wallis H test: p = 0.75). (iv) Simulations for R-G IF = 0.90 show that M1 decreases with increasing red cluster size (Kruskal-Wallis H test: p = 0.75). (iv) Simulations for R-G IF = 0.90 show that M1 decreases with increasing red cluster size (Kruskal-Wallis H test: p = 0.75). (iv) Simulations for R-G IF = 0.90 show that M1 decreases with increasing red cluster size (Kruskal-Wallis H test: p = 0.75). (iv) Simulations for R-G IF = 0.90 show that M1 decreases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size).

(d) Plots of the Mander's coefficient 2 for the green overlaps (M2: gray) and calculated R-G IF (red) for simulations generated with increasing red cluster number for R-G IF = 0 (i) and R-G IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that M2 increases with increasing red cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (ii) Simulations for IF = 0.90 show that M2 increases with increasing red cluster number (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster number). (iii-iv) Plots of M2 (gray) and calculated R-G IF (red) for simulations for R-G IF = 0 show that M2 increases with increasing red cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that M2 increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that M2 increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that M2 increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that M2 increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that M2 increases with increasing red cluster size (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size).

(e) Plots of the Pearson's coefficients (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster number for R-G IF = 0 (i) and R-G IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that the Pearson's coefficients remain constant with increasing red cluster number (One-way ANOVA: p = 0.09). (ii) Simulations for R-G IF = 0.90 show that the Pearson's coefficients change with increasing red cluster number (Kruskal-Wallis H test: p = 0.02) while R-G IFs remain constant (means and SD: n = 20 images per cluster number). (iii-iv) Plots of the Pearson's coefficients (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster size for R-G IF = 0 (ii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the Pearson's coefficients increase with increasing red cluster size (One-way ANOVA: p = 0.02) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the Pearson's coefficients increase with increasing red cluster size (One-way ANOVA: p = 0.02) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the Pearson's coefficients increase with increasing red cluster size (One-way ANOVA: p = 0.02) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the Pearson's coefficients increase with increasing red cluster size (One-way ANOVA: p = 0.02) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the Pearson's coefficients increase with increasing red cluster size (One-way ANOVA: p = 0.02) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the Pearson's coefficients increase with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size).

(f) Plots of the percentage of red overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster number for R-G IF = 0 (i) and R-G IF = 0.90 (ii). (i) Simulations for R-G IF = 0 show that the percentage of red overlaps remains constant with increasing red cluster number (Kruskal-Wallis H test: p = 0.58). (ii) Simulations for R-G IF = 0.90 show that the percentage of red overlaps decreases with increasing red cluster number (Kruskal-Wallis H test: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster number). (iii-iv) Plots of the percentage of red overlaps (gray) and calculated R-G IF (red) for simulations generated with increasing red cluster size for R-G IF = 0 (iii) and R-G IF = 0.90 (iv). (iii) Simulations for R-G IF = 0 show that the percentage of red overlaps increases with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant. (iv) Simulations for R-G IF = 0.90 show that the percentage of red overlaps increases with increasing red cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size (One-way ANOVA: p < 0.0001) while R-G IFs remain constant (means and SD: n = 20 images per cluster size).



Additional measurements for experimental datasets

(a) Number and total area covered by pDNA-PKcs and LigIV clusters. (i) The number of pDNA-PKcs clusters was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Student's t-test). (ii) The total area of pDNA-PKcs clusters was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Welch's t-test). (iii) The number of LigIV clusters was greater in the control compared to DNA-damaged group (\*\*p<0.01; Student's t-test). (iv) The total area of LigIV clusters was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Student's t-test). (iv) The total area of LigIV clusters was greater in the DNA-damaged group (\*\*\*\*p<0.0001; Student's t-test). Groups: control (n = 21) and DNA-damaged group (n = 29). Error bars represent 95 CI.

(b) Number and total area covered by pATM and LigIV clusters. (i) The number of pATM clusters in the control group was not significantly different from the DNA-damaged group (n.s. = not significant; p>0.05; Student's t-test) (ii) The total area of pATM clusters was not significantly different in the control compared to DNA-damaged group (n.s. = not significant; p>0.05;

Student's t-test). (iii) The number of LigIV clusters was not significantly different in the control compared to DNA-damaged group (n.s. = not significant; p>0.05; Student's t-test). (iv) The total area of LigIV clusters was not significantly different in the control compared to DNA-damaged group (n.s. = not significant; p>0.05; Student's t-test). Groups: control (n = 25) and DNA-damaged group (n = 13). Error bars represent 95 CI.

(c) Number and total area covered by BRCA1 and BRIP1 clusters. (i) The number of BRCA1 clusters was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Student's t-test). The total area covered by BRCA1 clusters was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Student's t-test). The number of BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). The total area covered by BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). The total area covered by BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). The total area covered by BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). The total area covered by BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). The total area covered by BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). The total area covered by BRIP1 clusters was greater in the DNA-damaged compared to control group (\*\*\*p<0.001; Student's t-test). Groups: control (n = 17) and DNA-damaged group (n = 18). Error bars represent 95 Cl.



Percentage of Overlaps and IF measurements when reference color is changed in experimental datasets

(a) LigIV and pDNA-PKcs measurements. (i) Percentage of pDNA-PKcs clusters overlapping with LigIV was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Welch's t-test). (ii) Interaction Factor (IF) between LigIV/pDNA-PKcs in control and DNA-damaged group. The IF between LigIV/pDNA-PKCcs was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Welch's t-test). Groups: control (n = 21) and DNA-damaged group (n = 29). Error bars represent 95 CI.

(b) LigIV and pATM measurements. (i) Percentage of pATM clusters overlapping with LigIV was greater in the DNA-damaged compared to control group (\*\*\*\*p<0.0001; Student's t-test). (ii) Interaction Factor (IF) between LigIV/pATM in control and DNA-damaged group. The IF between LigIV/pATM was greater in the DNA-damaged compared to control group (\*p<0.05; Welch's t-test). Groups: control (n = 25) and DNA-damaged group (n = 13). Error bars represent 95 CI.

(c) BRIP1 and BRCA1. (i) Percentage of BRCA1 clusters overlapping with BRIP1 was not significantly different in the DNA-damaged compared to control group (n.s = not significant; p>0.05; Student's t-test). (ii) Interaction Factor (IF) between BRIP1/BRCA1 in control and DNA-damaged group. The IF between BRIP1/BRCA1 was not significantly different in the DNA-damaged compared to control group (n.s. = not significant; p>0.05; Student's t-test). Groups: control (n = 17) and DNA-damaged group (n = 18). Error bars represent 95 CI.



Comparison of R-G IF with Kd

(a) Plot showing percentage of green cluster overlaps for simulations generated with different R-G IFs and red cluster number. Curves represent the function  $y = 100^*x/(Kd+X) + NS^*x$  fitted to the points; points indicate values for individual simulations (n = 20 simulations per R-G IF).

(b) Plot of R-G IF vs Kd; Kd values were calculated from (a). A linear regression was fitted and resulted in  $R^2 = 0.97$ .



Comparison of calculation of R-G IF with and without rotation for clusters with increasing major axis diameter

(a) Examples of simulations generated with 100 red clusters and 100 green clusters with different major axis diameter. For illustration purposes, the color red is represented as magenta. In generating the simulated images, cluster numbers and size distributions were sampled from experimental image and the major axis diameter was multiplied by 1 (1x), 2 (2X), or 4 (4X).

(b) Plot of calculated R-G IF with and without rotation of clusters with increasing major axis diameter for simulations generated with R-G IF 0.0 and 0.9 (n = 20 simulations per R-G IF).

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cell-1_1.tif (33.3%) 25800x19200 nm (1290x960); RCB; 4.7MB	Interaction Factor Simulations
	Segmentation
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and the second states and the	Channel 2 (Ch2) Color: Red 🗘
a second second second second	Threshold: Otsu ᅌ
	Exclude Edge Clusters
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	Ch1_Simulation:
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Segmentation	Interaction Factor 0.00
Channel 1(Ch1) Color: Red ᅌ	Number of Simulations: 1
Channel 2(Ch2) Color: Green ᅌ	
Threshold: Otsu	Additional Measurements
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Output Images	
Save Random Simulations Show Ch1 Mask	
Show Ch2 Mask Show ROI Mask	
Show Overlap Mask Overlap Locations	
Test IF	
Cancel	

Screenshots of Interaction Factor Package plugins

(a) Screenshot of super resolution image (dSTORM) of nucleus opened in ImageJ. ROI is outlined by the user in yellow.

- (b) Screenshot of Interaction Factor ImageJ plugin.
- (c) Screenshot of Interaction Factor Simulations ImageJ plugin.

IF	Range of Calculated IF
0	0.10
0.10	0.06
0.14	0.14
0.18	0.12
0.22	0.09
0.26	0.13
0.30	0.07
0.34	0.11
0.38	0.12
0.42	0.07
0.46	0.09
0.50	0.05
0.54	0.10
0.58	0.08
0.62	0.06
0.66	0.04
0.70	0.03
0.74	0.06
0.78	0.05
0.82	0.03
0.86	0.03
0.90	0.03
0.94	0.01
0.98	0.00

## Supplementary Table 1

Table of range of variation in the calculated IF for images generated for IF = 0 to IF = 0.98.

# Interaction Factor Package ImageJ Plugin Documentation

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### Introduction

This plugin provides a method for quantifying protein-protein interactions by using stochastic modeling of super-resolution fluorescence microscopy data (RGB images). The result is an unbiased measure of co-localization of protein clusters, independent of cluster density and comparable across images. Please refer to manuscript (REF) for a detailed description of the Interaction Factor.

### Installation

Copy the .jar file into the plugins folder of ImageJ or Fiji. Close and open ImageJ/Fiji. The plugins will be found under **Analyze**.

Fiji	File	Edit	Image	Process	Analyze	Plugins	Window	Help		
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Figure 1. Interaction Factor Package

Important Installation Note: the plugin only works with Java8 and ImageJ v1.48 or

newer. Download ImageJ bundled with Java8 here

### How To Use the Interaction Factor Plugins

For both versions of the plugin, the first step is to start the Fiji or ImageJ application.

Next, choose an image you wish to analyze. This is accomplished by using File/Open menu option or by dragging and dropping a file to the area under the Fiji toolbar. The next step is to choose the plugin which is found under the **Analyze** pull down menu. There are two versions of the plugin that may be used to analyze an image. The first version, called **Interaction Factor**, allows you to calculate the Interaction Factor for the image. The second version, called **Interaction Factor Simulations**, allows you to produce any number of simulations for the image at a user-defined IF for use in further analysis.

### **Interaction Factor Plugin**

From the Interaction Factor menu selection, choose the first option – Interaction Factor. A pop up screen will appear (Figure 2).

	Interaction Factor
	Segmentation
	Segmentation
Channel 1(Ch1) Color	n Red ᅌ
Channel 2(Ch2) Color	r: Green ᅌ
Threshold	: Otsu ᅌ
Exclude Edge	Clusters
Apply C	Overlay Clear Overlay
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🗹 Move Ch1 Clu	isters
Ad	ditional Measurements
Au	autonal measurements
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🗹 Sum Pixel Inten	🗹 Clusters Sum Inten
🗹 Clusters Mean In	ten 🗌 Ch1 Stoichiometry
Ch2 Stoichiomet	ry 🛛 Clusters Overlaps
🗹 %Clusters Overla	ps 🛛 Overlap Count
🗹 Overlap Area	
	- Output Images
Save Random Sim	nulations 🗌 Show Ch1 Mask
Show Ch2 Mask	Show ROI Mask
Show Overlap Ma	sk Overlap Locations Table
	Test IF
	lest IF
	Cancel OK

Figure 2. Interaction Factor Plugin

The first step is to select the Region of Interest (ROI) in the image by using one the four selection tools in the Fiji toolbar (Figure 3). Refer to this link for a tutorial on how to draw an ROI. If your region covers the field of view there is no need to draw an ROI. Next, there are a number of parameters that may be used as input to the analysis. They are found in the **Segmentation** and **IF Parameter** sections of the pop up window. In addition, there are a number of outputs that may be chosen for a given run. These are found in the **Additional Measurements** and **Output Images** sections of the pop up window.



Figure 3. Example of ROI and selection tools. In red are the selection tools.

#### Segmentation

Here, you select the options for the chosen ROI you want to see in the analysis. These include the following:

1. Channel 1(Ch1) Color- from a pull down menu one of three colors may be chosen (Red, Blue,

Green) for the first channel

- Channel 2(Ch2) Color- from a pull down menu one of three colors may be chosen (Red, Blue, Green) for the second channel
- **3. Threshold** from a pull down menu a threshold may be chosen. These are the standard ImageJ thresholds and additional information may be found at the ImageJ website.
- 4. Exclude Edge Clusters- the final options in this section is related to what information is included in the ROI. When selecting the ROI, the line may cut through a cluster. You may choose to include or not include those clusters that are not completely within the ROI.

Once all the options have been chosen, click the button "*Apply Overlay*". All the clusters used in the analysis will be highlighted (in white) (Figure 4). If you wish to change any of the options then click the button "*Clear Overlay*". The selected clusters will be deselected but the ROI will remain unchanged. You may then select new parameters in the *Segmentation* section.



Figure 4. Example of zoomed-in image where clusters are outlined using the "**Apply Overlay**" button. *Note:* 

If the user has his or her own masks of the clusters created by another method, the user can still use the IF plugin by first combining the masks to an RGB image by going to **Image -> Color-> Merge Channels** and selecting channel 1 and channel 2 masks (make sure to uncheck the "**Make composite**" option). In the IF plugin select the Otsu threshold and continue to use the plugin normally.

#### IF Parameter

In this section, there is one parameter – **'Move Ch1 Clusters**' which is chosen by clicking the check the box (default). If this option is checked then, when calculating the IF, the simulations are going to be made such that Ch1 clusters will be placed randomly within the ROI. If the box is left unchecked, then Ch1 clusters will not be moved but stay in their current positions.

#### Additional Measurements

There are standard measurements displayed in the results table - the output from running an IF calculation. In addition to these, you may choose some other measurements you need to properly analyze your image.

- 1. Clusters Area sum of the area of all the clusters multiplied by the square of the scale
- 2. ROI Area- is the sum of the area inside the ROI multiplied by the square of the scale
- 3. Sum Pixel Inten- is the sum of all the pixel intensities inside the ROI
- 4. Clusters Sum Inten- is the sum of all pixel intensities in the clusters
- 5. Clusters Mean Inten is the mean intensities of all the clusters
- 6. Ch 1 Stoichiometry- is the percentage of Ch1 clusters that are overlapping with 1 (1:1), 2 (1:2), 3 (1:3), or > 3 Ch2 clusters (Stoichiometry)
- 7. Ch 2 Stoichiometry- is the percentage of Ch2 clusters that are overlapping with 1 (1:1), 2 (1:2), 3 (1:3), or > 3 Ch1 clusters (Stoichiometry)
- 8. Clusters Overlaps- is the number of clusters of one color overlapping with clusters with the opposite color
- **9.** %Clusters Overlaps -is the percentage of clusters of one color overlapping with clusters of the opposite color
- **10. Overlaps Count** is the number of overlaps counted by first generating an overlap mask and counting the number of overlapping regions
- **11. Overlap Area** is calculated by adding the area of all the overlapping regions multiplied by the square of the scale

#### Note:

The scale is dependent on the resolution. For example, the scale for a super resolution image can represent 20nm. This number may be part of the metadata of the input image and is read by ImageJ when opening the image.

#### **Output Options**

There are several output options that may be selected as part of a run for further analysis of the results. Each option chosen will be displayed in a separate window. The possible selections include

the following:

- 1. Save Random Simulations- the 50 random images used in the simulations for calculating the IF.
- 2. Show Ch1 Mask- mask of Ch1 clusters within the ROI
- 3. Show Ch2 Mask- mask of the Ch2 clusters within the ROI
- 4. Show ROI Mask- mask of the entire ROI chosen by the selection tool
- 5. Show Overlap Mask- mask of overlap regions between Ch1 and Ch2
- 6. Overlap Locations Table- a table pertaining to the Overlap Mask. It shows the location, area, and number of pixels for each overlap in the mask.

#### Running the Calculation and Interpreting the Results

#### Running the First Calculation

Once all the options are selected, you can execute the calculation by clicking the "*Test IF*" button in the lower right. A results window will be displayed.

	Image	Scale	R-G IF	R-G p-val	G-R IF	G-R p-val	R-B IF
L	cell-1_1_R_G_copy-0507-0632	20.0 nm	0.910	p<0.02	0.900	p<0.02	NT
-							



The following is the data reported by the plugin:

- 1. Image- the number of the image used in the IF prediction. If there is an ROI ID, it will be added to the image name.
- 2. Scale- This is retrieved from the image meta data

For the next several columns, the IF and p-val are calculated with both Ch1 (Ch2-Ch1 IF) and Ch2 (Ch1-Ch2 IF) as the reference color. The reference color is the color for which the percentage of overlapping clusters is measured when calculating the IF (see manuscript for further explanation). A value of *"NT"* in the column value means *"Not Tested"* (these columns are included in case they are needed for future calculation).

3. IF- Interaction Factor between two color clusters is a number between 0 and 1 where 0 indicates no interaction and 1 indicates complete interaction. Below is a guide for understanding the IF. If the number is in the "no or low interaction level" refer to the p-value. If the p-value is <0.02 this means that its likely there is an interaction between the clusters. In other words, if the p-value is <0.02 there is less than 0.02 probability that the percentage of overlaps observed are due to random occurrence.</p>



Figure 6. Guide for understanding the IF

4. p-val- the number of random simulations that had equal or greater percentage of overlapping clusters compared to the experimental divided by the total number of random simulations. In other words, if there were two random simulations that had equal or greater percentage of overlapping clusters compared to the experimental, then p-val = 2/50, = 0.04. If the p-value is <0.02 this means that none of the random simulations produced equal or greater percentage of overlapping clusters compared to the experimental image, and therefore it's likely there is an interaction between the clusters. In other words, if the p-value is <0.02 there is less than 0.02 probability that the percentage of overlaps observed are due to random occurrence.</p>

For an RGB image where Ch1 and Ch2 are chosen by the user as red (R), green (G), or blue (B).

$$Ch1_{mask} = ROI_{mask} \cap (Ch1 > th1)$$
$$Ch2_{mask} = ROI_{mask} \cap (Ch2 > th2)$$

Where *th* is the threshold determined by the thresholding method selected from the dropdown menu and  $ROI_{mask}$  are the pixels inside the region of interest (ROI).

- 5. Th Algorithm- this is the algorithm chosen by the pull down menu in the Segmentation section
- R/G/B Th- is the threshold determined by the thresholding method selected from the dropdown menu applied to the pixels inside the region of interest (ROI) for that channel
- 7. R/G/B Clus Count- count of all clusters in the corresponding Chi<sub>mask</sub> (i=1,2)
- 8. R/G/B Clus Area- sum of the area of all the clusters multiplied by the square of the scale

$$Chi Clus Area = \sum Chi_{mask} \times scale^2$$

9. ROI Area- sum of the area inside the ROI multiplied by the square of the scale

$$ROI Area = \sum ROI_{mask} \times scale^2$$

10. R/G/B Sum Inten- sum of all the pixel intensities inside the ROI

$$Chi Sum Inten = \sum Chi \cap ROI_{mask}$$

11. R/G/B Clus Sum Inten- sum of all pixel intensities in the clusters

Chi Clus Sum Inten = 
$$\sum Chi_{mask} \cap Chi$$

12. R/G/B Clus Mean Inten- mean intensities of all the clusters

$$Chi Clus Mean Inten = \frac{\sum Chi_{mask} \cap Chi}{n}$$

where *n* is the number of pixels in *Chi* mask (clusters)

- 13. R/G/B Clus Overlaps- number of Ch2 clusters overlapping with Ch1 clusters and vice versa
- 14. R/G/B1:1, 1:2, 1:3, 1:>3- percentage of Ch2 clusters that are overlapping with 1 (1:1), 2 (1:2), 3 (1:3), or > 3 Ch1 clusters and vice versa (Stoichiometry)
- **15. R/G/B %Clus Overlaps-** percentage of Ch2 clusters overlapping with Ch1 clusters and vice versa
- **16. Overlap Count-** number of overlaps counted by first generating an overlap mask

$$Overlap_{mask} = Ch1_{mask} \cap Ch2_{mask}$$

and counting the number of overlapping regions.

17. Overlap Area- the area of all the overlapping regions multiplied by the square of the scale

$$Overlap Area = \sum Overlap_{mask} \times scale^2$$

#### **Output Images and Locations Table**

These are the examples of the optional output images

1. Ch1 Mask- mask of Ch1 clusters within the ROI





2. Ch2 Mask- mask of the Ch2 clusters within the ROI



Figure 8. Example of Green Mask

3. ROI Mask- mask of the entire ROI chosen by the selection tool





4. Overlap Mask- mask of overlap regions between Ch1 and Ch2



Figure 10. Example of Overlap Mask

- **5. Overlap Locations Table** a table pertaining to the Overlap Mask. It shows the location, area, and number of pixels for each overlap in the mask.
  - **a. Image**-name of image
  - b. Number Pixels- the number of pixels in the overlap
  - c. Area- the number of pixels multiplied by the square of the scale
  - d. CentroidX- x coordinate of the center of the overlap
  - e. CentroidY- y coordinate of the center of the overlap

Image     Number Pixels     Arr       1     cell-1_1_R_G_copy-0507-0632     88     35       2     cell-1_1_R_G_copy-0507-0632     45     18       3     cell-1_1_R_G_copy-0507-0632     44     17       4     cell-1_1_R_G_copy-0507-0632     57     22       5     cell-1_1_R_G_copy-0507-0632     84     33       6     cell-1_1_R_G_copy-0507-0632     27     10       7     cell-1_1_R_G_copy-0507-0632     38     15       8     cell-1_1_R_G_copy-0507-0632     21     84	
1   cell-1_1_R_G_copy-0507-0632   88   35     2   cell-1_1_R_G_copy-0507-0632   45   18     3   cell-1_1_R_G_copy-0507-0632   44   17     4   cell-1_1_R_G_copy-0507-0632   57   22     5   cell-1_1_R_G_copy-0507-0632   57   22     5   cell-1_1_R_G_copy-0507-0632   84   33     6   cell-1_1_R_G_copy-0507-0632   27   10     7   cell-1_1_R_G_copy-0507-0632   38   15     8   cell-1_1_R_G_copy-0507-0632   21   84	ea Centroid
2   cell-1_1_R_G_copy-0507-0632   45   18     3   cell-1_1_R_G_copy-0507-0632   44   17     4   cell-1_1_R_G_copy-0507-0632   57   22     5   cell-1_1_R_G_copy-0507-0632   84   33     6   cell-1_1_R_G_copy-0507-0632   27   10     7   cell-1_1_R_G_copy-0507-0632   38   15     8   cell-1_1_R_G_copy-0507-0632   21   84	200 1855.00(
3   cell-1_1_R_G_copy-0507-0632   44   17     4   cell-1_1_R_G_copy-0507-0632   57   22     5   cell-1_1_R_G_copy-0507-0632   84   33     6   cell-1_1_R_G_copy-0507-0632   27   10     7   cell-1_1_R_G_copy-0507-0632   38   15     8   cell-1_1_R_G_copy-0507-0632   21   84	000 2274.885
4   cell-1_1_R_G_copy-0507-0632   57   22     5   cell-1_1_R_G_copy-0507-0632   84   33     6   cell-1_1_R_G_copy-0507-0632   27   10     7   cell-1_1_R_G_copy-0507-0632   38   15     8   cell-1_1_R_G_copy-0507-0632   21   84	600 2405.00(
5   cell-1_1_R_G_copy-0507-0632   84   33     6   cell-1_1_R_G_copy-0507-0632   27   10     7   cell-1_1_R_G_copy-0507-0632   38   15     8   cell-1_1_R_G_copy-0507-0632   21   84	800 2905.088
6     cell-1_1_R_G_copy-0507-0632     27     10       7     cell-1_1_R_G_copy-0507-0632     38     15       8     cell-1_1_R_G_copy-0507-0632     21     84       0     cell_1_R_G_copy-0507-0632     21     84	600 3252.619
7     cell-1_1_R_G_copy-0507-0632     38     15       8     cell-1_1_R_G_copy-0507-0632     21     84       0     cell-1_1_R_G_copy-0507-0632     10     74	800 3282.593
8 cell-1_1_R_G_copy-0507-0632 21 84	200 3826.31(
0	00 4507.143
9 Cell-1_1_K_G_COPY-USU7-U632 19 76	00 4570.00(
10 cell-1_1_R_G_copy-0507-0632 74 29	600 5135.67(
11 cell-1_1_R_G_copy-0507-0632 30 12	000 6197.333
12 cell-1_1_R_G_copy-0507-0632 151 60	400 6387.483
13 cell-1_1_R_G_copy-0507-0632 42 16	800 6427.143
14 cell-1_1_R_G_copy-0507-0632 145 58	000 6843.517
15 cell-1_1_R_G_copy-0507-0632 44 17	600 7193.182
16 cell-1_1_R_G_copy-0507-0632 28 11	200 7494.28€

Figure 11. Example of Overlap Locations Table

#### **Running Multiple Calculations**

You may execute multiple runs of the IF calculation with different input parameters and output images. Each run is stored in the results table as a separate row. None of the outputs are destroyed between runs but are accumulated. If any options are changed in the Segmentation and IF Parameter sections, it may be advisable to save one "type" of run in a separate folder for comparison with subsequent runs.

#### The Final Run

Up until now each calculation was executed by clicking the "Test IF" button which kept accumulating

all the output from the runs. Once all the analysis is completed a final calculation may be executed by clicking the "**OK**" button rather than the "**Test IF**" button. This closes the plugin pop-up screen. The original image and any output chosen remains displayed on the screen.

#### Cancelling the Analysis

You may end all of the analysis by clicking the "*Cancel*" button.

### Tips for Using and Interpreting the IF

- It is possible that the value of the IF calculation will have a small variation for multiple runs of the same image since the calculation is based on the percentage of overlap from random images, which are created dynamically each time the IF is calculated. Please refer to the manuscript for further details (REF).
- The user should avoid the IF for images with less than 25 clusters. Please refer to the manuscript for further details (REF).
- It is important that the image contains well-defined clusters that can be thresholded in a meaningful way. The user should test different thresholds to see which one works best. We suggest testing the Otsu followed by the Default.

# Interaction Factor Simulations Plugin

Interaction Factor Simulations
6
Segmentation
Channel 1 (Ch1) Color: Green ᅌ
Channel 2 (Ch2) Color: Red 🗘
Threshold: Otsu ᅌ
Z Exclude Edge Clusters
Apply Overlay Clear Overlay
Simulation Parameters
Ch1_Simulation:
O None
Random
Ch2_Simulation:
NonPandom
Number of Simulations: 1
Additional Measurements
Clusters Area
Sum Pixel Inten
Clusters Mean Inten Ch1 Stoichiometry
Ch2 Stoichiometry Clusters Overlaps
%Clusters Overlpas
Overlap Area
Output Images
Show Ch1 Mask Show Ch2 Mask
Show ROI Mask Show Overlap Mask
✓ Overlap Locations Table
Cancel OK

Figure 12. Interaction Factor Simulations Plugin

This plugin allows the user to create a set of simulated images at a chosen IF based on the input image. The interface for processing the input image is similar to the "Interaction Factor" calculation dialog box. The *Segmentation* and *Additional Measurement* sections are the same for both the IF calculation and the IF Simulation. Instead of the IF Parameter Section as in the IF Calculation, there is a *Simulations Parameters* section.

In this section, parameters for input into the simulation may be chosen and includes the following:

- Ch1 Simulation- or Channel 1, you may chose either *Random* or *None* (default) by clicking the radio button. If *Random* is selected, then Ch1 clusters are placed in random locations within the ROI. If *None* is selected Ch1 clusters will be kept in the same position as the input image.
- 2. Ch2 Simulation- for Channel 2, you may chose either *Random* or *NonRandom* by clicking the radio button. If *Random* is selected, then Ch2 clusters are placed in random locations within the ROI. If *NonRandom* is selected, then Ch2 clusters are placed according to the IF value within the ROI.
- **3.** Interaction Factor- Unlike the IF Calculation function, which gives an Interaction Factor, you must choose the Interaction Factor for this function. It is the number representing the interaction between the two color clusters. It ranges from 0 to 1 where 0 indicates no interaction and 1 indicates complete interaction.
- 4. Number of Simulations- Here you enter the number of simulations you want generated.

#### **Running the Simulation or Simulations**

Running a simulation is similar to running a calculation. As in the IF Calculation option, you must do the following to set up the simulation.

- **1.** Open an image for analysis.
- 2. Using one of the selection tools, choose what ROI will be used. If the ROI covers the entire field of view there is no need for drawing an ROI.
- 3. In the Segmentation section, select the options you need for the input. This includes:
  - a. Channel 1 Color
  - b. Channel 2 Color
  - c. Threshold
  - d. Exclude Edge Clusters
- 4. Click "Apply Overlay"
- Next, choose any input parameters in the *Simulation Parameters, Additional Measurements, and Output Images* section. Once all the options have been chosen click the "OK" button and the simulation executes. The input panel will disappear and the output will be

displayed on your screen. If you decide not to execute the simulation then click the "*Cancel*" button.

#### Output

Each simulation will be displayed with the corresponding number at the end of the name.



Figure 13. Example of Simulation Generated with IF = 0.90

Next, optional output masks will be displayed (refer to the previous section for details on the output masks). In addition, there will be a **Results Table** with several measurements (refer to the previous section for details on the columns). For each simulation the measurements will be added to the corresponding rows of the table.

• • •	Results			
Image		Scale	G Sim	R Sim
cell-1_1_R_G_	_copy-0507-0632	20.0 nm	None	None
cell-1_1_R_G_	_copy-0507-0632_Sim_1	20.0 nm	None	NonRandom
cell-1_1_R_G_	_copy-0507-0632_Sim_2	20.0 nm	None	NonRandom
cell-1_1_R_G_	_copy-0507-0632_Sim_3	20.0 nm	None	NonRandom

Figure 14. Example of Results Table