

13th Spring School on Immunology

Principles of Flow and Image Cytometry & Emerging Technologies for Single Cell Analysis.

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<http://www.desatoya.com>

Biology Research

Key Modern Technologies

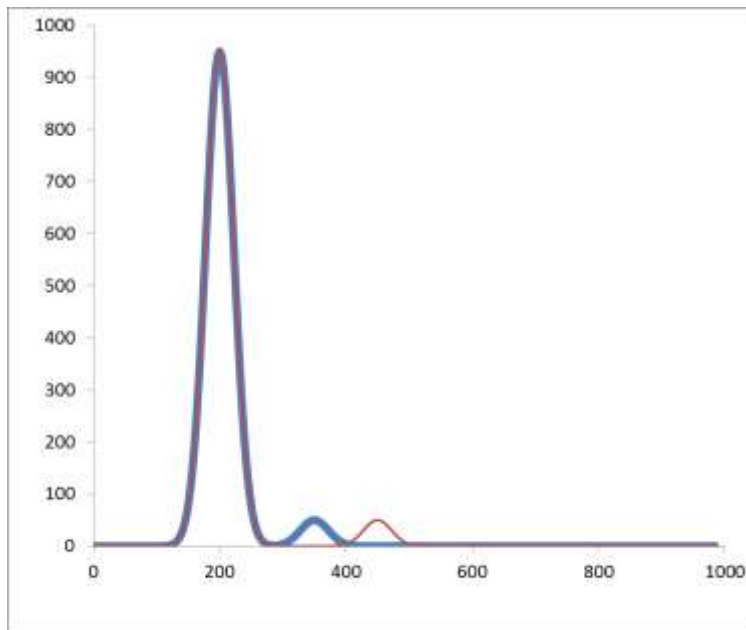
NMR MRI, X-ray imaging, Ultrasound, 2-photon imaging, In-vivo cytometry, Light microscopy, Electron microscopy, Flow cytometry, Cell imaging, NA sequencing, Mass spectrometry, Electrophoresis, ELSISA, ...

Information from Cytometric Single Cell Analysis

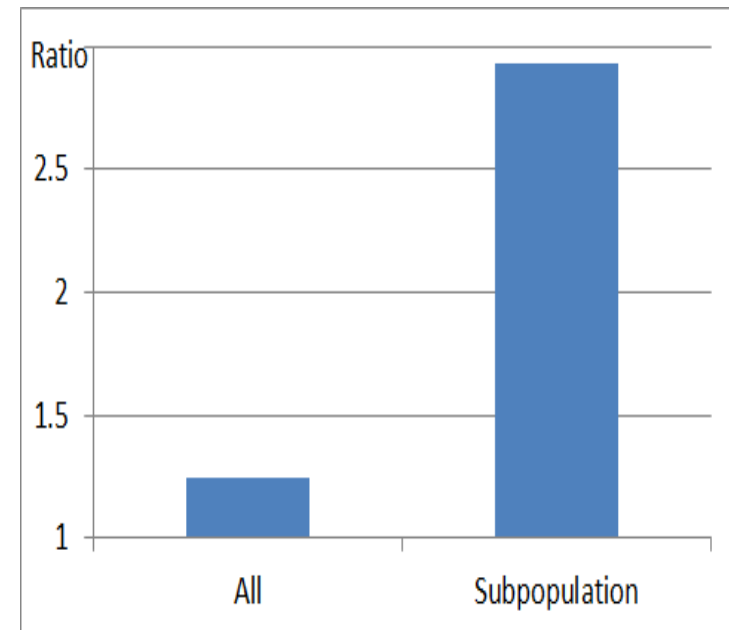
- * Cell-concentration
- * Cell size
- * Cell arrangement in clusters
- * Mass of multiple cellular components per cell
- * Distribution of component mass in subsets
- * Temporal change of the above parameters
- * Subset fractions
- * Cell shape

Why Subset Specific Analysis

**Intensity
Histogram**



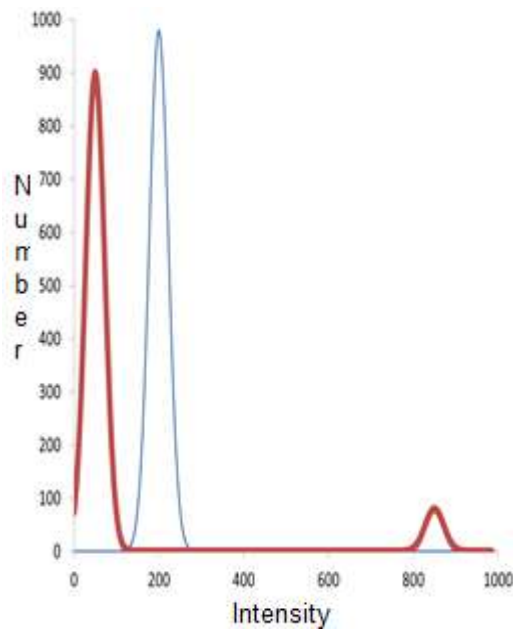
**Intensity
Ratios**



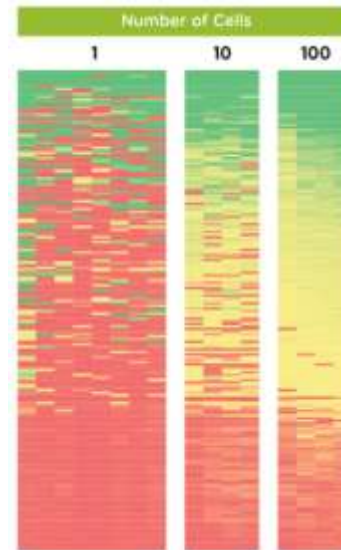
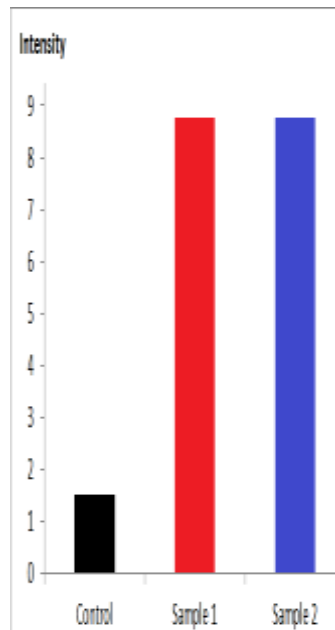
Subpopulation analysis detects changes better, especially for rare subpopulations.

Why Single Cell/Particle Analysis

Intensity Histogram for Single Particles



Intensity per Sample



Source: <http://www.nanosttring.com>

Cell by cell intensity analysis detects population heterogeneity.

Flow Cytometer Components

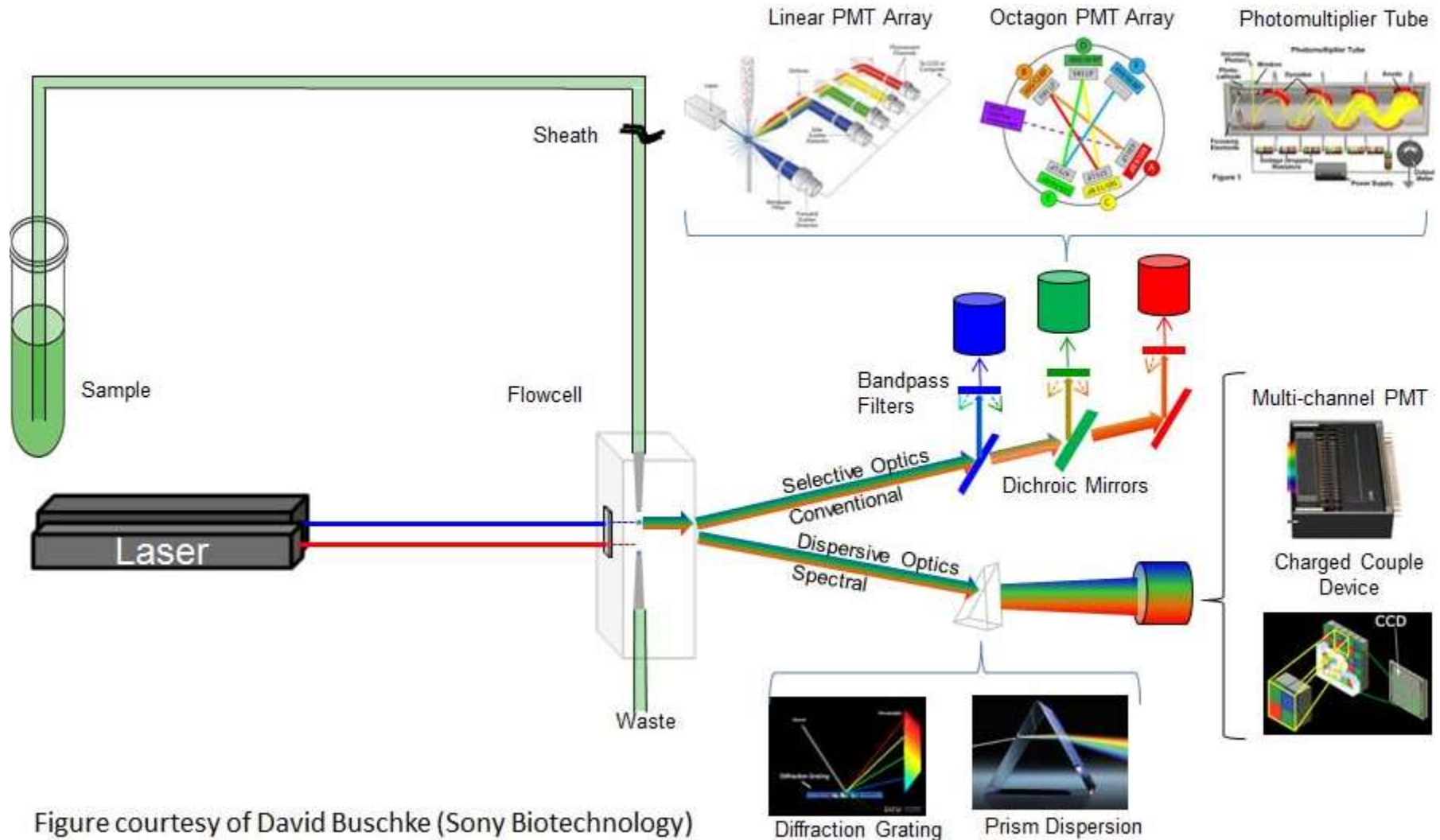
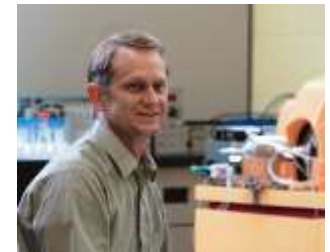
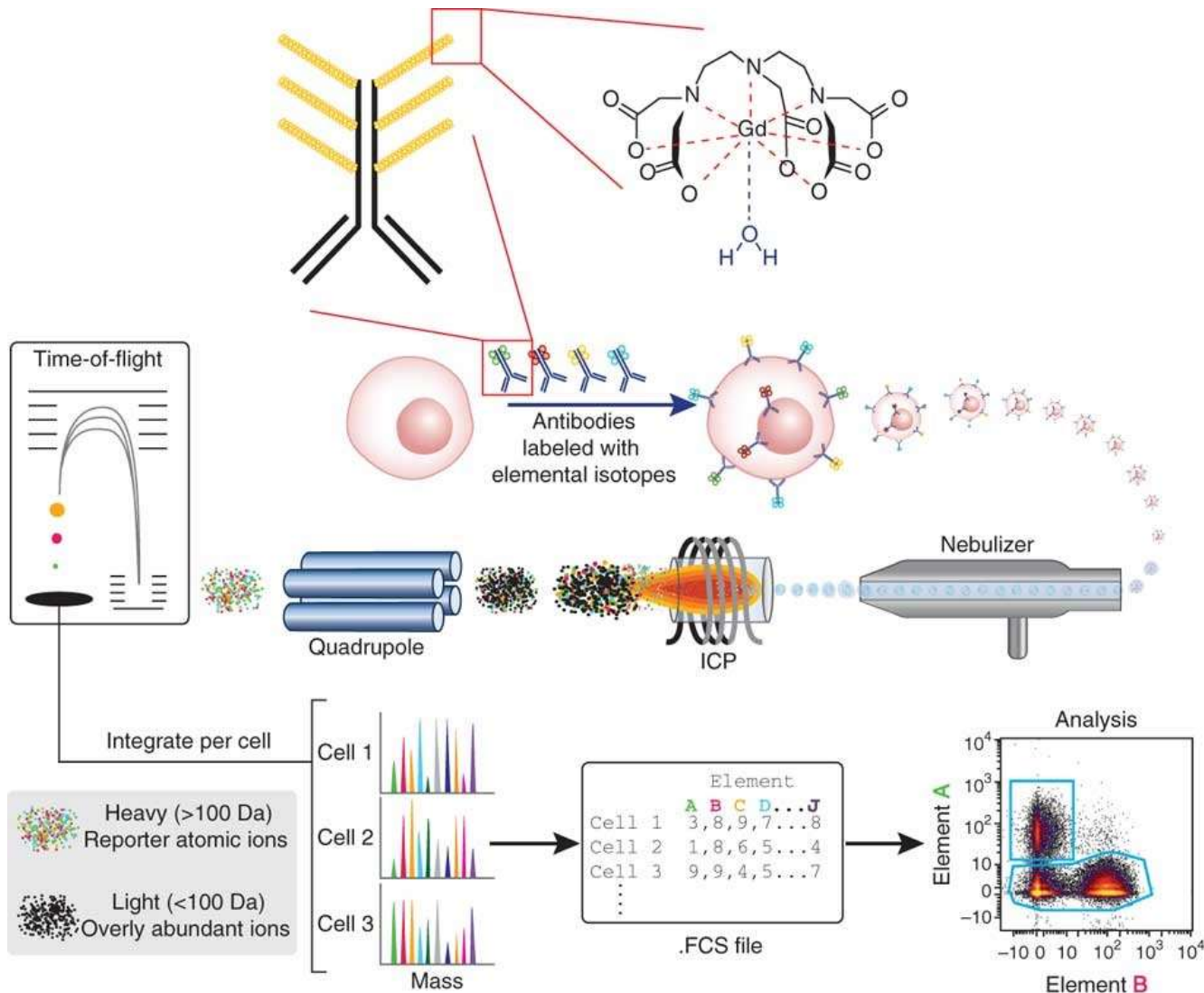


Figure courtesy of David Buschke (Sony Biotechnology)

Mass-Label Cytometer (CyTOF)



Imaging Flow Cytometers

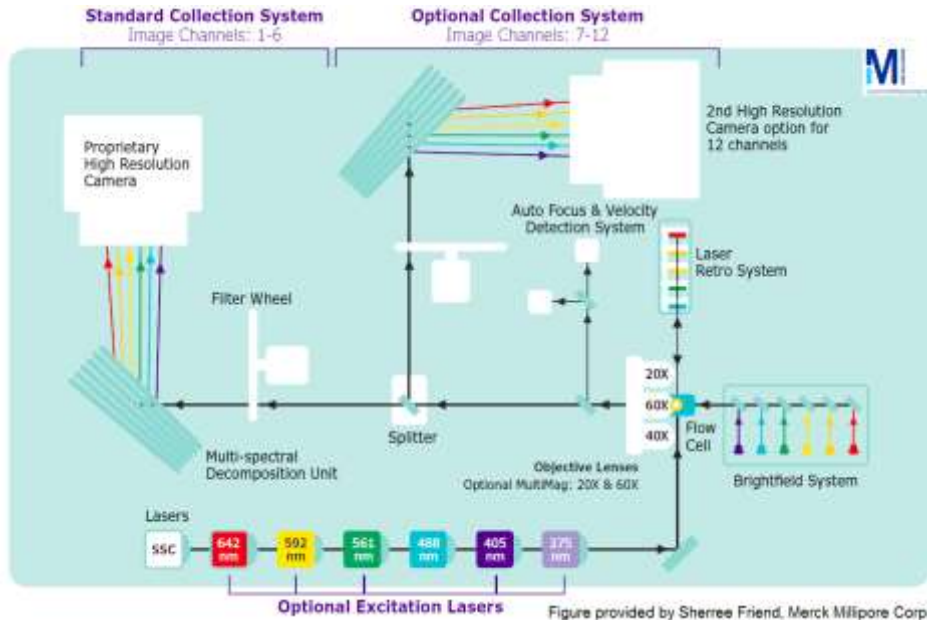
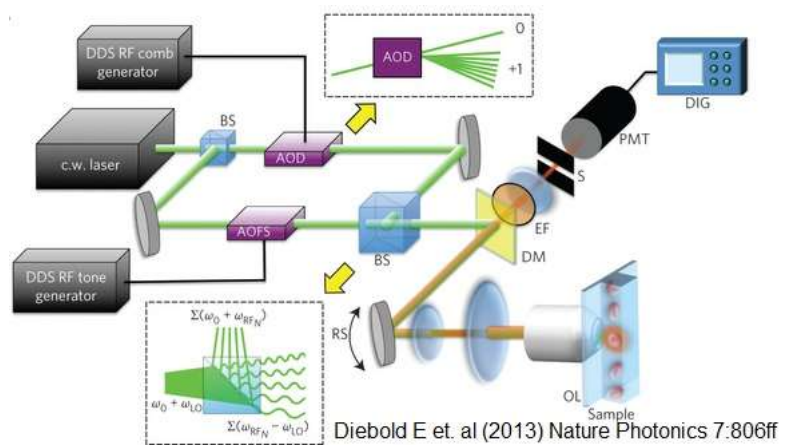
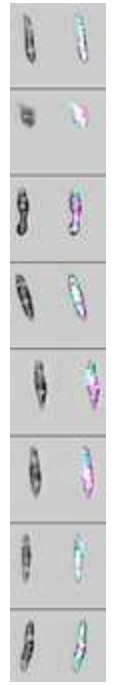
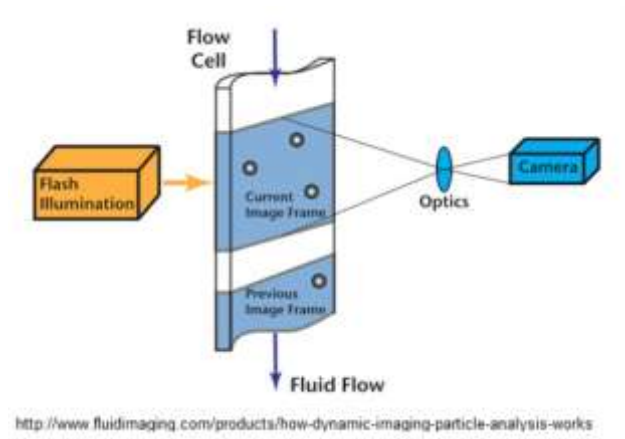


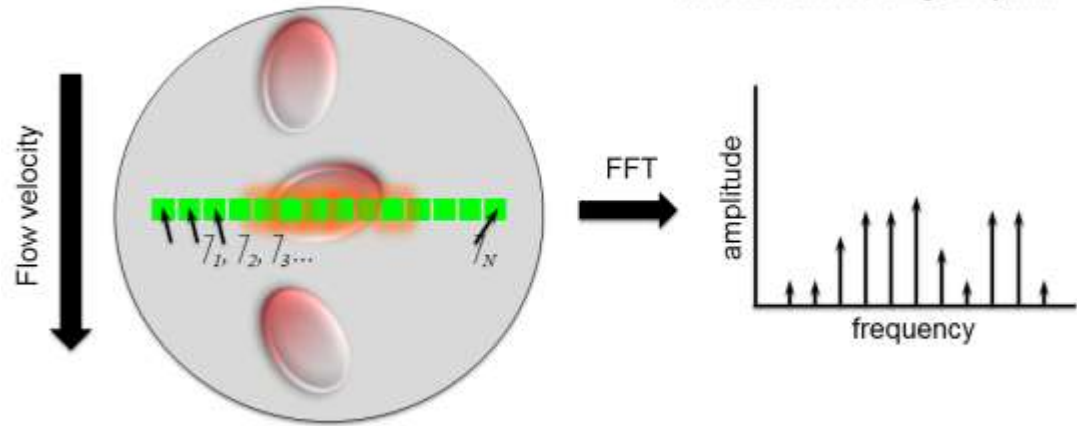
Figure provided by Sherree Friend, Merck Millipore Corp.



Diebold E et. al (2013) Nature Photonics 7:806ff

Flow cytometer field of view

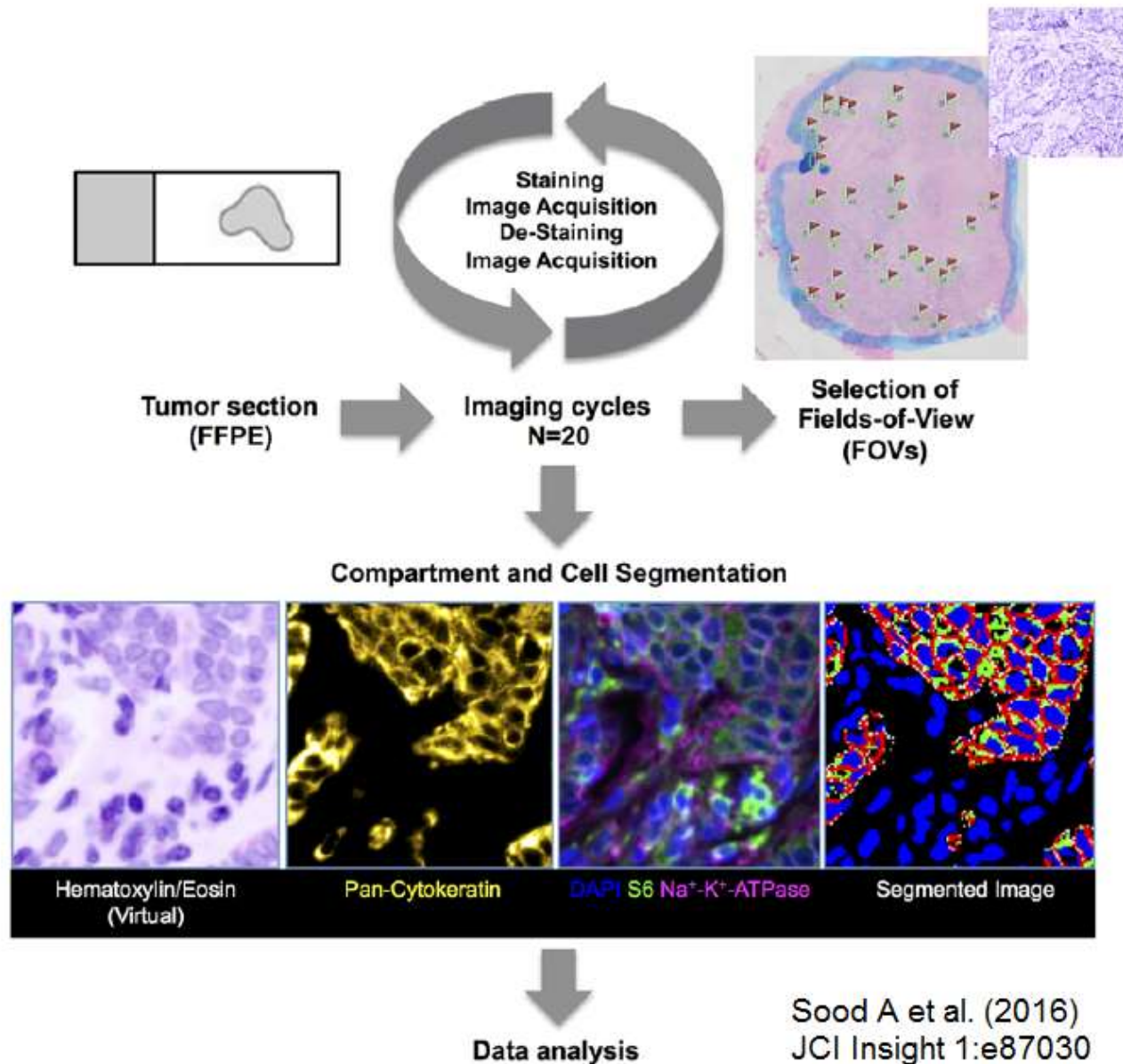
Source: Eric Diebold, Omega Biosystems



Spatial information is contained in frequency domain of fluorescence signal

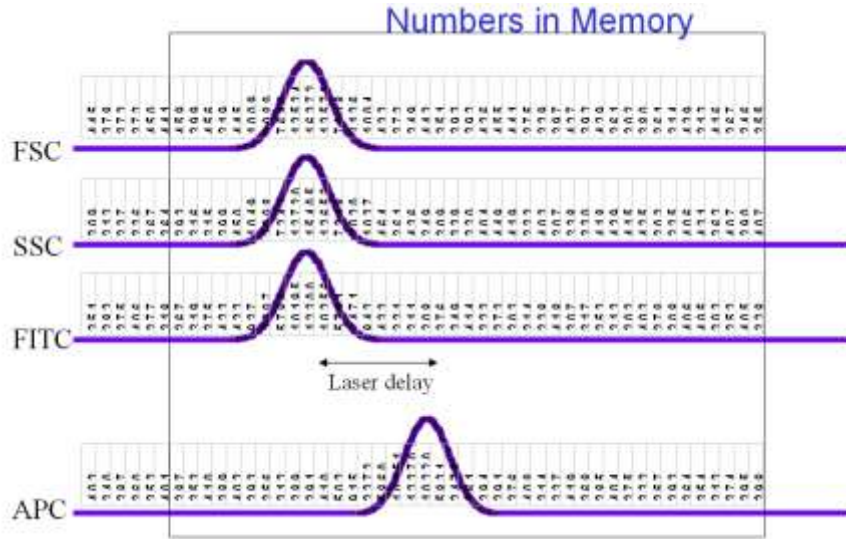
More info: Barteneva N.S. et al. (2012) Journal of Histochemistry & Cytochemistry 60: 723ff

Chip Cytometry

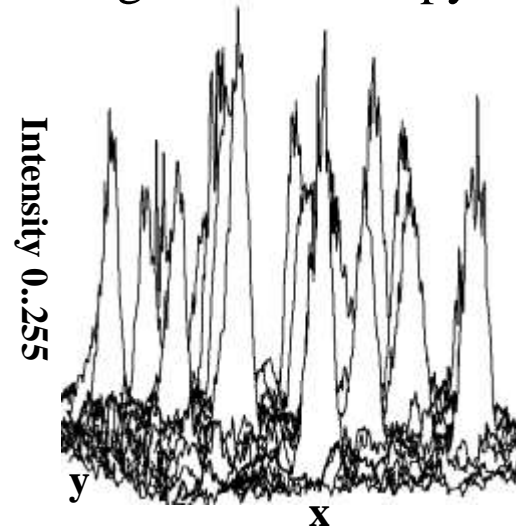


Basic Data Processing

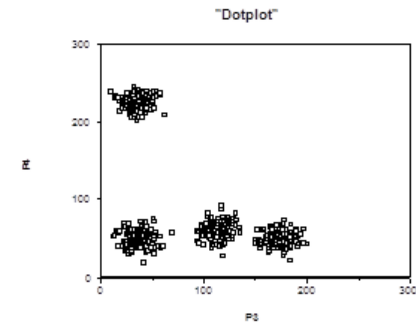
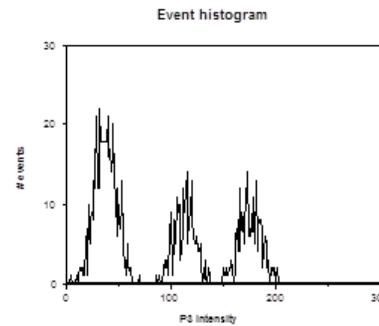
Flow Cytometry



Digital microscopy



| Cell | P1 | P2 | P3 | P4 | P5 | Pop# |
|-------|-----|-----|-----|------|-----|------|
| 1 | 242 | 135 | 704 | 175 | 612 | 1 |
| 2 | 146 | 132 | 690 | 178 | 566 | 1 |
| 3 | 269 | 147 | 89 | 206 | 580 | 3 |
| 4 | 442 | 143 | 399 | 250 | 255 | 4 |
| 5 | 212 | 167 | 155 | 926 | 526 | 2 |
| 6 | 269 | 2 | 659 | 207 | 575 | 1 |
| 7 | 204 | 232 | 112 | 171 | 679 | 3 |
| 8 | 152 | 74 | 160 | 828 | 532 | 2 |
| | | ... | | | | |
| 9997 | 215 | 119 | 138 | 936 | 662 | 2 |
| 9998 | 244 | 50 | 72 | 261 | 543 | 3 |
| 9999 | 214 | 137 | 174 | 1014 | 597 | 2 |
| 10000 | 312 | 87 | 110 | 904 | 560 | 2 |



for >2 parameters: gating, cluster analysis, ...

For many samples and parameters: bioinformatics

N. Aghaeepour et al. (2013) Nature Methods 10:228ff

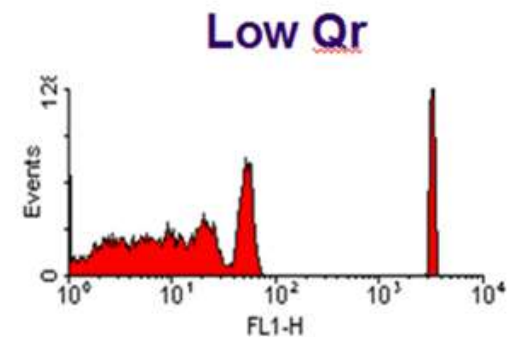
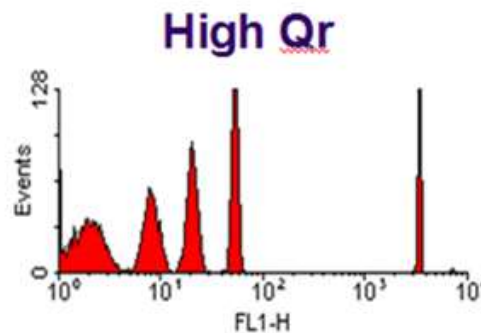
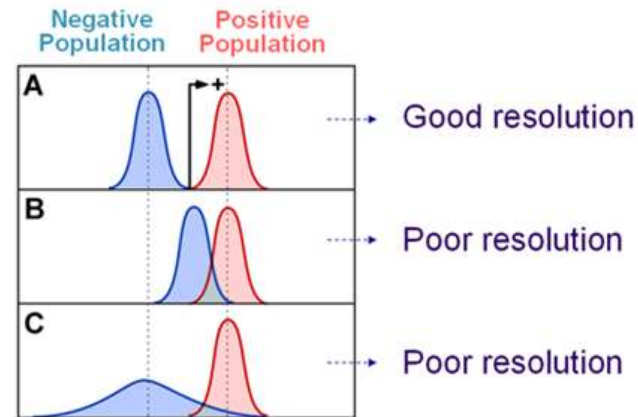
E.Lugli, M.Roederer, A.Cossarizza (2010) Cytometry 77A:705ff

Instrument Evaluation Br, Qr

Br, optical background from

- Free antibody/fluorochrome
- Flow cell, ambient light
- Raman scatter
- Spectral overlap
- Cell autofluorescence

Qr, photon detection efficiency



Spectral Overlap and “Compensation”

(not very relevant for element mass cytometry)

Calculation of concentrations
from optical/mass intensities

$$I_1 = a_{11} * c_1 + a_{12} * c_2 + a_{13} * c_3$$

$$I_2 = a_{21} * c_1 + a_{22} * c_2 + a_{23} * c_3$$

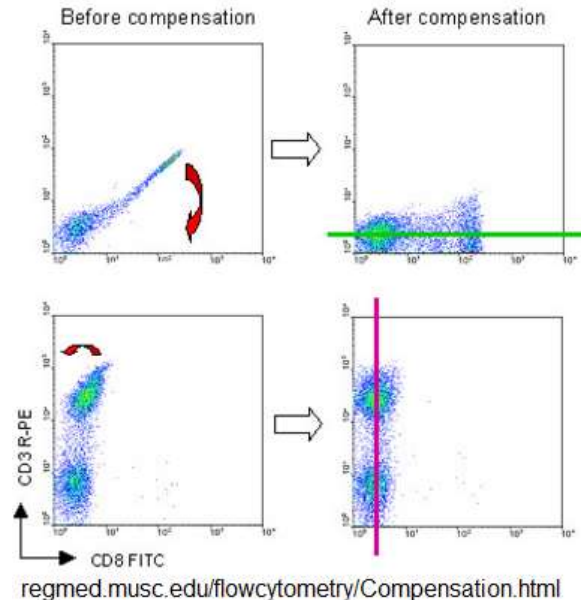
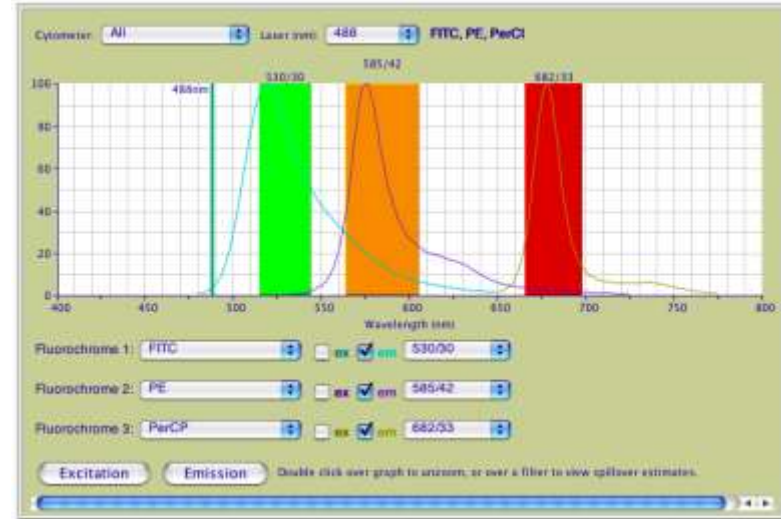
$$I_3 = a_{31} * c_1 + a_{32} * c_2 + a_{33} * c_3$$

a_{ik} : “compensation” matrix numbers

I_i : measured intensities

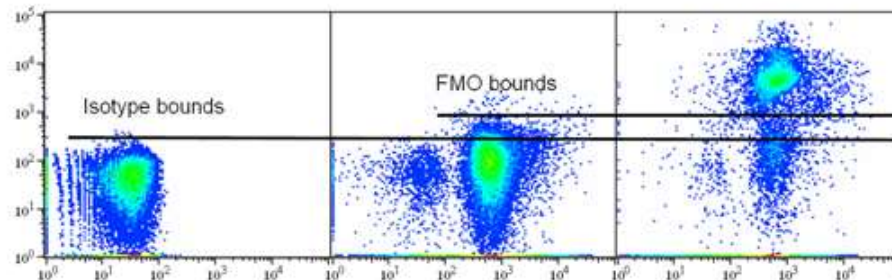
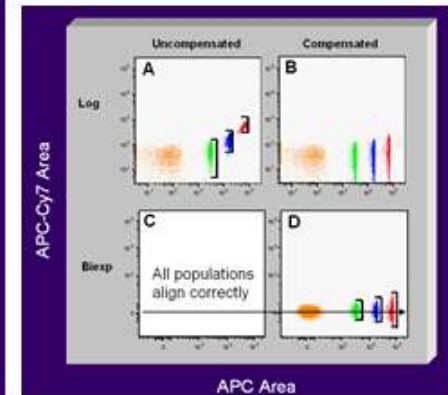
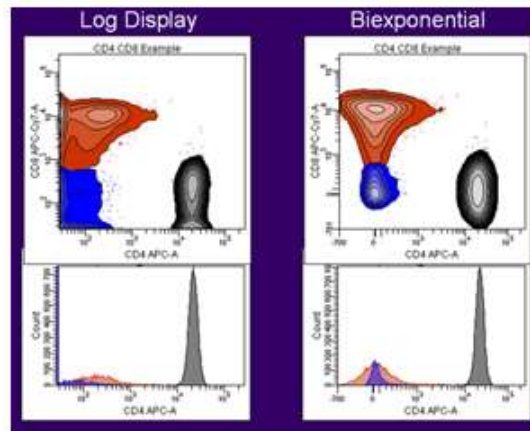
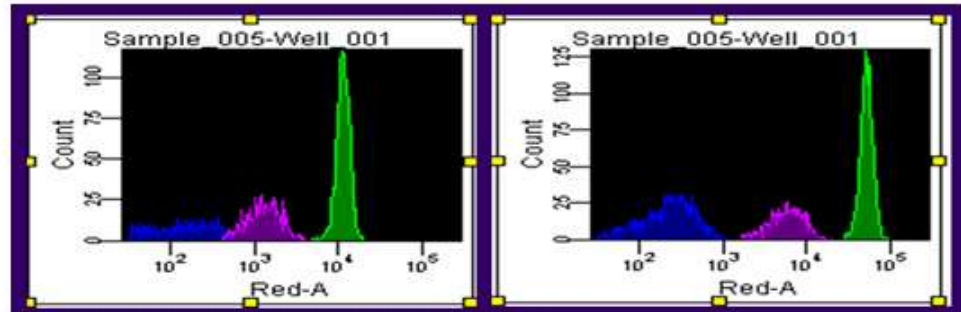
c_k : label concentrations

Solve n equations with n unknowns
(in spectral cytometry generally
many more equations than unknowns)



Optimizing cytometry measurements

- Gain (PMT, CMOS, CCD) settings
- Data Display
- Controls

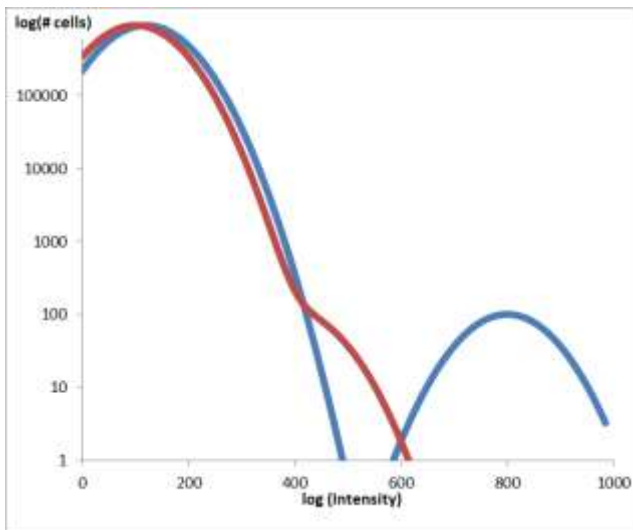


Label Selection

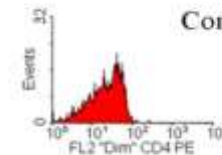
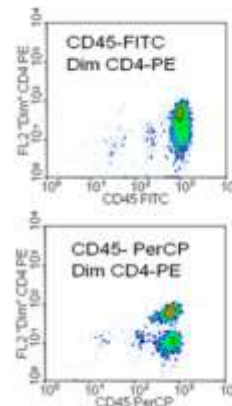
- Detection System
- Brightness
- Spectral Overlap
- Application (surface vs. internal)

Reagent performance $\frac{\text{Stain index}}{2 * SD_{neg}}$

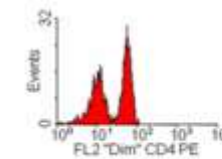
$$\frac{\text{Medium}_{pos} - \text{Medium}_{neg}}{2 * SD_{neg}}$$



Brightness and Separation



Compensated data



Better separation with less spectral overlap.

Spectral Overlap and Separation

More info: Maecker HT et al. (2004) Cytometry 62A:169-173

Multi-parameter Fluorescence Cytometry

Points To Consider

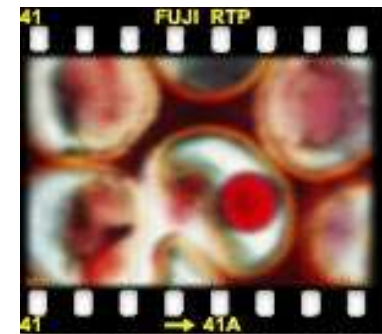
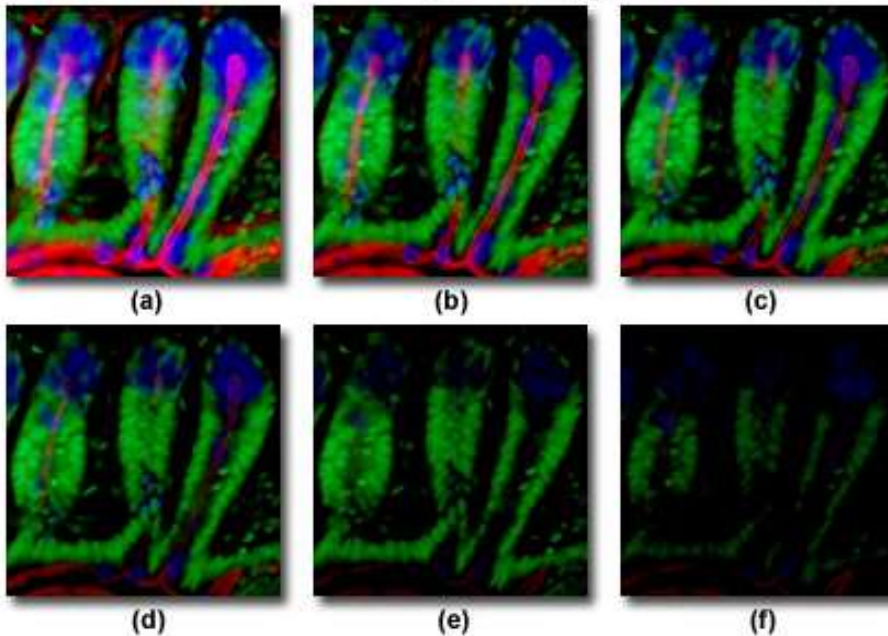
- Know your instrument status e.g. Qr & Br for different channels
- Use high enough gain settings to maximize sensitivity (check to avoid off-scale events)
- An antibody/dye combination with poor separation in a single color assay will not work for a multicolor experiment.
- Avoid spillover from bright cell populations into channels requiring high sensitivity
- Beware of tandem dye degradation
- Internal controls are essential

Quantitative Multi-color Microscopy

Additional factors

- Field to field focus
- Photobleaching

Differential Photobleaching in Multiply-Stained Tissues



Out of Focus

Images from

<http://micro.magnet.fsu.edu/primer/index.html>

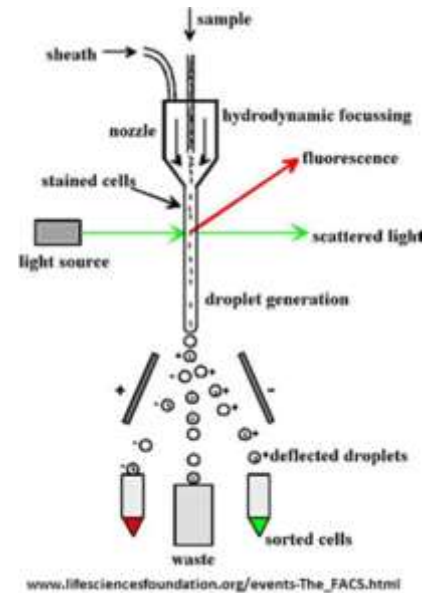
Cell Sorting

Technologies

- FACS
- Tyto/OWL
- DEP sorter
- Other sorters

- Bulk Sorting
 - Magnetic
 - Gravity
 - Acoustic
 - ...

Arnold LW, Lannigan J (2010)... Cell Sorting. Curr Prot Cytom, pp.1-24



Application Examples

- Chromosomes
- Cloning
- Strain Improvement
- Genomics
- Proteomics

Evaluating Cell Sorting Performance

- Purity, Yield
$$Purity = \frac{posFraction * posYield}{posFraction * posYield + negFraction * negYield}$$

<http://www.desatoya.com/PostersAndPresentations/SortingPerformanceEvaluation2016Feb.pdf>

- Fe Fd
$$\text{Enrichment rate } (f_E) = \frac{\% \text{ neg. cells in orig. sample}}{\% \text{ pos. cells in orig. sample}} \times \frac{\% \text{ pos. cells in pos. fraction}}{\% \text{ neg. cells in pos. fraction}}$$

$$\text{Depletion rate } (f_D) = \frac{\% \text{ pos. cells in orig. sample}}{\% \text{ neg. cells in orig. sample}} \times \frac{\% \text{ neg. cells in neg. fraction}}{\% \text{ pos. cells in neg. fraction}}$$

"Miltenyi S, Schmitz J. High Gradient Magnetic Cell Sorting, pages 216ff. in Radbruch A (Ed.) Flow Cytometry and Cell Sorting, 2nd edition. Springer Lab Manual 1999"

Miltenyi S, Schmitz J (1999)

- Rmax

| General Eq. | Simplified Eq. (Purity ≈ 100%) |
|---|---|
| $R_{max} = \frac{\frac{C_{nt}}{C_t} - \frac{O_{nt}}{O_t}}{\frac{C_{nt}}{C_t} - \frac{S_{nt}}{S_t}}$ | $R_{max} = 1 - \frac{O_{nt}}{O_t} \cdot \frac{C_t}{C_{nt}}$ |

Riddell A et al. (2015) Methods 82: 64-73

Riddell A et al (2015)

Conclusions

Multi-parameter cytometry

Optimized flow and imaging single cell cytometry with adequate bio-informatics tools provide quantitative molecular measurements into biological processes at organism, cellular and sub-cellular levels.

Many systems isolate selected single cells.

New developments in many areas provide more tools for cytometry.

More info: Bendall SC et al. (2012) Nature Biotech. 30:639-47

Maecker H, Trotter J (2011) Multicolor Flow Cytometry Application Note

Applications

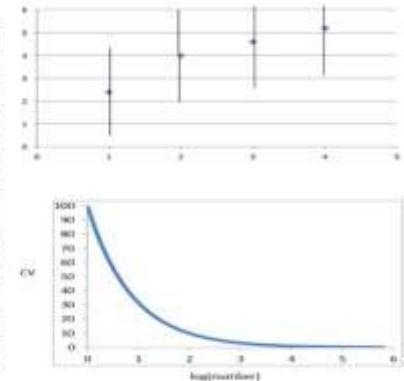
- Multi-parameter immunofluorescence (antibodies)
- Multi-parameter gene expression analysis (NA probes)
- Cell cycle analysis (high resolution FCM, imaging, BrDU)
- Molecular clustering (fluorescence energy transfer FRET)
- Kinetics (population-based flow cytometry, single cell by imaging; Ca⁺⁺ flux, enzyme activity, cell proliferation)
- Receptor ligand binding (by quantitative fluorescence)
- Single Cell Sequencing (single cell sorting, PCR amplif.)
- Particle-based assays (Luminex-type multiplexed assays)
- Rare Cell Research (*more on next slide*)

Rare Cell Analysis and Sorting

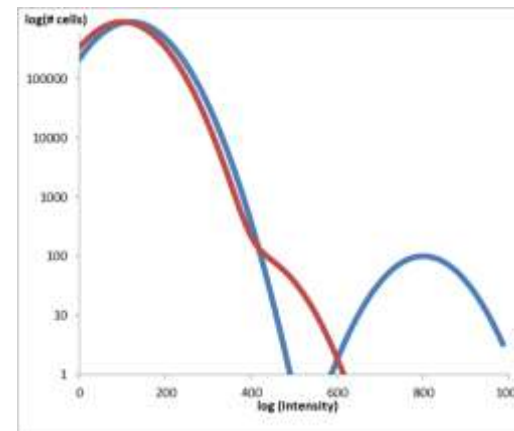
Examples CD34, AC133, antigen specific cells, CTCs

- Poisson count statistics
- Population Separation
- Bulk pre-enrichment or enrichment sorts

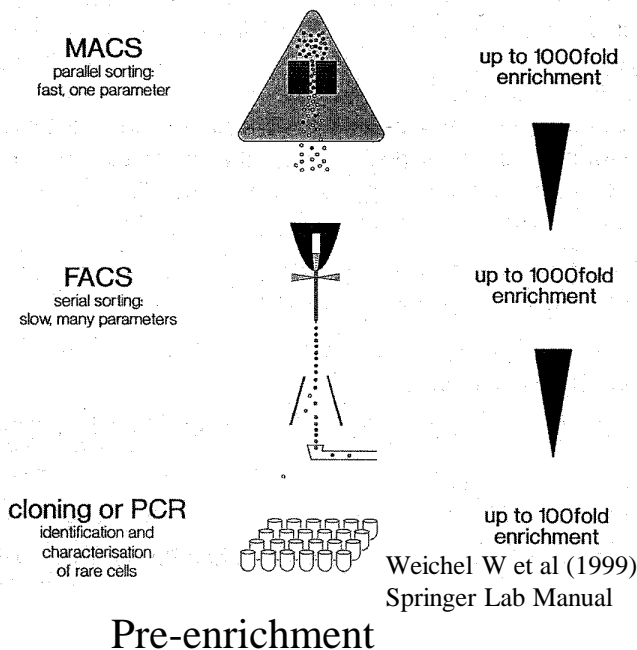
| | Sample 1 | Sample 2 | Sample 3 | Sample 4 |
|--------|----------|----------|----------|----------|
| | 6 | 2 | 6 | 8 |
| | 3 | 7 | 1 | 6 |
| | 1 | 3 | 5 | 3 |
| | 1 | 4 | 5 | 6 |
| | 1 | 4 | 6 | 3 |
| Mean | 2.4 | 4 | 4.6 | 5.2 |
| St.Dev | 2.2 | 1.9 | 2.1 | 2.2 |
| | | Overall | Mean | 4.1 |
| | | | St.Dev | 2.2 |



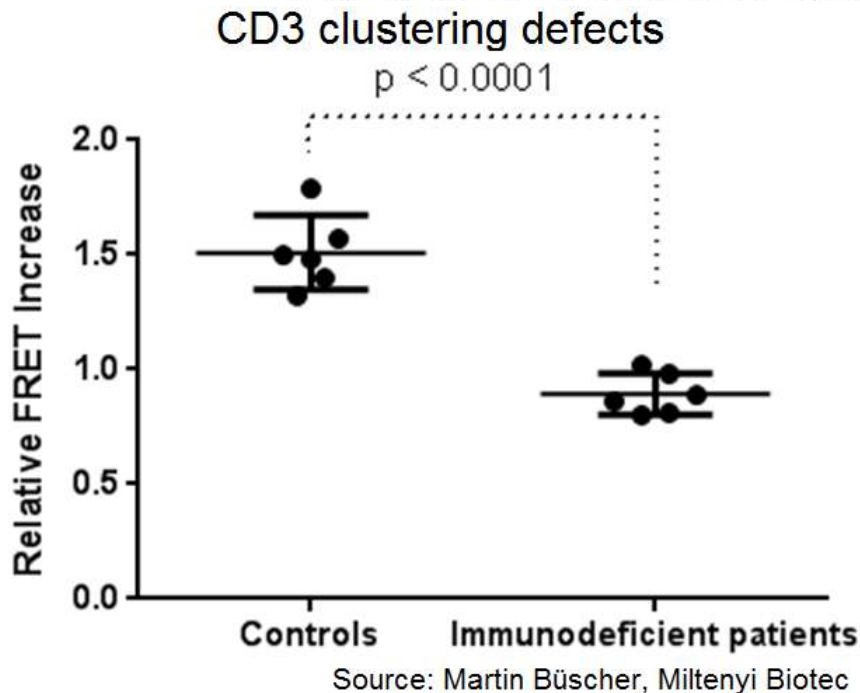
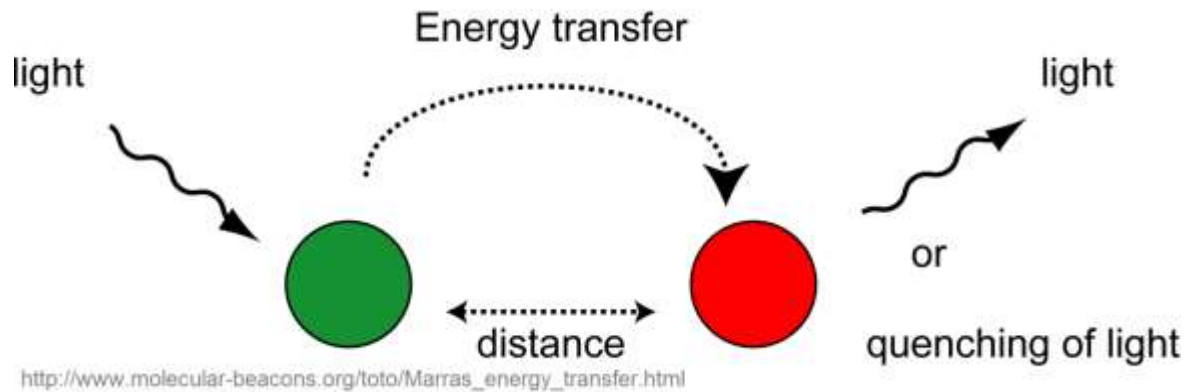
Ignoring Counting Statistics Can Lead to Erroneous Conclusions



Population Separation



Fluorescence Resonant Energy Transfer (FRET)



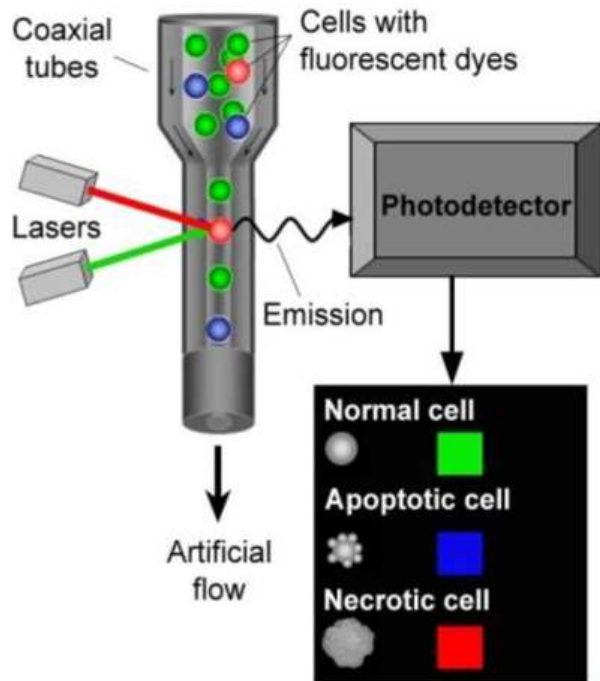
FRET measures the distance between molecules e.g. to detect clustering.

von Kolontaj, K. et al. (2016) *Automated measurement of protein-protein interactions*. Cytometry 89A:835ff

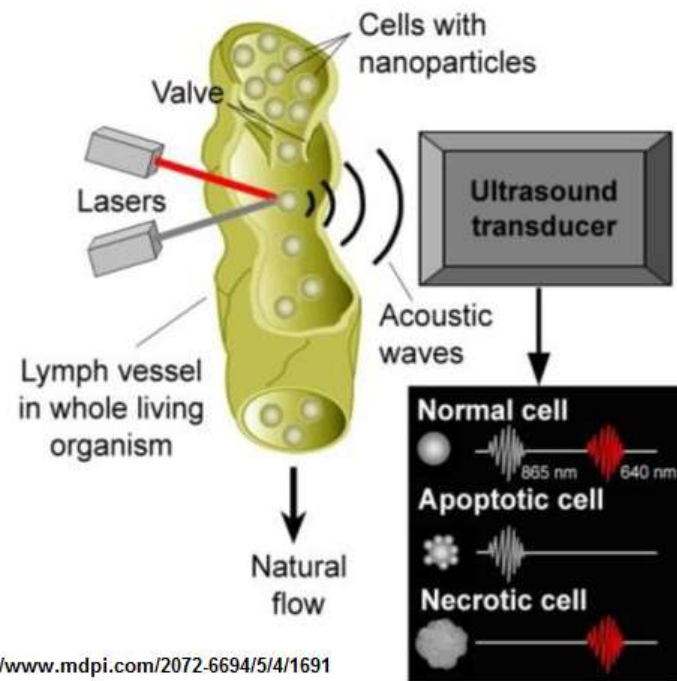
In-vivo Single Cell Analysis

- Intra-vital Imaging
- In-vivo Flow Cytometry

Conventional flow cytometry *ex vivo*

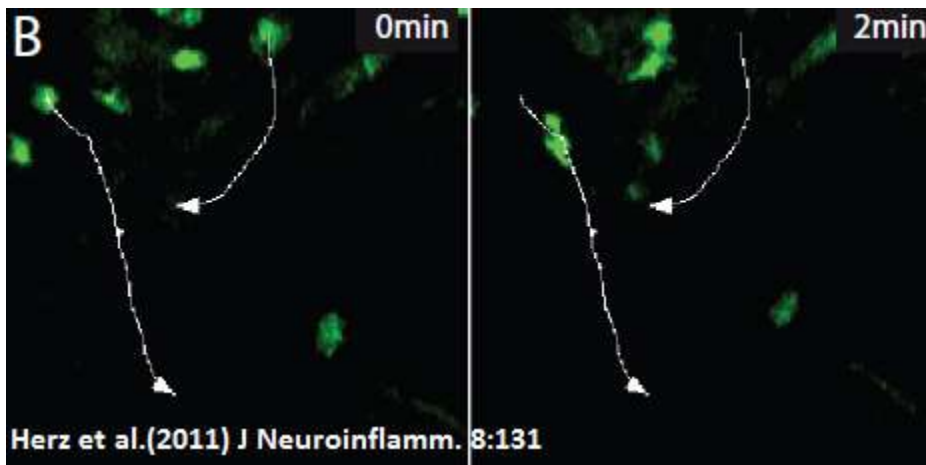
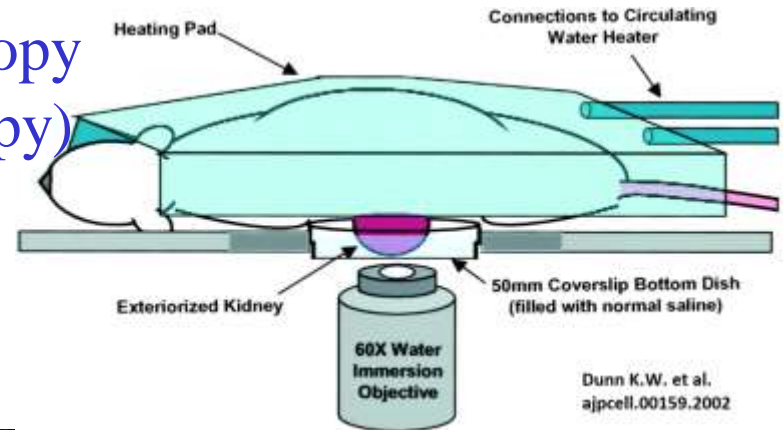


Photoacoustic lymph flow cytometry *in vivo*



Intra-vital Imaging

- Two-photon laser scanning microscopy
- Raman (SERS and CARS microscopy)
- Positron emission tomography
- Ultrasound, x-Rays
- ...



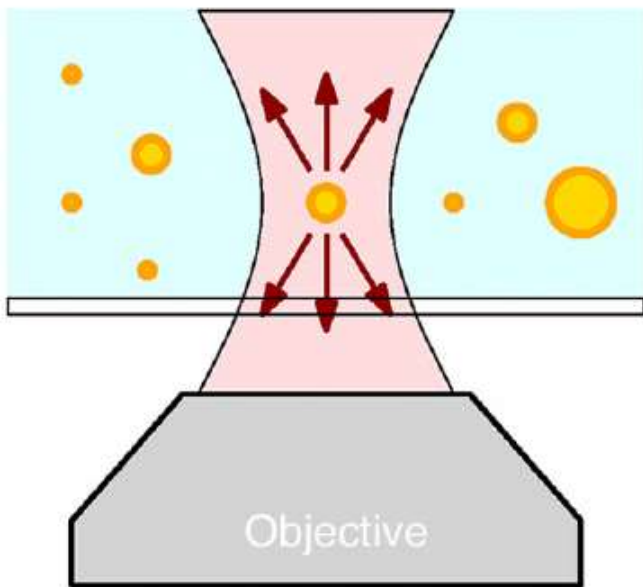
Issues:

- tissue optics
- object motion
- flow rate
- labeling
- ...

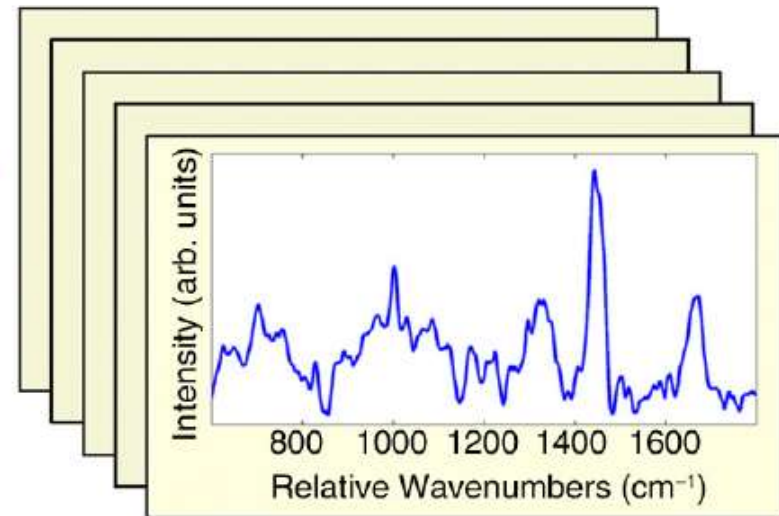
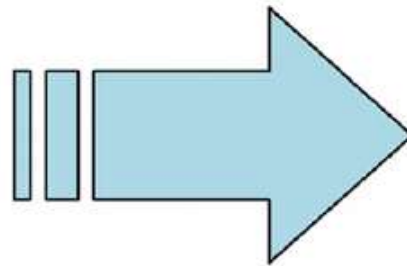
Recent review of in-vivo microscopy: Andresen V, et al. (2012) High-Resolution Intravital Microscopy. PLoS ONE 7(12): e50915

Label-Free Cytometry

- Autofluorescence
- Light Scatter
- Optical trap RAMAN
- Impedance
- Optical trap RAMAN
- RAMAN imaging
- ...



Laser Trapping of
Single Exosomes

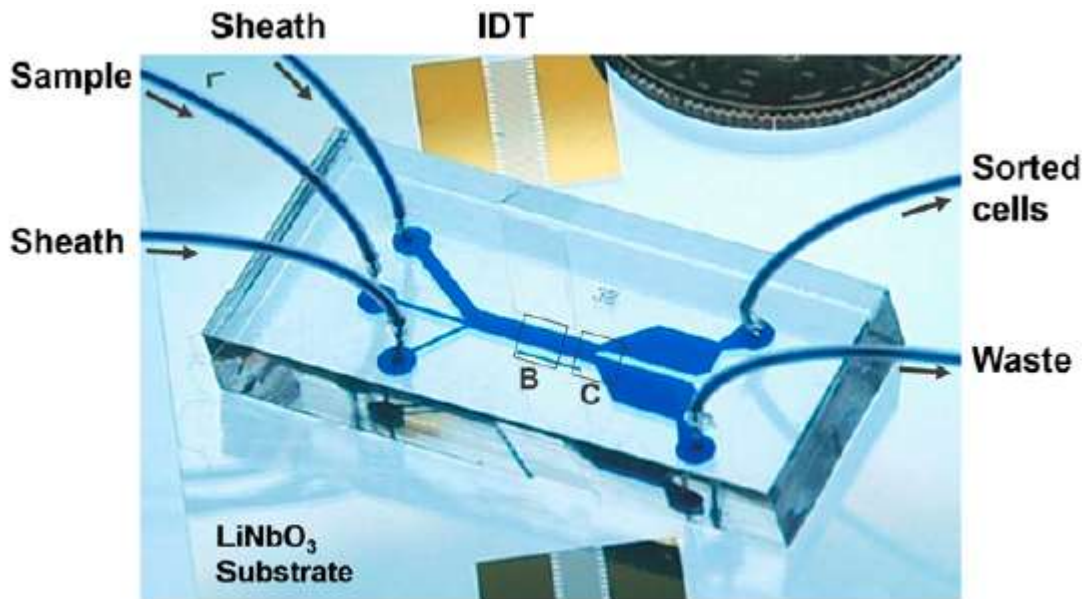


Raman spectra of
Single Exosomes

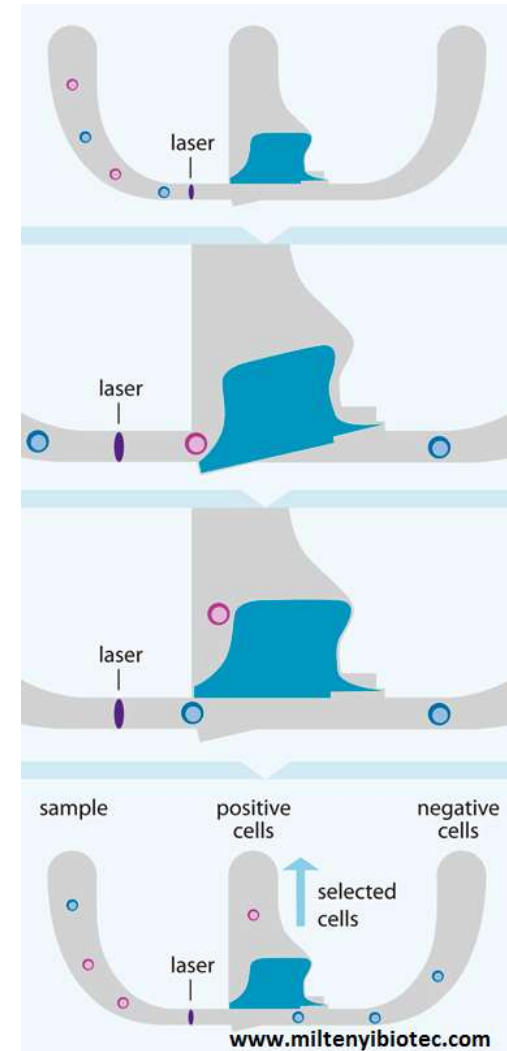
More Cell Sorting Technologies



DEPArray™ System

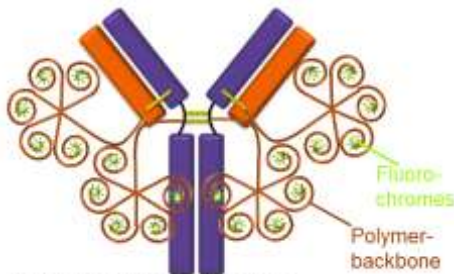


Ding X et al (2014) PNAS 111:12993ff; SAW cell sorting

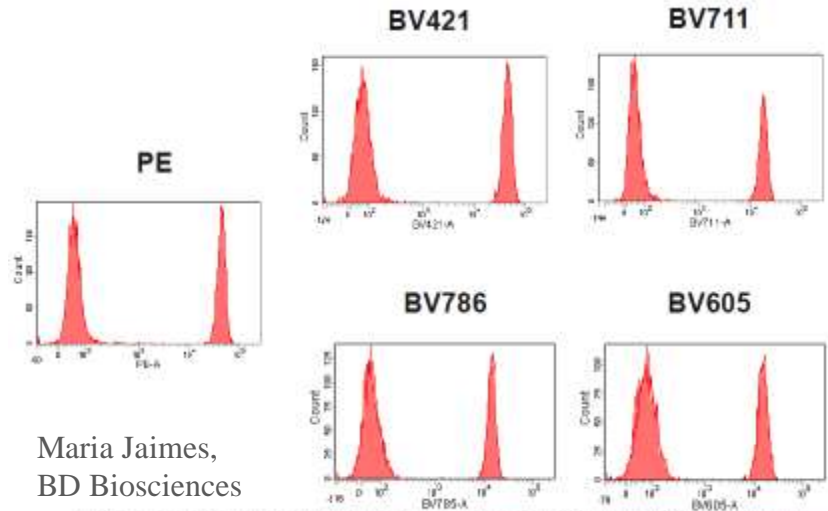
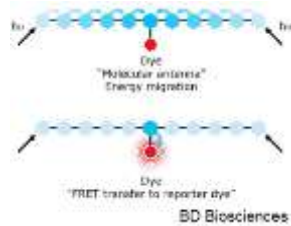


MACSQuant®Tyto™

New Bright Dyes



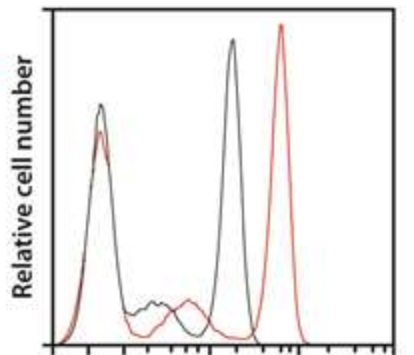
Viobright™ dyes, Christian Dose, Miltenyi Biotec



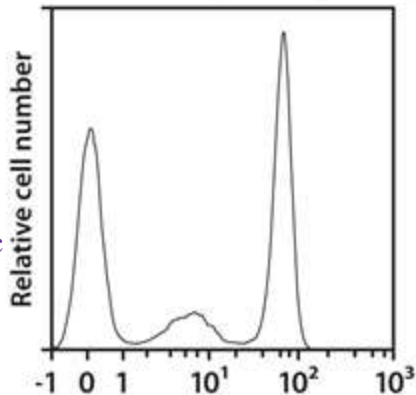
Maria Jaimes,
BD Biosciences

Maria Jaimes, page 17 in https://wwwbdbiosciences.com/documents/webinar_071713_multi-color-bv.pdf

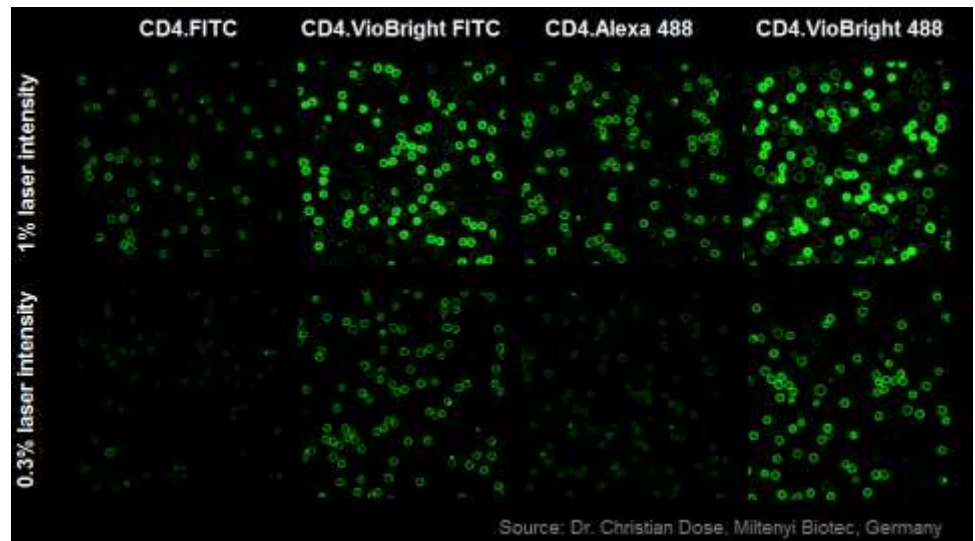
CD4-FITC
CD4-VioBright FITC
(clone Vit4.3)



CD4-PE
(clone Vit4.3)



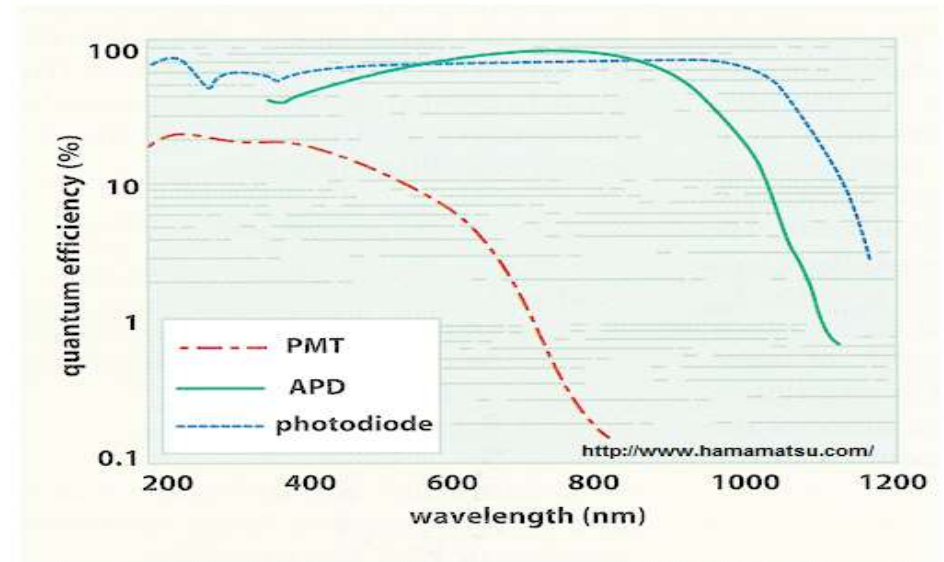
Source:
Christian Dose
Miltenyi Biotec



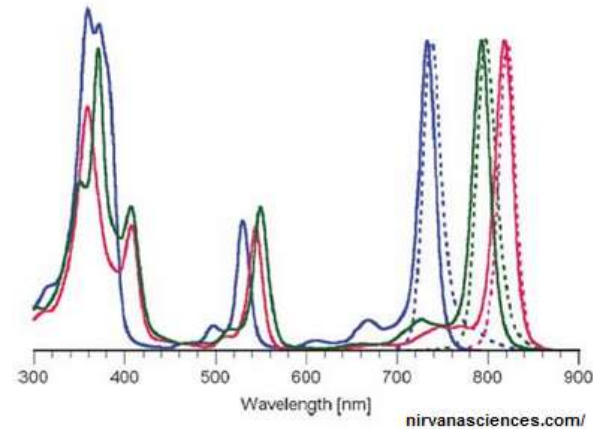
Source: Dr. Christian Dose, Miltenyi Biotec, Germany

New Detector-Label Combinations

- New photodetectors extend the available spectrum
(Si avalanche photodiodes extend detection into the far infrared)



- New dyes add excitation in the UV, some detection in the IR
(Fluorescent polymers, bacteriochlorins, ...)



Novel Affinity Reagents

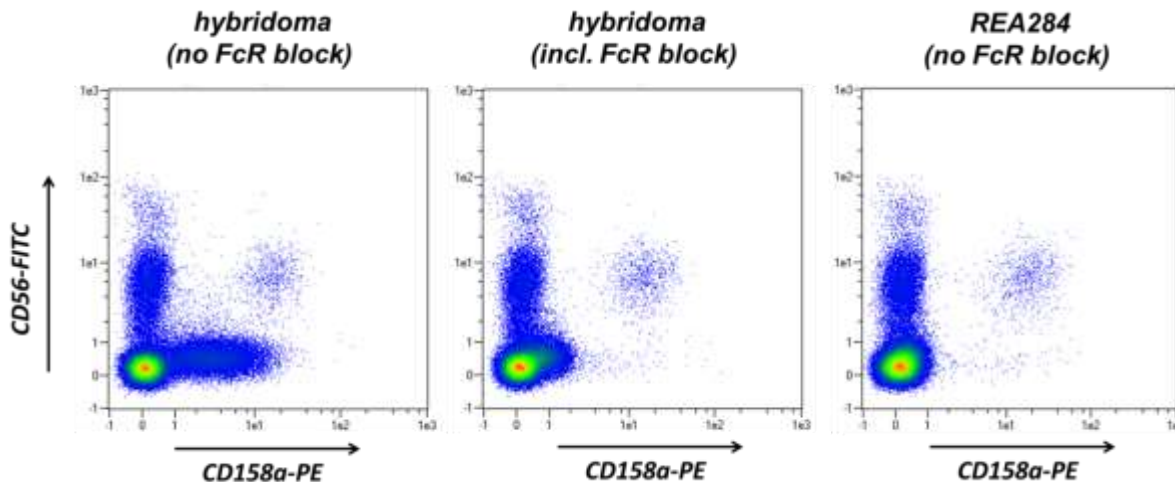
Antibodies

- Antibodies from different species (e.g. Llama 15 kDalton fragments 10^{-9} M Kd and high stability, potential for intracellular use)
- Recombinant antibody fragments
- ...

Synthetic affinity reagents

- Aptamers
- Protein scaffolds
- Molecular Imprinted Polymers
- ...

Fodey T et al; Trends in Anal. Chem. 30(2011) 254ff

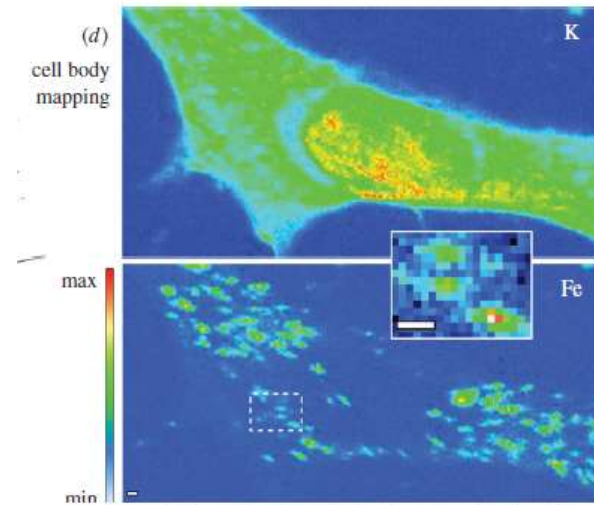


Fc-receptor binding:
CD158a-PE on PBMC

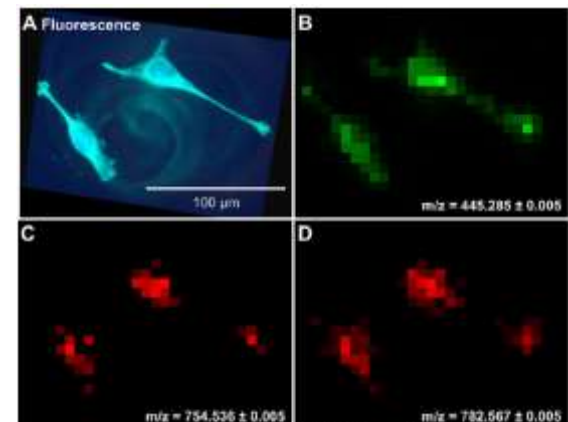
Source: Dr. Christian Dose, Miltenyi Biotec

New Detection Technologies

- High spatial resolution and multi-parameter capability with X-ray / synchrotron radiation fluorescence
(super-high resolution with element labels or direct element imaging)
- Medium resolution, multi-parameter mass spectrometric imaging
(CyTOF like element labels, direct metabolite or structural component detection)
- Label-free imaging with Raman
(measuring cellular components by their Raman spectra)
- Label-free medium resolution NMR imaging
(direct chemical detection)



Ortega R et al (2009) J.R. Soc Interface 6: S649-S658



Schober Y et al. (2012) Anal. Chem. 84, 6293ff

Conclusions

Evolving Technologies

Technology developments in algorithms, computing, detectors, electronics, nanotechnology, microfluidics, organic chemistry, and recombinant protein technology create the basis for new reliable analytical approaches for a deeper molecular understanding of living systems.

There is value in working with other scientific disciplines.

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More science detail and references: <http://www.desatoya.com>