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Imaging flow cytometry analysis of intracellular pathogens

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Abstract

Imaging flow cytometry has been applied to address questions in infection biology, in particular, infections induced by intracellular pathogens. This methodology, which utilizes specialized analytic software makes it possible to analyze hundreds of quantified features for hundreds of thousands of individual cellular or subcellular events in a single experiment. Imaging flow cytometry analysis of host cell-pathogen interaction can thus quantitatively addresses a variety of biological questions related to intracellular infection, including cell counting, internalization score, and subcellular patterns of co-localization. Here, we provide an overview of recent achievements in the use of fluorescently labeled prokaryotic or eukaryotic pathogens in human cellular infections in analysis of host-pathogen interactions. Specifically, we give examples of Imagestream-based analysis of cell lines infected with Toxoplasma gondii or Mycobacterium tuberculosis. Furthermore, we illustrate the capabilities of imaging flow cytometry using a combination of standard IDEASTM software and the more recently developed Feature Finder algorithm, which is capable of identifying statistically significant differences between researcherdefined image galleries. We argue that the combination of imaging flow cytometry with these software platforms provides a powerful new approach to understanding host control of intracellular pathogens.

Graphical abstract

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Keywords

imaging flow cytometry; fluorescent protein; intracellular pathogen; *Mycobacteria tuberculosis*; *Toxoplasma gondii*; Feature Finder; cellular heterogeneity; colocalization; phagosome maturation; Rab5; Rab7

1. Introduction

Intracellular bacteria and protozoans include symbionts and pathogens that live in the cytoplasm, cytoplasmic vacuoles or nuclei of host eukaryotic cells, which are integral to the biology, pathology and evolution of infection in their hosts [1]. Among them are major infectious agents of humans such as *Mycobacterium tuberculosis* (MTb), and other intracellular pathogens, where humans serve as the intermediate host, such as *Toxoplasma gondii* (*T.gondii*). The molecular mechanisms that allow these pathogens to invade intracellular spaces invasion and manipulate host cell machinery are critical to understand host control of infection and the unique niches that support for developmental cycles of invading parasites.

Parameters that describe the interaction of intracellular pathogens with host cells are traditionally quantitated on a cellular population level. However, intracellular replication is heterogeneous, and infection of host cells with a clonal population of intracellular pathogen frequently results in variable numbers of bacterial or protozoan pathogens in each host cell [2–5]. Microscopic analysis reveals heterogeneity during intracellular pathogen internalization and intracellular replication by interaction of a variety of host- and pathogen-depending factors. To study host-pathogen interaction heterogeneity on the single cell level requires techniques capable of analyzing thousands of cellular images in a short period of time. Imaging flow cytometry (IFC) provides a very powerful tool for researching intracellular pathogens. First, IFC allows quantification of morphological cellular features as well as spatial distribution of numerous fluorescent markers in single cells and in heterogeneous cellular populations [6–7]. Second, IFC allows direct visualization of cells

and fluorescently labeled pathogens and makes it possible to correlate acquired cellular images with events on bivariate dotplots (one dot for one cellular event). Third, IFC instruments such as the Imagestream platform (Amnis-Merck, USA) provide the opportunity of acquisition and quantitative analysis of tens and hundreds of thousands of cells in a short period of time (InspireTM acquisition software and IDEASTM analysis software (Amnis-Merck, USA) for Imagestream platform). Finally, in complex multiple-labeling imaging experiments, IFC allows quantitation and compensation for spectral crosstalk on a pixel-to-pixel basis using personal computer and specialized software. The use of fluorescent markers successfully incorporated by intracellular pathogens has proven to be an especially powerful tool in combination with IFC technology.

Notably, detection and quantification of fluorescent signals using IFC can be performed using live cells without fixation (with appropriate biosafety guidelines). In the emerging era of systemic and synthetic biology, IFC coupled with genetic-tagging technologies is becoming the powerful instrument to visualize dynamic components of the cellular system. We discuss recent advances in the use of fluorescent proteins for analysis of host-pathogen interaction markers and show examples of sophisticated IFC analysis of *T.gondii* and MTb internalization.

2. Use of external and internal fluorescent reporters for intracellular

pathogens

Use of image-based platforms such as fluorescent (confocal) microscopy, intravital multiphoton microscopy and IFC (see Table 1 for comparison of IFC and other techniques for cell analysis) significantly expanded the understanding of complex diseases induced by intracellular pathogens For example:1) internalization and phagocytosis of intracellular pathogens; 2) differentiation intracellular forms of pathogens and survival inside phagocytes; 3) replication inside phagocytes and multiplication of pathogens(see ref. [8–9] and [6] for review).

2.1 Fluorescent protein palette for fluorescence-based techniques and IFC

Recent advances in the development of fluorescent sensors has increased and diversified the utility of fluorescent protein (FP) for analysis of intracellular parasites and bacteria *in vitro* and *in vivo*. In the case of parasites, green fluorescent protein (GFP) originally purified from the jellyfish (*Aequoria victoria*) has been successfully expressed in several protozoan intracellular parasites such as *Leishmania* species [10–12], *Trypanosoma* [13–14], *Enatomoeba* [15], *Plasmodium* [16] and *Toxoplasma* [17], and more recently as a dual combination with other fluorescent reporters (for example with mCherry) to follow the developmental stages of *T. gondii* [18]. FPs have been also successfully used for deciphering pathogenesis of bacterial intracellular infection (some examples are given in [19–24]). In these cases, the FP-tag sequence is fused to the DNA sequence of a known protein-of-interest in an expression vector that is translated as a fusion protein in the bacteria. The discovery of GFP homologues that emit not only in green light spectrum, but in all parts of the light spectrum, provided a significant boost in imaging host-pathogen research [25–26]. A particular interest is geared toward the novel group of red fluorescent proteins (RFPs).

These RFPs-based sensors provide an advantage of reduced autofluorescence compared to GFP, and relatively low light scattering and minimal absorbance at the longer wavelengths [27–29] (summarized in Table 2). Also, near-infrared FPs are now emerging group due to high transparency of mammalian tissues and whole animals to light in 650 nm to 900 nm "optical window" and to low autofluorescence/light scattering advantage of this type of FP for *in vivo* molecular imaging [30].

Dimeric (d) and monomeric (m) RFP proteins such as dTomato, mOrange and mCherry have also been employed for labeling intracellular parasites. These proteins were chosen based on relatively high brightness and low maturation time (time from FP expression to the point where FP becomes functional) [31]. The tandem version of dimeric Tomato (tdTomato) is the brightest FP, but its usage is limited by a relatively large molecular size of tdTomato, which may interfere with fusion-protein packaging [32]. In general, under optimal cellular growth conditions the expression of monomeric FPs by bacterial or protozoan cells does not have a detectable effect on growth of transfected cells. However, adding a fluorescent tag may lead to toxicity in the case of high-copy-number FP expression plasmids for bacterial cells, when fusion proteins are expressed at a concentration that significantly exceeds expression of endogenous protein [33]. Another concern is that the introduction of a plasmid expressing FP to a bacterial cell may lead to a reduced intracellular infection [34].

Recently, a wide spectrum of FP-broad-range-expressing plasmids was developed for bacterial research [35]. Authors reported a set of 12 different FPs covering a wide range of excitation (ex.) and emission (em.) wavelengths (ex. 399–610 nm; em. 476–649 nm), and emphasized the importance of selecting appropriate FPs for specific fluorescence-based application such as confocal microscopy or molecular imaging. Thus, the authors recommended using E2-Crimson FP (ex./em. 611/646 nm), due to its low photobleaching, fast maturation and relatively high brightness for instruments with green-yellow (561 nm) and red laser (633–640 nm) excitation wavelengths. Furthermore, the authors also analyzed the usefulness of their plasmids for conventional flow cytometry and microscopy, as well as for *in vivo* imaging, but not for IFC.

In IFC technology relative brightness is one of the most important characteristics, and tdTomato excited at 561 nm and determined with 610/20 em. filter will be the primary candidate for intracellular pathogen research. Alternatively, mCherry monomeric protein with less brightness but suitable for 561 nm ex. is a popular choice at IFC applications. In the Table 2 we summarized existing publications on IFC exploiting different FP fusions, and the majority of publications reported using mCherry and tdTomato as well as the classic EGFP.

2.2 IFC in the studies of bacterial infection of host cells

Conventional flow cytometry analyses allowed facile visualization of bacterial association with target host cells. Cell-pathogen associations have been evaluated by i) labeling bacteria externally (with antibodies against bacterial cell membrane components conjugated with fluorochromes or fluorescent dye) or by ii) expressing FPs in bacterial cells and analyzing host cells infected with fluorescently labeled pathogen, via conventional flow cytometer. This latter method has been used by a number of researchers and correlated with standard

colony forming units (CFU) assays to study host cell association with for example, the pathogens *Chlamydia psittaci* [48], *Mycobacterium bovis* [49] etc. A functional FP such as EGFP or mCherry can be expressed in diverse bacterial systems and have minimal effect on the interactions of pathogens with their respective host cells [20]. However, the quantification of intracellular particles and/or bacteria using traditional flow cytometry is complicated by extracellular bound bacteria that make it technically challenging to discriminate between intracellular and extracellular bacteria. See Table 3 for a summary of applications of IFC for intracellular pathogens research.

The introduction of high-throughput fluorescence microscopy made tremendous progress in quantitation of image features using proprietary as well as open image analysis software such as ImageJ program (originally NIH Image)[72], and more recently CellProfiler platform [73]. IFC differs from the fluorescent microscopy since the first method utilizes images of individual cells or small groups of cells in the stream, while the microscopy deals with cells attached to the coverslip. In the IFC it is fairly easy to separate images of single cells or cell groups, while in microscopy such separation (based on image segmentation) is less feasible and is typically performed by investigator. However, the difficulties of proper segmentation of the images and the absence of an algorithm for the identification of statistically significant differences between series of images manually picked by the investigator continue to remain key challenges in the development of semi-automatic algorithms of image analysis in high-throughput microscopy.

IFC analysis by Imagestream (Amnis-Merck, USA) employs powerful image analysis software (IDEASTM) with more than hundred fluorescence and morphology-based features. Recently, commercially available IDEASTM software was upgraded with a Feature Finder algorithm (Fig.1) which utilizes the IFC advantage of single cell analysis. Furthermore, IDEASTM Feature Finder algorithm provides a researcher with a scored table of statistically significant differences of multiple parameters derived from comparing two panels of manually picked image galleries. For example, Fig.1 illustrates, how to identify critical parameters differentiating *T.gondii*-infected cells inside large cellular terminal apoptotic "bubbles" from infected, but appearing morphologically normal cells, by comparing two sets of cellular images with and without large cellular "bubbles".

2.3 IFC in research of protozoans expressing fluorescent proteins

IFC techniques with FPs have been used for different applications such as detection and quantitation of intracellular pathogens, phagocytosis, colocalisation with membrane dyes and subcellular organelle markers (summarized in Table 3). Specifically, FPs have been successfully expressed in several *Toxoplasma, Plasmodium, Trypanosoma* and *Leishmania* species [12]. Some of them produce FP only in replicative stages of the parasite living cycle; for example, epimastigotes and amastigotes of *Trypanosoma cruzi* [13], making FPs useful for the detection of proliferating parasites. Recently, functional and genetically modified parasite strains with dual expression of fluorescent tags under control of stage-specific promoters (BAG1-GFP; SAG1-mCherry) were developed for *T. gondii* [18]. However, in parasitic protozoans FP-based tagging is mostly restricted to aerobic protozoans or their oxygenated stages of the life cycle because of the oxygen requirement for the maturation of

FPs. Recent alternative to GFP-protein fusion is tagging of parasites with biarsenicaltetracysteine FPs (either FISsH-EDT(2) or ReAsH-EDT(2)), which has been successfully used in a variety of cell models including *Dictyostelium* [74]. IFC techniques are using FPs for different applications such as detection and quantitation of intracellular pathogens, phagocytosis, colocalisation with membrane dyes and subcellular organelle markers (summarized in Table 3).

2.4 Fluorescent staining of intracellular pathogens with external reporters

Similar to fluorescent microscopy, IFC employs staining with specific antibodies to simultaneously immunophenotype host cells, identify intracellular pathogen and/or organelles, transcription factors and other subcellular components [54; 63; 66]. Though fluorescent reporters are commonly used to detect intracellular parasites, in the absence of the specific fluorescent tag, it is possible to follow parasites using membrane cell tracking dyes [52; 59]. A fluorescent membrane cell-tracking dye such as carboxyfluorescein diacetate succinimidyl ester (CFSE) has been extensively used in the last few years to quantitate mammalian cell divisions [75]. The same correlative approach of membrane dye (PKH26) dilution with cell division can be applied to measure the rate of bacterial replication in vitro through conventional flow cytometry [76]. For example, Gibson-Corley et al. [52] labeled Leishmania amazonensis promastigotes with CFSE dye and quantitated the number of parasite-positive spots in infected cells using an Imagestream instrument (Amnis-Merck, USA). Similarly, Yason and Tan [59] labeled protistan parasite Blastocystis with CFSE dye and described the shape, size, granularity and nuclear arrangement in a variety of morphological forms of Blastocystis by IFC technique. Furthermore, Dupont et al [44] used a combination of an external staining of T. gondii parasites with CellTrace Violet (pH sensitive dye) and internal fluorescent tag mCherry (pH independent) to follow the fate of *T.gondii in vivo* via conventional flow cytometry and high throughput IFC. This report emphasized the importance of dual fluorescent reporters to track the parasite and distinguish different ways for parasite to infect cells.

3. IFC applications in intracellular pathogen research

3.1 Quantification and internalization of intracellular pathogens

The standard approach to quantify intracellular pathogen burden is mainly cell culturebased, time-consuming and expensive (by for example colony forming unit (CFU) determination). Moreover, analysis is usually hampered by low infection rates (less than 2% in some models) [77] and may require complicated methods to monitor intracellular development such as quantitative RT-PCR (qRT-PCR) techniques [78–79]. Alternatively, counting of intracellular pathogens involves direct quantification of pathogen viability and development of microscopy applications. Light microscopic analysis of pathogen or pathogen-induced cellular inclusions can be carried out with a variety of dyes such as a Giemsa stain [80–82], or staining with acridine orange, RNA and DNA probes, or specific immunofluorescent staining. Light microscopy yields very good qualitative [82] and quantitative [89] results, however, it is limited by sampling of one-several hundreds of events and might be prone to subjective variations between observers.

Conventional flow cytometry offers a statistically robust alternative for the quantitation of thousands of fluorescently labelled parasites and bacteria [83], and has been intensively used during the last twenty years. It may employ the staining of intracellular pathogens with nonspecific nuclear dyes such as propidium iodide (PI) or acridine orange [84], immunofluorescent staining with specific antibodies to intracellular pathogens [85–86], and counts of fluorescently tagged bacteria and protozoans [87]. However, there are some constraints that limit the use of flow cytometry in the quantitation of intracellular pathogens. Specifically, it is possible, yet technically challenging to differentiate between attached and internalized parasites using conventional flow cytometry [87]. Another obstacle is cellular and parasite aggregation which could have a significant effect on counting results. Besides, flow cytometry cannot address the question on intracellular localization of pathogens that is important for studies on pathogens development.

The use of fluorescence-based methods such as fluorescent microscopy and/or conventional flow cytometry to study intracellular pathogens became a common approach with the introduction of intracellular pathogens expressing FPs [3; 74; 88]. The IFC offers more information than just counting viable intracellular parasites. It allows researcher to combine intracellular parasite counting with the quantitation of a multitude of subcellular morphological and fluorescence features (Table 3), as well as robust statistics. The good example provides "Similarity Score" - a log-transformed Pearson's correlation coefficient between the pixel values of two image pairs, used in IDEASTM software to evaluate a degree of colocalisation [89]. This feature as well as IFC use of Rd value - shift in the statistical distribution between two populations (eg. "treated" vs. "untreated") described in details by Maguire et al. [90]. This multi-parametric multi-color approach is actively pursued in parallel with IFC by high-content microscopy, generally using 10× and 20× magnification [91-92]. For example, Maudet et al [92] employed a fluorescence-based screen to study a library of miRNA mimics in the molecular interplay between intercellular Salmonella enterica GFP-expressing strain and host cells. The authors successfully used a high-content screening fluorescent microscope (Molecular Devices, USA) at ×20 magnification and classified cells positive and negative for Salmonella, depending on the total area of GFPfluorescence in the cell. Furthermore, GFP fluorescent intensities in the cell were used as a surrogate marker for the amount of intracellular bacteria [92]. However, high-throughput microscopy approach is limited by analysis of adhesive cells growing as monolayers, when segmentation algorithm to define single cells prior to analysis is mandatory. Imagestreambased IFC analysis, on the other hand, can be applied to hundred thousands of single events without segmentation: either cells (growing in suspension or detached), cell clusters, or cell fragments (one dot on dotplot corresponds to single event and vice versa) at $\times 60$ magnification.

3.1.1 Quantification and internalization of Toxoplasma gondii—For the

determination of intracellular pathogens ingested in each cell, IFC offers spot count (Fig.2) and internalization features. The spot count approach to quantitate intracellular pathogens by IFC can be illustrated by this figure adopted from Muskavitch et al. [2] (Fig. 2). We used the IDEASTM software Spot count feature to calculate the number of independent green vesicles (corresponding to GFP⁺ *Toxoplasma* inclusions) determined in each single cell [2]. More

sophisticated IFC analysis based on an internalization score or spot count feature includes the development of a mask based on a BrightField cell surface. The mask is eroded by 3–5 pixels to exclude the cell membrane and signals associated with the cell surface. The resulting Eroded mask is applied to a fluorescence channel (FP channel: for example, GFP or mCherry) and the internalization score is then calculated using the Internalization feature provided by IDEASTM software (Amnis-Merck, USA). Internalization is represented as a log-scaled ratio between fluorescent intensity in the intracellular space versus fluorescent intensity of the entire cell. Cells that internalized FP-labeled intracellular pathogen typically have positive scores, whereas cells with parasites only attached to the plasma membrane have negative scores. Furthermore, co-localization of internalized intracellular parasites with intracellular compartments (for example, lysosomes or endosomes) can be calculated using the Bright Detail Similarity (BDS) feature. This feature quantifies the correlation between the bright details of the GFP⁺ *Toxoplasma* and fluorescent organelle markers. High values of similarity scores indicate that the fluorescence of intracellular pathogen and organelle marker colocalises in the same place.

The application of Eroded mask to *T. gondii*-infected cells (THP-1 cell line) allows to exclude from quantitation attached but non-internalized parasites, which otherwise will compromise counting (Fig.3 A, B). In our IFC experiments invasion of *T.gondii* parasites led to single and/or multiple inclusions in the infected cells (Fig. C, D), and had retained sensitivity to the actin polymerization inhibitor cytochalasin B (CytB) (Fig. 3E). In the presence of CytB (inhibits formation of actin filaments network), the percentage of invaded parasites was reduced to less than 5%. These results are consistent with previous publication where penetration of *T. gondii* was shown to be actin-dependent [93–95].

3.1.2 Internalization and quantification of MTb—To understand how intracellular pathogen such as MTb survives inside potentially hostile cells, such as macrophages, it is especially important to understand the processes allowing pathogen internalization, interaction with cellular host factors and, in case of MTb, phagosome maturation. Recently, Ranjbar et al. demonstrated that the interferon (IFN)-induced transmembrane (IFITM) proteins, particularly IFITM3 is a host restriction factor for MTb [90]. As part of this study, the group used IS-X Mark II (Amnis-Merck, USA) and performed a quantitative analysis investigating the impact of knockdown of IFITM1–3, or the impact of overexpression of IFITM3 on MTb growth. Using the IDEASTM-guided algorithm, the study distinguished between internalized and non-internalized MTb bacteria (IDEASTM, Amnis-Merck, USA). An example of this approach is presented in Fig. 4A, which shows quantification of internalized TB bacteria and external bacteria binding to the cell membrane (Fig. 4A; the 4-pixel eroded mask is shown on the left for both panels).

About 1% of cells in which bacteria were binding to the cell membrane were excluded from our analysis based on internalization mask (Fig. 4B, **Table**). The percentage of infected cells was comparable to results of flow cytometry analysis performed previously [90]. IFITM shRNA cell cultures presented significantly higher infected cells with H37Rv-mCherry compared to the control (see Figure 4A based on data presented in Ranjbar et al. [90]). These results were consistent with conventional CFU assay, which showed a significant increase (p<0.01) in MTb infection at days 2 and 3 post-infection in IFITM shRNA cells

compared to control shRNA cells [90]. Notably, the IFC assay also allows capturing numerous images from infected cells that can be used for further analysis.

3.2 Subcellular characterization of intracellular pathogens by IFC

MTb has developed elegant strategies to avoid both the innate and adaptive immune responses [96–97]. One of the mechanisms used by MTb to survive in macrophages is manipulation of host phagosome/endosome pathways and inhibition of phagosome-lysosome fusion [98]. One cause of the phagosomal arrest is attributed to altered Rab7 function [99–102] coupled with retention of Rab5 (an early endosome marker) [99].

3.2.1 MTb localization in early endosome or late endosome compartments-

Since IFC is capable of quantitating co-localization of intracellular parasites with different subcellular compartments [63], this technology was used to show that internalized bacilli were restricted to early endosome or late endosome compartments co-localized with IFITM3 [90]. In the study by Ranjbar et al., IFC showed that that internalized bacilli were restricted to early endosome or late endosome compartments co-localized with IFITM3 [90].

Here, we performed the same experiment in THP-1 cells that did not contain overexpressed tagged IFITM3, and MTb-mCherry-infected cells were acquired by IS-X Mark II (Amnis-Merck, USA). Results were then analyzed with IDEASTM software (Amnis-Merck, USA) as described above in section 3.1.2. Internalized bacteria were selected and followed by the co-localization wizard to attribute bacteria to early or late endosomal compartments. The IDEASTM feature Bright Detail Similarity (BDS) was used to measure co-localization between two signals. A BDS score of 2 or greater represents a high degree of overlap. Representative images of co-localization of MTb-mCherry bacilli within the early (Rab5 positive) endosomal compartment and in the late (Rab7 positive) endosomal compartment are shown respectively in Fig. 5A and Fig. 5B. BDS coefficients are indicated in the merged images.

To further characterize the MTb localization in infected cells that were labeled with Rab5, the cells were also labeled with LAMP1 (CD107 conjugated antibody, lysosome marker). As shown in a new analysis presented in Fig. 5, which recapitulates work in Ranjbar et al [90], H37Rv-mCherry bacilli were co-localized to a greater degree at LAMP1/CD107 late endosome/lysosome and Rab7 associated late phagosome compartment as compared to the Rab5 associated early phagosome (Fig. 5C). Thus the study by Ranjbar et al., demonstrated the ability of IFC to produce a statistically robust evaluation of colocalization of MTb with various cellular compartments and to compare the trafficking of MTb in cells where IFITM1–3 had been knocked down [90].

The strategies to analyze phagosome maturation in infected by MTb cells were further expanded by Johansson et al [41]. In order to develop small-scale screening strategy for chemical compounds that enhance phagosome maturation in MTb-infected cells, the group used fixable (CD63) and non-fixable (LysoTracker Deep Red) lysosome markers, and introduced custom-designed "phagosome-maturation score" [41]. Essentially, the analysis strategy was to quantify an extent to which the lysosomal marker is enriched in phagosome comparing with the whole body of the cell. The use of "phagosome-maturation score" (ratio

of mean pixels values) is based on the mean rather than the total intensity of lysosomal marker and therefore is less sensitive to the size of phagosome and cell comparing with standard approach based on the total intensity of lysosomal marker in the cell [41]. To validate the new approach authors imported images obtained using IS-X and quantitated phagosome maturation by techniques well-established in microscopy analysis [104–105].

Despite several decades of intensified research, the mechanisms involved in the protective immune response against MTb are not well understood. Use of multi-parametric and statistically robust IFC, and providing morphometric and fluorescence-based assessment of colocalization of MTb with different subcellular compartments will be beneficial in studying host-pathogen interactions in MTb infection and disease progression.

3.3 IFC and host-pathogen communication studies

IFC has also been used to study the dynamic of interaction between intracellular parasites and host cells. Bargieri et al. [37] quantified the invasion of PKH26-stained erythrocytes with GFP⁺ merozoites of *P.berghei* using co-localization and similarity scores to evaluate the efficiency of internalization of wild type and AMA1-deficient parasites. The decrease in invasion efficiency of AMA1-deficient merozoites was associated with altered adhesion to host cells [37]. The high sensitivity of Imagestream instruments allowed efficient detection of extracellular vesicles (EVs) in the wide size range [106–107]. Furthermore, we performed quantitative measurement of release of EVs of 100-400 nm size from P. falciparum schizont-stage parasites before egress [58], and it was possible to demonstrate that EVs originating from *P. falciparum*-infected red blood cells act as intercellular communicators and induce commitment of malaria parasites toward sexual differentiation. EVs released by infected cells could have multiple roles during infection [108–111]. Intracellular pathogen antigens may be transported by EVs or internalized by dendritic cells (DC), and this might amplify the cellular immune response [108]. EVs production is an universal cellular feature [112], and considered to be the major way to communicate and synchronize development and fate of intracellular pathogens. The application of IFC technology for research of EVs production by infected cells will further expand our understanding of intracellular pathogens.

3.4 IFC as a method to study heterogeneity and fate of intracellular pathogens

The fate of an intracellular pathogen after cell invasion depends on a variety of factors including type of the cell and/or pathogen, metabolic state and cell cycle stage of host cell (eg. professional phagocyte; endothelial cell, etc). Epigenetic factors can generate differentiation within genetically identical single cells of a clonal population [113] leading to the different fate of invading pathogen. Until recently, the technique of choice to study heterogeneity of intracellular pathogens and their fate in a clonal cellular population was flow cytometry supplemented by different variants of microscopy [114]. However, the statistically robust IFC technology platform allows quantification of a multitude of morphological pathogen forms present at the same time in the different subcellular compartments in a clonal cell line population leading to: 1) death of the pathogen; 2) long-term survival as a dormant form; 3) programmed cell death of the cellular host and

efferocytosis; 4) proliferation inside phagocytes and multiplication of pathogen; or 5) death of pathogen (Fig. 6).

3.4 IFC in drug discovery

In view of the recent spreading of intracellular pathogens showing resistance to the existing drugs [115–117], there is an urgent need to develop new, safe, and affordable drugs [118–119]. While several new chemicals were identified recently, they were primarily developed towards extracellular form of pathogens [120–121]. The biology of different parasite stages is important for research of intracellular pathogen response to drugs [122–124]. When comparing drug activity against *Leishmania in vivo* with drug activity against cultured parasites and intracellular forms *in vitro*, a correlation is better with the *in vitro* assays performed with drug screens using intracellular forms (amastigotes) vs. extracellular forms (promastigotes) [125]. However, the use of macrophage cell lines as host for intracellular parasites is problematic, since chemicals used to induce differentiation of macrophages *in vitro* modulate macrophage drug sensitivity [126–127].

Recent studies have suggested that IFC will be extremely helpful in screening for new drugs against intracellular pathogens. Recently, Lee et al. [56; 128] provided a detailed description of phenotype-based IFC assays to analyze a library of chemicals disrupting the integrity of the digestive vacuole of *Plasmodium falciparum*; these positive results of drug screening were further validated by confocal microscopy. It should be noted that these studies used colocalization of Fluo-4-AM and DNA dye-stained *P. falciparum* by IFC and demonstrated the capabilities of the method.

4. Perspectives and Challenges

We have described here data showing that IFC technology is a dependable and statistically robust platform for intracellular pathogen studies. Use of IFC and other image-based technologies in studying of host-pathogen interactions, has expanded our understanding of bacterial and parasite disease pathogenesis. Recent advances in red-shifted fluorescent protein development, advantageous due their low autofluorescence and light scattering, formed a basis for multiparameter and multi-color IFC. With the introduction of the Feature Finder algorithm, the IFC will further advance the field of imaging analysis. The availability and high sensitivity of Imagestream instruments also provides powerful tool for the analysis of intracellular pathogen heterogeneity.

By allowing an examination of pathogen morphology and subcellular localization and colocalization of pathogens with cytoplasmic organelles, along with statistical robustness of image analysis based on multi-parametric software (more than hundred morphological and fluorescent parameters can be combined with sequentially built customized masks), IFC gives novel opportunities in the analysis of the life cycle of pathogens and details of hostpathogen interactions.

The obvious limitation of IFC is the absence of a cell sorting option on the current instrumentation, which we expect will be overcome in the next years. The second limitation is its spatial resolution that is several fold less as compared to the fluorescent microscopy.

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However, introduction of the MultiMag option with $60 \times$ objective for Imagestream instrument results in a 0.3 µm pixel size sensitivity and along with the extended depth of focus option, makes this difference less significant.

Another challenge in the use of IFC is related to the increasing size of compounds libraries used in drug discovery for intracellular pathogens which have rigorous demands with respect to assay time and robustness. Future perspectives on drug screening may require compatibility of the IFC instrument with multi-well plate format (96–384 wells).

Finally, the development of IFC techniques and their recent applications to the study of intracellular pathogens at the single cell and population levels greatly enhances our understanding of the physiology of intracellular pathogens, and of the host-pathogen interface.

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Abbreviations

An5	annexin v
APC	antigen-presenting cells
BDS	Bright detail similarity
BF	bright field
CFSE	carboxyfluoresceinsuccinimidyl ester
CFU	colony-forming unit
CMDFA	5-chloromethylfluoresceinDiacetate
DAPI	(4',6-diamidino-2-phenylindole)
DHR	dihydrorhodamine
DMEM	Dulbecco's modified Eagle medium
FP	fluorescent protein
EGFP	enhanced green fluorescent protein
em.	emission
EVs	extracellular vesicles
EYFP	enhanced yellow fluorescent protein
ex.	excitation

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H2DCFDA	2',7'-dichlorodihydrofluorescein diacetate
IFC	imaging flow cytometry
IFITM	interferon-induced transmembrane proteins
IS100	Imagestream 100
IS-X	ImagestreamX
IS-X MK	ImagestreamX MarkII
LAMP1	lysosomal-associated membrane protein-1
МТЬ	Mycobacterium tuberculosis
MVs	microvesicles
OD	optical density
PBS	phosphate-buffered saline
PCD	programmed cell death
PE	phycoerythrin
PI	propidium iodide
qRT-PCR	quantitative RT-PCR
RFP	red fluorescent protein
shRNA	short hairpin RNA
SI	staining index
SSC	side scatter
TNK	transmembrane kinase

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Highlights

- Imaging flow cytometry (IFC) characterize hundreds thousands of cellular images using hundreds of measurements of morphological and fluorescence cellular features.
- Complex morphology of host-intracellular parasite interaction as well as standard cellular features (counts, size, shape) can be quantified in statistically robust manner using IFC.
- Feature Finder algorithm is useful in defining statistically significant differences in morphological and fluorescent features of cells infected with *T. gondii* cells.
- Imaging flow cytometry technique revealed that *Mycobacteria tuberculosis* internalized bacilli were co-localized to a greater degree at late endosome/ lysosome CD107 and late endosome Rab7 compartment than Rab5 early endosome compartment.

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Figure 1. Feature Finder algorithm implementation for *T.gondii*-infected THP-1 cells (defining of statistically significant feature for identification of cellular "bubbles", containing mCherry-labeled *Toxoplasma*)

1A, B: Two image panels from experiment with *T.gondii*-infected THP-1 cells (hand-picked by investigator). Ch1 – bright field; Ch4 – mCherry fluorescence (mCherry-labeled *T.gondii*); Ch1/Ch4 –merged cellular and *T.gondii* images. Right – images show the intracellular *T.gondii* clustered in vacuoles inside the normal size cells. Left – images show the intracellular *T.gondii* in vacuoles inside swelling cells (cellular "bubbles").
1C: Major step in Feature Finder algorithm – to define Ch1 (brightfield) and Ch4 (mCherry fluorescence) as channels of interest, and ALL software features as categories of interest.

Alternatively, categories of interest can be narrowed to "Fluorescent Intensity" category etc. **1D:** Feature Finder wizard results – "Delta Centroid XY" feature provides the best statistical significance for two analyzed galleries of images chosen to represent *T.gondii* inside "bubble-cells" and in appearing morphologically "normal" cells.

1E, **G**: "Delta Centroid XY" feature applied to two initially hand-picked galleries of images. Dotblot axises: height of image vs Delta Centroid XY.

1F, H: "Delta Centroid XY" feature applied to single, focused cellular population of acquired file. The populations corresponding to initial hand-picked galleries of images are automatically gated on dotplot.

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Figure 2. Quantification of internalized GFP-labeled *T.gondii* using Spot feature of Imagestream (reprinted from [2] with permission from Bentham Science Publishers)
2A: Single-cell population defined by Area/Aspect ratio dotplot;

2B: Histogram of fluorescent intensity (GFP), gated on GFP⁺ cells;

2C: Histogram of Spot feature (IDEASTM, Amnis-Merck, USA) applied to GFP⁺, single,

focused cells. Represents a quantitative distribution of cells with *T.gondii*-inclusions (distribution of GFP⁺-spots inside *T.gondii*-infected cells).

2D: Representative image galleries of cells, infected with *T.gondii* (cells with only one, two and three or more inclusions (spots)).

2E: Histogram of Spot Feature distribution (IDEASTM, Amnis-Merck, USA) representing GFP⁺ *T.gondii* inclusions in the infected cells after different multiplicity of infection (MOI).

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Figure 3. Quantification of internalized T.gondii

3A, B: Representative image galleries of cells, which did not internalized *T.gondii* (mCherry-labeled *T.gondii* attached or not attached, but located close to cells).
3C, D: Representative image galleries of cells with multiple (C) or single (D) *T.gondii* inclusions.

3E: Bar graph showing % of THP-1 cells infected with mCherry⁺ T*.gondii* cells (defined with a help of Eroded (3 pixel) mask). **Blue**: % of *T.gondii*-positive cells without treatment with inhibitor; **Red**: % of *T.gondii*-positive cells 24 hours after treatment with CytB (10 μ M).

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A	In	ternalized bac	teria			External	bacteria	
	Eroded mask,	Bright Field	MTb	Bright Field/MTb	Eroded mask	Bright Field	мть	Bright Field/MTb
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	15	15		()	2213	2213	,	0

Β Cell Count Cell Count Cell Count %Gated, with with external Bacteria+ Bacteria Internalized bacteria Bacteria THP-1 480 17.9 475 5 control shRNA 322 12.0 319 3 IFITM shRNA 651 4 656 23.8





Figure 4. Quantification of internalized mCherry labeled MTb bacteria

4A: Left panel - Representative images of internalized MTb-mCherry acquired on IS-X Mark II.

4A: Right panel - external bacteria. Images shown from left to right : BF with erode mask (4 pixels), BF indicating cellular outline, H37Rv-mCherry⁺-MTb bacilli (**Red**), merged image of MTb-mCherry fluorescence and BF showing intracellular or external localisation of MTb-mCherry.

4B: Left - Chart showing wild type THP-1 cells, control shRNA cells, and IFITM shRNA cells lines number of cells being infected with mCherry-MTb, cells, internalized and external bacteria.

4B: Right -Bar graphs show the number of infected cells in all three cell lines, IFITM shRNA cells had significantly higher number of infected cells compared to control shRNA (p=0.0001) and wild type THP-1 (p=0.002). Histograms show the results of three separate experiments.

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Bright Field	MTb	CD107	Rab5	CD107/MTb 0.99	Rab5/MTb MT	b/CD107/Rab5
۲				0		8
1878	r [*]	8,	1	0.50	0.12	6
471	C	6	. 3	1.38	0.13	•
828	*	۲	4	0.99	0.054	8
2661	* ^	3	8	0.92	0.20	3

Figure 5. Detection of H37Rv-mCherry MTb in early and/or late phagosomal compartments of infected human THP-1 cells

Wild type THP-1 cell were infected with H37Rv-mCherry MTb for 24 hours, fixed in 4% PFA, and stained with AB to Rab5 or Rab7 or Rab5 and CD107a and acquired on IS-X Mark II, as described in Ranjbar et al [90].

5A: Representative images of internalized MTb-mCherry in wild type THP-1 cells 24 hr after infection. Cells were labeled with Rab5 antibody and stained with DAPI as above.
Images shown from left to right: BF image (Grey), DAPI (Purple), MTb-mCherry fluorescence (Red), Rab5 (Green), and a merged image showing colocalisation of MTb-mCherry fluorescence and Rab5. BF similarity coefficient values are shown in yellow font.
5B: Representative images of internalized MTb-mCherry in wild type THP-1 cells that were labeled with Rab7 and stained with DAPI as above. From left to right: BF image (Grey), DAPI (Purple), MTb-mCherry fluorescence (Red), Rab 7 (Blue), and a merged image of MTb-mCherry fluorescence and Rab7 with BF similarity coefficient shown in yellow font.
5C: Representative images of internalized MTb-mCherry in wild type THP-1 cells infected with MTb-mCherry and labeled with Rab5 and CD107a (LAMP1) as above. From left to right: BF image (Grey), MTb-mCherry fluorescence (Red), CD107a (Dark blue), Rab5 (Green), and a merged image of MTb-mCherry fluorescence and Rab5 and CD107a with BF similarity coefficient in yellow font, a merged image of MTb-mCherry fluorescence and Rab5.



Figure 6. IFC in intracellular pathogen studies IFC allows to quantitate morphology and fluorescence, provides robust statistics, colocalization quantitation and Feature Finder capabilities.

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Feature	IFC	FC	Spectral FC*	LSC**	High- Thoughput Fluorescent Microscopy	Western Blotting
Light Scatter	Yes (side scatter)	Yes	Yes	Yes	No	No
Brightfield	Yes	No	No	Yes	Yes	No
Spectral Compensation required	Yes	Yes	No	No	No	No
Time-lapse (single-cell)	No	No	No	Yes	Yes	No
Time parameter (population analysis)	Yes	Yes	Yes	Yes	Yes	No
Morphological analysis	Yes	No	No	Yes	Yes	No
Speed of acquisition	Up to $5{\times}10^3$ events/sec	Up to 25×10 ³ events/sec	Up to $5{\times}10^4$ events/sec	Up to 100 cells/sec	Rate depends on exposure time; parallel acquisition	Averaged data from 5×10 ⁵ –10 ⁶ per slot
Size range	Up to 100 μ	Instrument- and nozzle- dependent (40 µ cell size limit-for 130 µ nozzle)	Up to 40 µ	Not limited	Not limited	Not limited
Signal spread error	Yes	Yes	No	Yes	No	N/A
Rare cell analysis (<0.01%)	Yes	Yes	No available publications	Capable of analyzing 1:10 ⁴ cells	No	No
Capable to analyze cell heterogeneity	Yes	Yes	Yes	Yes	Yes	No
*				•		

Spectral FC- Sony Biotechnology Inc. instruments (SP6800 spectral analyser).

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** LSC – Compucyte Inc (now Thorlabs, Inc., USA) instruments. Author Manuscript

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Protein	Class	Ex.(n m)	Em.(nm)	Brightness*	Oligomerization	IFC	Source	Refs
EGFP	Green	488	507	1	Weak dimer	Yes	Clontech	[3; 34; 36–41]
ZsGreenl	Green	493	505	2.5	Tetramer	Yes	[42] Clontech	[43]
EYFP	Yellow-Green	514	527	1.5	Weak dimer	Yes	Invitro-gen	[39]
tdTomato	Red	554	581	2.8	Tandem dimer	Yes	[31]	[43-45]
mCherry	Red	587	610	0.47	Monomer	Yes	[31]	[43-44;46]
DsRed-monomer	Red	556	586	0.1	Monomer	Yes	Clontech	[47]
RFP (tag)	Red	555	584	1.41	Monomer	Yes	Eurogen	[37]

* EGFP brightness equals 1.

Table 3

IFC analysis of intracellular bacterial and protozoan pathogens

Intracellular parasite	Fluorescent reporter	IFC- platform	Assays	IFC analysis (parameters)	References
Burkholderia thailandensis	EGFP Baclight ^{un} Green	IS-X Mark II	Growth curves; internalization; effect of inhibitor (wortmannin)	Max pixel fluorescence; Eroded intracellular and spot count masks	[34]
Cryptococcus neoformans	Alexa 488; CMDFA	IS-X	Phagocytosis; stress response; C.neoformans multiplication		[50–51]
Brucella melitensis	mCherry	IS100	Internalization	Eroded mask for erythrocytes (BF) from infected mice and 50% intensity mask for mCherry	[46]
Leishmania amazonensis	CFSE	IS-X	% infected cells	% positive cells; mean number of spots per infected activated cell; fluorescent intensity; max pixel of fluorescence	[52]
Leishmania donovani	DsRed2	FlowSight	Quantitation of infected cells/ <i>L.donovani</i> load; NFkB-p65 translocation in infected macrophages	MaxPixel vs. intensity, spot counting; similarity score	[47]
T.gondii	EGFP	IS100	Quantitation and detection of $T_{cgondif}$ by size and fluorescence in cell line	Spot counting	[3]
T.gondii	ZsGreenl; mCherry	X-SI	Quantitation and detection of T_{gondii} by size and fluorescence in peritoneal excudate cellular subset	Multi-color staining and detection <i>T_gondii</i> by size and fluorescence; colocalization;	[53]
T.gondii	mCherry; tdTomato ZsGreenl	IS-X	Quantitation and detection of <i>T.gondii</i> by size and fluorescence in pertioneal excudate cellular subset;STAT6 nucleo-cytoplasmic translocation in infected cells	Multi-color staining and detection <i>T.gondii</i> by size and fluorescence; colocalization; similarity (DAPI/pSTAT6)	[43]
T.gondii	mCherry; tdTomato; CellTrace Violet	X-SI	Quantitation and detection of $T_{cgondii}$ in peritoneal excudate cellular subset	Multi-color staining and detection <i>T.gondii</i> by size and fluorescence; colocalization	[44]
T.gondii	tdTomato	IS-X	Detection of $\mathit{Tgondii}$ in blood cells	4-color staining of blood cells and detection of T_{gondii} by size and fluorescence	[45]
T.gondii	ЕGFР, ЕҮFР	**SI	Quantitation and detection of T :gondii in peritoneal excudate subset	Multi-color staining and detection <i>T.gondii</i> by size and fluorescence	[39]
Salmonella enterica, serovar Thyphimurium	EGFP	IS-X	Internalization; counting bacterial load inside cell	Mean number of spots per infected cell; internalization score	[39]
Salmonella enterica, serovar Thyphimurium	EGFP, AB against O-antigen	IS**	Bacterial redox "stress"; intracellular/ extracellular bacteria	Fluorescent intensities; ratio parameters	[54]
Salmonella enterica	EGFP	IS-X	Quantification of Salmonella in infected B-cells	Fluorescent intensities	[54]
Plasmodium berghei	EGFP	IS-X	Size of merozoits	Size	[40]

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Intracellular parasite	Fluorescent reporter	IFC- platform	Assays	IFC analysis (parameters)	References
Plasmodium	EGFP; RFP	IS-X	Interaction with erythrocytes	Colocalization of EGFP and PKH26 (similarity)	[37]
Plasmodium falciparum	Fluo-4AM, Hoechst	IS100	Phenotypic screen for compounds destroying <i>Pfalciparum</i> digestive vacuole	Colocalization Fluo-4-AM and DNA dye- stained <i>P. falciparum</i>	[56]
Plasmodium falciparum	EGFP	IS100	Analysis of sorted EGFP-expressing P.falciparum	Fluorescent intensity; morphological features	[36]
Plasmodium falciparum	Hoechst	**SI	Surface area, sphericity	Diameter; perimeter; circularity; projected surface area loss	[57]
Plasmodium falciparum	Calcein-AM; AnV	IS100	Microvesicles (MVs) quantitation by size	SSC, bright field and two fluorescent channels to quantitate MVs	[58]
Blastocystis spp.	CFSE, Hoechst	IS-X Mark II	Shape, size, granularity, nuclear arrangement	Software shape wizard; aspect ratio for CFSE and BF; circularity, granularity; DNA content	[59]
Aeromonas veronii [*]	Syto9 (bacteria); AnV; DRAQ5; PI; DHR;	IS-X Mark II	Phagocytosis; proliferation; apoptosis; NFxB translocation in infected host cells	Morphology; similarity score; fluorescent intensity	[60]
M.tuberculosis	EGFP; Liso Tracker Deep Red	IS-X Mark II	Phagocytosis;-phagosome maturation; intracellular replication	Spot counting; phagosome maturation score	[41]
M.tuberculosis	AB to CD4, IFNgamma, IL17	**SI	Immunophenotyping of MTb-activated dendritic cells	Fluorescent Intensities	[61]
M.abscessus	mCherry; FLICA H2DCFDA	IS-X Mark II	Apoptotic/necrotic; FLJCA/caspase 3/7 and H ₂ DCFDA activated cells	Fluorescent Intensities	[62]
Entamoeba histolytica	PE-anti-TMK antibody	IS**	Co-localization; phagocytosis	Bright detail similarity score (co- localization between fluorescence in different channels)	[63]
Entamoeba histolytica	No fluorescent reporter	IS**	Shape	Bright field area and circularity score	[64]
Entamoeba histolytica	CMFDA; DID; live/dead violet dye	IS-X Mark II	Viability; internalization; amoebic trogocytosis	Fluorescent intensities; spot count; Max pixel; internalization score	[65]
Pneumocystis carinii	PE-CD11c	IS-100	Immunophenotyping	Fluorescent intensities; Max Pixel values (discriminates punctate from background)	[99]
Legionella pneumophila	Polyclonal AB to L.p.	IS**	Detection of <i>L.pneumophila</i> in macrophages	Fluorescent intensities; (<i>Legionella</i> -positive punctate)	[67]
Francisella tularensis	Phalloidin, Fura Red	IS**	Ca ⁺⁺ production; actin polymerization	Fluorescent intensities	[68]
Brucella melitensis	mCherry	IS-100	Detection of mCherry-tagged B.melitensis in red blood cells (free, adherent, overlapping)	Fluorescent intensities	[69]
Chlamydia pneumoniae	Cholera toxin-Al488	IS**	Membrane fluidity and uniformity of lipid rafts in <i>C.pneumoniae</i> -infected cells	Lipid raft spot counting; homogeneity	[70]
* Aeromonas veronii is an intracel	ular pathogen of different eukaryotic h	osts [71];			

Author Manuscript IS** model of Imagestream instrument is not specified.

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