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# Probing Structural and Dynamic Properties of Trafficking Subcellular Nanostructures by Spatiotemporal Fluctuation Spectroscopy --Manuscript Draft--

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#### 1 TITLE:

Probing Structural and Dynamic Properties of Trafficking Subcellular Nanostructures by
 Spatiotemporal Fluctuation Spectroscopy

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#### **SUMMARY:**

Imaging-derived mean square displacement (iMSD) analysis is applied to macropinosomes to highlight their intrinsic time-evolving nature in terms of structural and dynamic properties. Macropinosomes are then compared to insulin secretory granules (ISGs) as a reference for subcellular structures with time-invariant average structural/dynamic properties.

#### **ABSTRACT:**

Imaging-derived mean square displacement (iMSD) is used to address the structural and dynamic properties of subcellular nanostructures, such as vesicles involved in the endo/exocytotic trafficking of solutes and biomolecules. iMSD relies on standard time-lapse imaging, is compatible with any optical setup, and does not need to dwell on single objects to extract trajectories. From each iMSD trace, a unique triplet of average structural and dynamic parameters (i.e., size, local diffusivity, anomalous coefficient) is calculated and combined to build the "iMSD signature" of the nanostructure under study.

The potency of this approach is proved here with the exemplary case of macropinosomes. These vesicles evolve in time, changing their average size, number, and dynamic properties passing from early to late stages of intracellular trafficking. As a control, insulin secretory granules (ISGs) are used as a reference for subcellular structures that live in a stationary state in which the average structural and dynamic properties of the whole population of objects are invariant in time. The iMSD analysis highlights these peculiar features quantitatively and paves the way to similar applications at the sub-cellular level, both in the physiological and pathological states.

#### **INTRODUCTION:**

Subcellular nanostructures (e.g., endocytic/secretory vesicles, organelles) play a pivotal role in

cell-signaling regulation<sup>1</sup>. Proper tuning of their structural (e.g., size) and/or dynamic (e.g., diffusivity) characteristics determines how the cell responds to internal or external stimuli<sup>2–4</sup>. Based on this evidence, it is not surprising that alterations of these characteristics are found in many pathological conditions. Examples encompass the role of misregulated endocytosis in cancer<sup>2,3</sup>, the structural and dynamic alterations found at the level of ISGs in  $\beta$ -cells exposed to Type-2 Diabetes conditions<sup>5</sup>, the misregulation of lysosomal structural and transport properties in globoid-cell leukodystrophy or galactosylceramide lipidosis<sup>6</sup>, and dysfunctionalities in the endo-lysosomal pathway in neurodegenerative disorders (e.g., Alzheimer's disease)<sup>7</sup>.

In this context, researchers have recently proved that the performance of standard optical microscopy methods can be enhanced by properly tuning spatial and temporal sampling resolution<sup>8</sup>. This, in turn, may provide further insight into biological processes of relevance. In practice, this is made possible by an algorithm of spatiotemporal fluctuation analysis, which simultaneously extracts the average structural and dynamic properties of diffusing objects directly from the standard stack of optical microscopy images without any need for preliminary knowledge on the biological object of interest and extraction of single-object trajectories. All this information is enclosed in a single output of the method: an iMSD trace<sup>9</sup> (details on the iMSD trace derivation and analysis are given in **Supplemental File 1**).

The resulting experimental protocol consists of a few steps. First, imaging of the region of interest is performed at high temporal resolution. Then, average spatial-temporal correlation functions are calculated from the stack of images. Finally, by Gaussian fitting of the series of correlation functions, the average 'diffusion law' is obtained directly from imaging and analyzed to recognize the object diffusion mode. The potential of the method was already proved for a variety of biological objects, ranging from molecules to nanoparticles and even entire subcellular organelles/structures<sup>9–15</sup>.

This paper reports iMSD application to macropinosomes to highlight their intrinsic, irreversible time-evolving nature in terms of their average (i.e., at the whole population level) structural and dynamic properties. Further, these endocytic vesicles are compared to ISGs as a reference for subcellular structures in a 'stationary state,' i.e., a state in which the average structural/dynamic properties of the whole population of granules remain constant at any time point. Macropinocytosis defines a series of events initiated by the extensive reorganization (or ruffling) of the plasma membrane to form an external macropinocytic structure that is then internalized <sup>16</sup>. The formed early-stage macropinosomes are very similar to phagosomes. At the same time, they can be distinguished from other forms of endocytic vesicles owing to their characteristic large size, morphological heterogeneity, and lack of protein-coat structures.

Biochemical assays revealed that, upon internalization, macropinosomes progressively get enriched with protein markers of other endocytic pathways, in turn, suggesting that their identities are continuously changing during trafficking<sup>17</sup>. Using antibodies against known markers of the endosomal pathway, it was demonstrated that macropinosomes progressively adopt classical endosomal features: they diminish in size, develop into late endocytic structures (e.g., lysosomes), or eventually lose their identity via membrane-mediated retrieval of specific

molecular markers (e.g., sorting nexins)<sup>18,19</sup>. The overall scenario is that every single macropinosome within the cell irreversibly changes its structural and dynamic (and molecular) identity during trafficking from the plasma membrane to its final intracellular fate. As a result, the structural/dynamic/molecular properties of the whole population of macropinosomes are also changing along the same temporal path. Being intrinsically sensitive to the average properties of the whole population of observed objects, the iMSD method quantitatively depicts the 'evolving nature' by the quantification of key average parameters, i.e., the local diffusivity and anomalous coefficient (dynamic properties) and the average size of the macropinosomes (structural property) at any stage of their intracellular trafficking.

For comparison, similar measurements were performed on a well-known intracellular membrane-enclosed structure, the ISG, in a model of  $\beta$ -cells. Like macropinosomes, the regulation of the structural and dynamic properties of ISGs, from their genesis at the Trans Golgi Network (TGN) to their exocytosis at the plasma membrane, is pivotal to the proper execution of ISG function<sup>20</sup>. However, unlike macropinosomes, ISGs live in a 'stationary state' in which, at any time, all the functional/structural/molecular stages of ISG lifespan are simultaneously present within the cell, and each is represented by a specific subpopulation of ISGs. This means that although every single granule irreversibly evolves from biogenesis to secretion, the average structural/dynamic properties of the whole population of granules is expected to remain constant at any time point (unless the stationary state conditions are changed, for instance, by external stimuli such as glucose, cholesterol, and cytokines<sup>13</sup>). This is confirmed by iMSD analysis.

# **PROTOCOL**:

#### 1. Sample preparation

1.1. Before the microscopy experiment, subculture cells in dishes suited for microscopy applications.

1.1.1. Wash a 10 cm tissue-culture-treated dish of confluent HeLa or INS 1E (insulinoma  $\beta$ -cell-like) cells twice with 0.01 M 1x PBS, add 1 mL of 0.05% trypsin-EDTA (1x), and place it in a 37 °C, humidified, 5% CO<sub>2</sub> incubator for 5 min.

1.1.2. Resuspend the detached cells by adding 9 mL of complete DMEM (for HeLa cells) or RPMI
 1640 (for INS-1E cells) medium, and collect the final 10 mL in centrifuge tubes.

125 1.1.3. Seed approximately  $2 \times 10^5$  cells in each 35 mm x 10 mm dish in a final volume of 1 mL of the medium. Incubate the cells for 24 h at 37 °C and 5% CO<sub>2</sub>.

1.2. To fluorescently label lysosomes, use LysoTracker Red DND-99.

130 1.2.1. Dilute the stock solution in 1 mL of prewarmed medium to a final dye concentration of 131 70 nM.

133 1.2.2. Replace the medium from the dish with fresh LysoTracker-containing medium. Incubate the cells in LysoTracker-containing medium for 20 min at 37 °C in a 5% CO₂ atmosphere, and wash them twice with fresh medium before the experiment.

1.2.3. To fluorescently label macropinosomes, use 70-kDa fluorescein isothiocyanate-dextran.
Wash the subcultured cells three times with 0.01 M 1x phosphate-buffered saline (PBS), replace
with dextran-containing medium (1 mg/mL), and incubate at 37 °C for 30 min. Before proceeding
with the microscopy experiment, wash the cells three times with fresh medium.

1.2.4. To fluorescently label ISGs in INS-1E cells, transfect the cells using transfection reagent (see the **Table of Materials**) and C-peptide-enhanced green fluorescent protein (EGFP) plasmid<sup>13</sup> according to the manufacturer's protocol, and incubate at 37 °C for 24 h in a 5% CO<sub>2</sub> atmosphere before the experiment.

2. Data Acquisition

2.1. To let the microscope equilibrate at the desired temperature and atmosphere, turn on the microscope incubator-controlling system at least 2 h before the experiment.

152 NOTE: Each acquisition is a time-lapse series.

2.2. Acquire the images using an inverted confocal microscope equipped with a 60x, 1.2 Numerical Aperture (NA) water-immersion objective.

2.3. Use a 488 nm Argon laser for excitation of EGFP (transfected cells) and fluorescein-labeled macropinosomes. Collect the fluorescence emission between 500 and 600 nm using a standard photomultiplier tube detector.

2.4. Use a 543 nm HeNe laser to excite Lysotracker and collect its fluorescence emission between 555 and 655 nm.

2.5. Set the diameter of the detection pinhole to the size of 1 Airy. For each acquisition, collect a series of 1000 sequential frames. Set the pixel-dwell time to 2  $\mu$ s/pixel for a frame time of 129 ms.

NOTE: Each frame consisted of 256 x 256 pixels (16 bit/pixel) with a physical dimension of 69 nm/pixel, corresponding approximately to an area of 17  $\mu$ m x 17  $\mu$ m.

3. iMSD calculation

NOTE: To properly execute the calculation, use software capable of numeric calculation and script programming. The specific script (i.e., for the 'iMSD.m' script file, see **Supporting File 1**) must be present in the same directory containing the image series to be processed. Each image of the series must be saved as a distinct '.tif' file.

177 3.1. To properly initialize the instrumental parameters used for the acquisitions, open iMSD.m with the software text editor and modify its first section as follows.

179

3.1.1. Set **N** as the number of frames in the time series (e.g., 1000 in this protocol).

181

3.1.2. Set *px\_size*: pixel size, expressed in μm (e.g., 0,069 in this protocol).

183

3.1.3. Set **f**: temporal resolution of each frame, expressed in seconds (e.g., 0,129 in this protocol).

186

3.1.4. Set *Filter*: binary input for background correction, set the value to '0' to process raw images, or set the value to '1' to perform a threshold-based background subtraction.

189

190 3.1.5. Set *av\_toll*: threshold for background correction; any pixel with intensity lower than this value will be set as 0 if Filter=1.

192

193 3.1.6. Set **bit** as the integer number determining the intensity sampling (e.g., 8 bit, 16 bit).

194

195 3.2. Save and run the edited iMSD.m script file.

196197

3.3. Check the script execution.

198 199

NOTE: The calculation processing status can be checked on the command window; if any fatal problem occurs, the process will be interrupted, and a warning message will be displayed to show the error type and the related line code. Otherwise, follow steps 3.3.1–3.3.3.

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200

203 3.3.1. Import the image stack and subtract the background (if required).

204

3.3.2. Calculate the spatiotemporal correlation function  $G(\xi, \eta, \tau)$  using the Fourier method.

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3.3.3. Fit the spatiotemporal correlation function with a 2D Gaussian function.

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210

NOTE: At the end of the process, the output values of the  $\sigma^2(\tau)$  fitting procedures will be shown in the command window: averages, error, and corresponding goodness (R<sup>2</sup>) of fitting are reported.

211212

213 3.4. Check the graphical output.

214

NOTE: The iMSD curve and the corresponding fitting curves are shown in three separate panels, each for a different type of fitting equation used: Brownian diffusion, anomalous diffusion, or confined diffusion. For each curve, the R<sup>2</sup> value is reported in the graph legend.

218

219 3.5. Check the text output.

NOTE: At the end of the process, an '.xls' file is created, named the original time-lapse '.tif' file. The first sheet contains the values of  $\xi$ ,  $\eta$ ,  $\tau$ , and  $\sigma^2$  calculated for each time-delay. The input parameters and principal calculated output values are reported in the second sheet, i.e., diffusion coefficient, anomalous coefficient, and y-axis  $\sigma^2_0$  intercept.

# **REPRESENTATIVE RESULTS:**

The general workflow of the method is presented in **Figure 1**. It recapitulates the main steps presented in the protocol section, from sample preparation (**Figure 1A**) to time-lapse imaging of intracellular nanostructures (**Figure 1B**), fluctuation analysis for the calculation of the series of spatiotemporal correlation functions (**Figure 1C**), and fitting for the derivation of the average structural/dynamic properties of the object under study (**Figure 1D**).

A critical parameter is the time resolution adopted for imaging the subcellular object of interest. This experimental value will set the time threshold at which the minimum average displacement of the objects of interest will be measured. However, the preferred condition is setting a time resolution of imaging at which the object of interest appears 'immobile' within the captured frame, i.e., it displays a characteristic size that, on average, is not deformed due to the imaging speed. This is technically possible if the object of interest is a membrane-enclosed subcellular structure or organelle (as in this case). Typically, subcellular structures exhibit local diffusion coefficients (D,  $\mu$ m²/s, see **Table 1**) that are several orders of magnitude lower than those of isolated single molecules in the cytoplasm (e.g., GFP²¹). Validation can be performed by artificially immobilizing the organelle of interest (e.g., by chemical fixation). Indeed, this condition can serve as a reference to determine the actual organelle size under the experimental conditions used (e.g., excitation wavelength, pixel size, objective).

Here, although lysosomes were used as test organelles for this procedure, the results are valid independently from the target structure. Figure 2A shows an image of a fixed (i.e., immobile) lysosome along with an acquisition performed in live cells at the appropriate temporal resolution (i.e., typically below 100 ms/frame; e.g., 65 ms/frame in the example in Figure 2B) and an acquisition performed intentionally at very low temporal resolution (e.g., 10 s/frame in the example in Figure 2C). For each condition, the size of the diffusing object is extracted as follows: i) an intensity profile of the spot is derived by the line tool in ImageJ software; ii) the intensity profile is plotted and interpolated by a Gaussian function to calculate the full width at half maximum (FWHM) value that, in turn, is used as an estimate of the spot diameter (Figure 2D). As expected and shown in the plot of Figure 2E, the acquisition at very high temporal resolution (i.e., 65 ms/frame) yields an average size of the structure close to that obtained in the fixed sample, either by using the standard tool described above or by extracting the iMSD y-axis intercept. Instead, the acquisition at slow speed yields an increase in the apparent size of the structure, owing to the natural structure dynamics during imaging. Under suboptimal experimental conditions, the structural/dynamic information extracted does not faithfully reflect the intrinsic properties of the object under study.

Once the main experimental parameters are selected, datasets can be produced for the target

intracellular structures. For macropinosomes, after 20 min of incubation of the cells with 70 kDa dextrans, time series of the labeled intracellular structures were acquired at different time points after treatment, from 30 min up to approximately 180 min. Interestingly, a gradual change in the structural and dynamic properties of macropinosomes is detected during trafficking (**Figure 3**; distributions of  $\sigma_0^2$ ,  $D_m$ ,  $\alpha$ , and N for macropinosomes are reported in the plots on the left). While no obvious changes in the local diffusivity ( $D_m$ ) of macropinosomes are detected during trafficking, both the characteristic size ( $\sigma_0^2$ ) and overall mode of motion ( $\alpha$ ) of macropinosomes do evolve in time.

Of particular note, a decrease in the average size of the macropinosomes is observed during trafficking (**Figure 3A**, left), together with a concomitant increase in the subdiffusive nature of their motion (i.e., denoted as a decrease in  $\alpha$  values, **Figure 3C**, left panel). Additionally, the number of macropinosomes was extracted from each acquisition: the results, reported in **Figure 3D**, left panel, clearly reveal an increase in the number of macropinosomes in time. All these results are in good agreement with the expectations because dextran-labeled macropinosomes are supposed to originate as isolated, large membrane-enclosed vesicles at the plasma membrane (that are also competent for movement along cytoskeletal components) but are supposed to gradually communicate with the endo-lysosomal pathway made up of a large population of smaller and randomly diffusing structures.

As anticipated above, the results for macropinosomes are in contrast to similar measurements performed on ISGs (**Figure 3**, right column). Insulin granules do not show a time-evolving trend of the iMSD-derived structural/dynamic parameters (and their average number within the cell) in the same time window observed for macropinosomes. Moreover, the characteristic values of  $\sigma_0^2$ ,  $D_m$ , and  $\alpha$  are quite different from those of lysosomes, used again as a reference. This result confirms the idea, as anticipated above, that granules are probed in a 'stationary state' in which, at any time, the average structural/dynamic properties of the whole population of ISGs are unchanged (i.e., they remain constant, unless the stationary-state conditions change, for instance, due to external stimuli).

# **FIGURE AND TABLE LEGENDS:**

Figure 1: Experimental workflow. (A) Cells were plated 24 h (48 h for transfection experiments) before confocal experiments onto cell dishes suited for microscopic applications. Cells were then suitably treated according to the labeling method (see protocol) to stain the cytoplasmic organelle of interest. (B) A typical confocal acquisition consists of a stack of images (time-lapse) of a cytoplasmic portion of a living cell, describing the time-evolution of labeled organelle dynamics. (C) Time-lapse movie is analyzed with a custom-made Matlab script, first calculating spatiotemporal image correlation function and Gaussian fitting to plot iMSD curves (D) and related extracted fitting parameters describing structural dynamics parameters of imaged organelles. Abbreviations: iMSD = imaging-derived mean square displacement; STICS = spatiotemporal image correlation spectroscopy;  $\alpha$  = anomalous diffusion coefficient;  $D_m$  = local diffusivity;  $\sigma^2(\tau)$  = variance.

**Figure 2: Proper experimental parameters.** (**A**) Exemplary image of stained lysosomes in a fixed sample. Scale bar = 2 μm. (**B**) The first frame of a stack of images of stained lysosomes in a living cell, acquired with the appropriate parameters. Temporal resolution: 65 ms/frame. Scale bar = 2 μm. (**C**) The first frame of a stack of images of stained lysosomes in a living cell, acquired at low speed: artifactual deformation of the apparent lysosome size due to organelle motion during imaging is visible. Temporal resolution: 10 s/frame. Scale bar = 2 μm. (**D**) Example of size calculation for imaged lysosomes in a blue ROI of (**A**), (**B**), and (**C**). The intensity profile along the blue line was fitted with a Gaussian function to retrieve the FWHM, i.e., an estimate of spot size. FWHM values are reported for each fitting. (**E**) Graphical representation of size values obtained by image analysis described in panel (**D**) for all imaged lysosomes (black square, mean value, and standard deviation), for lysosomes enclosed within the blue ROI (blue triangle), and retrieved by iMSD analysis (red circle). This figure is from  $^{22}$ . Abbreviations: ROI = region of interest; FWHM = full-width at half-maximum; iMSD = imaging-derived mean square displacement.

Figure 3: Temporal evolution of labeled organelles. (A) Plots of iMSD-extracted size values vs. time progression of subsequent acquisitions represented as a mean of measured values in acquisitions performed on a 10-min time window. On the left, progressive reduction in the average size of macropinosomes (black circles) and on the right, the time-invariant size of insulin secretory granules (black squares) compared to lysosomes, represented as average size value (thicker red line)  $\pm$  standard deviation (red lines). (B) and (C) Time progression of  $D_m$  and  $\alpha$  coefficients for macropinosomes (left) and insulin granules (right) extracted by iMSD analysis. (D) Time-evolution of numbers of labeled macropinosomes and insulin granules measured in the first frame of each acquired time-lapse movie. Abbreviations: iMSD = imaging-derived mean square displacement;  $\alpha$  = anomalous diffusion coefficient;  $D_m$  = local diffusivity, N = number.

**Table 1: Structural and dynamic** *i***MSD-extracted parameters**. The table shows the values of size,  $D_m$ , and  $\alpha$  coefficient measured for different organelles, specifying labeling strategies, the cell line used, and the number of analyzed acquisitions. Values are reported as mean  $\pm$  standard deviation. Abbreviations: iMSD = imaging-derived mean square displacement;  $\alpha$  = anomalous diffusion coefficient;  $D_m$  = local diffusivity, N = number; GFP = green fluorescent protein; EGFP = enhanced green fluorescent protein.

#### Supplemental File 1: Details on the iMSD trace derivation and analysis.

# **DISCUSSION:**

The properties and advantages of iMSD are evident when compared to the techniques available to retrieve analogous information. For structural information, the preferred choice is transmission electron microscopy (TEM) analysis. By this method, ultrastructural details at molecular resolution and even beyond can be retrieved, even for subcellular nanostructures. Nevertheless, the peculiar spatial resolution of TEM is achieved at the expense of the information in the temporal dimension, which is of interest here. To compensate for this, the recent advances in live-cell imaging technologies are of particular interest. These include new fluorescent markers with increased performances (e.g., brightness and photostability), optimized labeling procedures, and more sensitive detectors. In addition, analytical tools are available to address

both structural (e.g., 'size' by phasor-based analysis of local image correlation spectroscopy, PLICS<sup>23</sup>, aggregation/oligomerization by Number&Brightness analysis<sup>24</sup>) and dynamic (e.g., diffusion law by single-particle tracking (SPT)<sup>25–28</sup>) parameters on the subcellular scale. The SPT method affords direct access to the object trajectory and its MSD. However, the disadvantage is the need for a low density of the probe and very bright labels and many single-object trajectories to be measured to satisfy statistical criteria. With respect to the temporal resolution of the measurement, inorganic, photostable probes (e.g., quantum dots or metal nanoparticles) can increase SPT performance but at the expense of complex production and labeling procedures.

Compared to these standards, the iMSD method described here shows some key advantages. First, this approach can be used in conjunction with relatively dim fluorescent tags, such as genetically encoded fluorescent proteins (e.g., the application to ISGs). Thus, compared to SPT, a higher temporal resolution is achieved (using the same label) due to the lower amount of photons required<sup>8</sup>. Second, the iMSD method is limited only by the temporal resolution but not by diffraction. In fact, despite the diffraction-limited optical setup used, average molecular displacements even below the diffraction limit can be measured, as already demonstrated for molecular flows by using STICS<sup>29</sup>. The actual resolution in the measurement of displacements depends on how accurately (in terms of signal to noise) the correlation function can be measured, thus explaining why it is not limited by diffraction. Thus, it appears clear that the minimum displacement that can be measured depends on the diffusivity of the object of interest and the temporal resolution of the imaging setup.

In this regard, it is important to consider that application to subcellular nanostructures, such as macropinosomes or insulin granules, with a laser scanning microscope is optimal: the scanning speed available is significantly higher than the dynamics of the object of interest. In such a case, the movement of the objects during the acquisition is negligible, and the correlation function can be approximated by a Gaussian function. Finally, the iMSD approach can be easily applied to a wide range of commercial optical microscopy setups based on raster scan or wide-field camerabased imaging, with no need for system calibration (required only if an accurate estimate of particle size is to be achieved). An important parameter for the method to work is proper spatial sampling. As a general rule, to reach satisfactory convergence of the fitting algorithm, the minimum size of the region of interest for imaging should be at least 3 times larger than the maximum displacement of interest.

In conclusion, the iMSD method requires only a microscope equipped for fast acquisition. The structure of interest can be tagged to any genetically encoded or organic fluorophore, thus enabling multichannel imaging. It is envisioned that cross-iMSD analysis will be used in the near future to select subpopulations of subcellular nanostructures and reveal their interactions and co-diffusion within the cell, the latter being a hot topic in cellular biophysics. If any detail is lost by iMSD analysis, this is certainly related to the large amount of molecular information within dynamic subcellular nanostructures. Such information is inevitably averaged out during the measurement due to poor temporal resolution. Theoretically, however, there is no technical limit due to the possibility to retrieve molecular information, provided that sufficient acquisition speeds can be achieved<sup>8</sup>. Due to the continuous improvements in detector speed/sensitivity and

imaging technologies, it is envisioned that information about the whole subcellular compartment and its molecular constituents will be extracted from a single dataset.

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# **DISCLOSURES:**

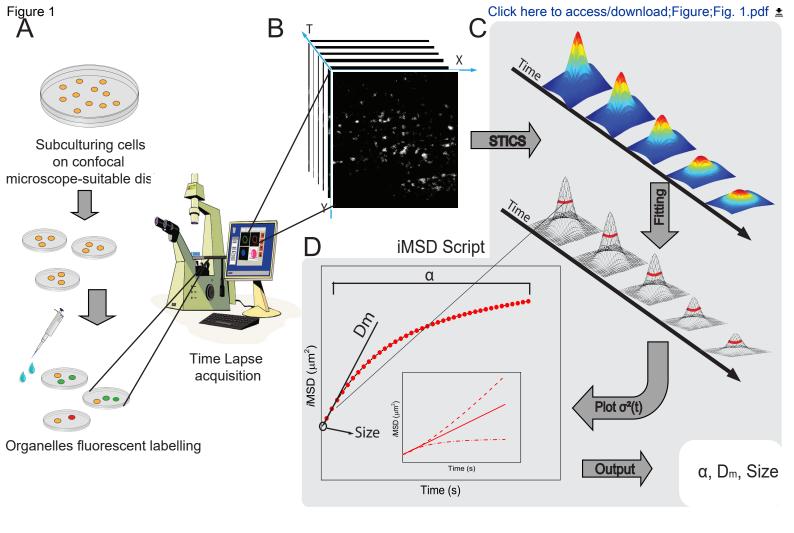
406 The authors have no conflict of interest to declare.

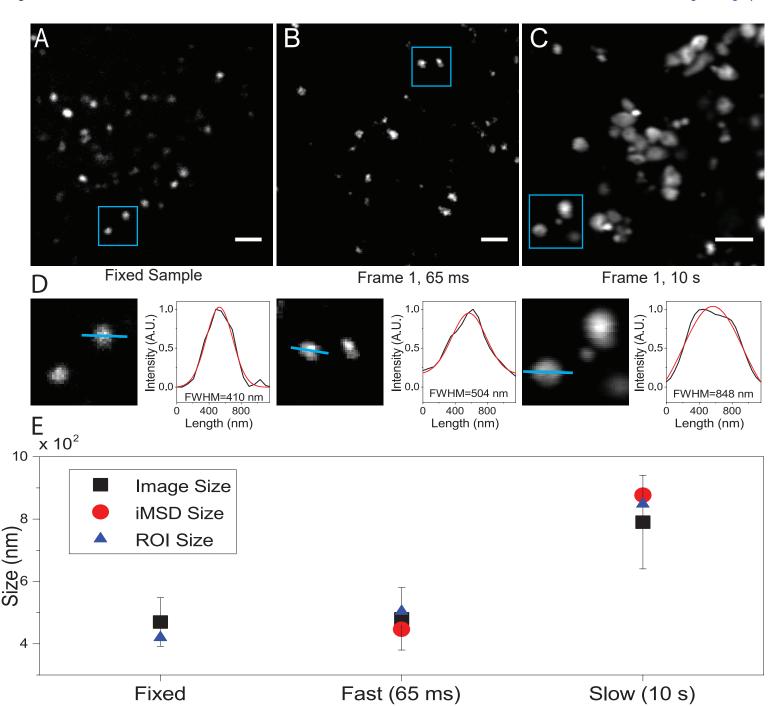
407 408

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180

40

160

40

60

80

100

120

Time (min)

140

100

120

Time (min)

140

160

180

80

Organelle	Labelling	Cell Line	Size (nm)
Early Endosome (EE)	CellLight Early Endosome GFP	HeLa	395±74
Late Endosome (LE)	CellLight Late Endosome GFP	HeLa	693±102
Lysosome (LY)	LysoTracker DND-99	HeLa	471±76
Caveola (CAV)	Caveolin-EGFP	HeLa	405±49
Clathrin Coated Vescicle (CCV)	Transferrin-Alexa 488	HeLa	513±62
Insulin Granule (IG)	C-peptide-EGFP	INS-1E	335±56
Early Macropinosome (EMCR)	Fluorescein-Dextran 70 kDa	HeLa	979±423
Intermediate Macropinosome (IMCR)	Fluorescein-Dextran 70 kDa	HeLa	702±180
Late Macropinosome (LMCR)	Fluorescein-Dextran 70 kDa	HeLa	592±127

$D_{\rm m}$ ( × $10^{-3}  \mu {\rm m}^2/{\rm s}$ )	α	N	Ref.
3.0±2.4	1.02±0.20	40	10
15.4±10.6	0.57±0.16	58	10
15.3±9.0	0.49±0.13	143	10, 14
3.1±1.8	1.00±0.22	15	10
16.2±9.9	0.48±0.17	33	10
3.0±1.7	0.70±0.14	107	11
8.3±9	0.79±0.27	36	10
13.7±19.9	0.60±0.38	29	10
5.8±4.7	0.39±0.21	21	10

Table of Materials

Click here to access/download **Table of Materials**JoVE\_Materials (15).xls

### Manuscript Summary:

This manuscript would be very useful to apply an alternative and versatile method based on spatiotemporal fluctuation analysis to extrapolate diffusion and size parameters for cellular organelles. Title and abstract are appropriate, and the related script is provided. The authors describe the potential application on macropinososmes, lysosomes and insulin sectretory granules.

# Major Concerns:

- One major concern is represented by the fact that the images are acquired in time only using one focal plane, not a z-stack, and therefore the analysis is performed assuming that the organelle is moving in 2 (x, y) dimensions instead of 3 (x, y, z). The fact that the organelle will spend a long time in the focal plane, although moving not only in x,y but also z, is not taken into account in the correlation function, questioning the overall rationale for its use for following the dynamics of cytoplasmic species. Other approaches such as 3D tracking would deliver more precise results on diffusion parameters. For iMSD, a plasma membrane protein, for which a 2D lateral diffusion can be approximated, would be a more convenient and suitable target application.

We thank the reviewer for his/her positive evaluation of our manuscript. Concerning the raised comment, let us state first that 2D imaging gives the possibility to push the actual temporal resolution of the measurement down to the frame time, while including several focal planes would entail lowering the time resolution. Let us also remind that the correlation function will get deformed according to the true dynamics of the objects, irrespective of the imaging modality used. Thus, it is always possible to fit the temporal evolution of the spatiotemporal correlation function with equations for 3D diffusion, if this is the case. Said this, we believe that 2D imaging (and diffusion analysis) is a good approximation for subcellular organelles such as those studied here. In fact, when cultured in monolayers, cells typically spread attached to the glass and are quite thin, with cytoplasmic cytoskeletal filaments (the track typically used by the same organelles to move through the cell) organized mainly parallel to the glass surface. With a z-resolution of about 1  $\mu$ m, this means that imaged organelles are destined to spend most of the time within the focal plane selected.

- An additional concern is about the absence of a control for the photobleaching of FITC-dextran (the insulin secretory granules are labelled with GFP). It is not clear if the decrease in size of the micropinosomes could be simply due to a decrease in FITC intensity.

Thanks for this comment. We exclude the possibility of photobleaching as imaging measurements on FITC-labelled dextrans were performed at different time points during vesicular trafficking but NOT consecutively on the same cells, i.e. at each time point, several acquisitions were performed but on different cells than those of the previous time point.

- The creation of a GUI (Graphical user interface) would be extremely useful for the researchers not familiar with Matlab, improving the accessibility and clarity of the script.

This is a nice idea, that we might take into account for the future developments of the technique. At the same time, however, let us state that the iMSD algorithm has been already included for free into the SimFCS software, freely downloadable at <a href="https://www.lfd.uci.edu/globals/">https://www.lfd.uci.edu/globals/</a>, together with dedicated tutorials.

#### **Minor Concerns:**

- Point 3.1 to 3.3 are too briefly described and unclear.
- The SD redlines in Fig. 3 are not dashed as described in the legend.
- The mean and SD of alpha value in 3C for lysosomes are different in the case of macropinosomes

and insulin granules (while Dm and size are not)

#### Reviewer #2:

The manuscript by Ferri et al. presents image mean square displacement analysis (iMSD) as a tool to study sub-cellular nanostructures. The method is based on the correlation analysis of a time-laps stack of cell images and has been developed in the previous publications of the group. In the present paper, the authors demonstrate iMSD analysis applied to fluorescently labelled lysosomes, macropinosomes and insulin secretory granules.

The techniques overall is sufficiently described. The authors present an experimental protocol, provide a a Matlab script for processing the image stack, as well as some exemplary analysis results.

I therefore recommend to accept the manuscript for publication in its present form.

# Let us thank the Reviewer for his/her positive evaluation

#### Reviewer #3:

Manuscript Summary:

In this manuscript, Ferri et al. demonstrate the feasibility and operability of imaging-derived mean square displacement (iMSD) analysis to study the subcellular nanostructure. The authors proved the potency of this approach in a case study of macropinosomes. This is a very useful technology for trafficking the cellular fates of nanoparticles and vesicles. The protocol is described in detail, and the manuscript is well written. Thus, I recommend the acceptance of this manuscript at current form.

Let us thank the Reviewer for his/her positive evaluation

Supplemental File 1

Click here to access/download **Supplemental Coding Files**Supplementary File 1 - iMSD calculation.docx

Supplemental Coding Files

Click here to access/download **Supplemental Coding Files**Supplementary File 2 - MatLAB script.m