17/03/2023

# IMAGE ANALYSIS TOOLS AND APPLICATIONS FOR CORRELATIVE MICROSCOPY

Perrine.paul-gilloteaux@univ-nantes.fr

Nantes Université, CHU Nantes, CNRS, Inserm, BioCore, SFR Bonamy, Nantes, France

Nantes Université, CNRS, INSERM, l'institut du thorax, Nantes, France.





# WHAT IS CORRELATIVE MICROSCOPIES?

### MULTIMODAL IMAGING FOR AN HOLISTIC VIEW



Walter, et al Correlated Multimodal Imaging in Life Sciences: Expanding the Biomedical Horizon. *Frontiers in Physics*, Frontiers, 2020, 8, <u>(10.3389/fphy.2020.00047)</u>

# THEN COME THE NATURAL NEED TO FUSE THEM

- Imaging the exact same specimen with two or more complementary modalities
- $\rightarrow$  Spans all relevant resolution ranges for one sample
- $\rightarrow$  Provides complementary information due to different contrast mechanisms
- $\rightarrow$  Identifies regions of interest & rare events for further analysis

# SOLUTION 1: USE SYSTEM INTEGRATING SEVERAL MODALITIES (HYBRID IMAGING)



Cal-Gonzales et al. Front. Phys., 18 May 2018 Sec. Medical Physics and Imaging https://doi.org/10.3389/fphy.2018.00047



Tserevakis et al. Scientific reports, 03 May 2022 Sec. Medical Physics and Imaging https://doi.org/10.3389/fphy.2018.00047

Confocal fluorescence + Photo Acoustic



SECOM from DELMIC integrated CLEM

- + Ready to use, no sample deformation
- Limited to the combination proposed: new information new machine?

# SOLUTION 2 : CORRELATIVE MICROSCOPY WITH SAMPLE TRANSFER BETWEEN ONE OR SEVERAL MODALITIES



P Jannin, Visages team 2005



Begemann I and Galic M (2016) Front Synaptyic Neurosci. doi: 10.3389/fnsyn.2016.00028 Live-cell imaging to locate a defined intermediate stage in endocytosis

Electron microscopy to obtain high-resolution of membrane curvature & endocytic structures



Kukulski/Briggs et al., Cell 2012

CLEM -> correlative light electron microscopy

# SOLUTION 2 : CORRELATIVE MICROSCOPY WITH SAMPLE TRANSFER BETWEEN ONE OR SEVERAL MODALITIES

- + limited by your imagination
- (and a few technical details)

#### Example in CLEM:

- Preserving fluorescence during fixation
- Dealing with sample transformation (or finding protocols/systems allowing good imaging quality even in Cryo for instance)
- Multimodal probes visible in different modalities
- Targeting the right area (the needle in the hay problem)
- Merging dataset



#### Bykov et al., FEBS Letters 2016 doi: 10.1002/1873-3468.12153

# MERGING DATASETS: COMPUTING THE LINK BETWEEN IMAGES/VOLUMES

#### **APPROACHES FOR AUTOMATIC AND SEMI REGISTRATION**

**Fiducial**= any stuff you or the computer can recognise in both images and that will be used for registration

#### **Not Fiducial**= any stuff NOT USED for registration











2D/3D manually paired fiducial based registration Line registration Linear and non linear Error assessment construct your automatic registration workflow

#### Published: 31 January 2017

eC-CLEM: flexible multidimensional registration software for correlative microscopies

<u>Perrine Paul-Gilloteaux</u> ⊠, Xavier Heiligenstein ⊠, Martin Belle, Marie-Charlotte Domart, Banafshe Larijani, Lucy\_Collinson, Graça Raposo & Jean Salamero

Nature Methods 14, 102-103 (2017) Cite this article

#### NEW VERSION !! (beta but usable) -MUCH MORE FASTER

- LESS GREEDY in memory
- New tools for error estimation (colocalization like)
- New Tools to ease your correlative WF constructions (export)
  - New Tool for visualization



# Ec-clemv2 another plugin of ICY for the new version







Name	Conto	Interior (px)	Area (u	Mean Inte	Mean Int	Max Inte	Max Intens	Texture contr	Texture contrast	Texture homogeneity (c	Texture homogeneity (c
Polygon2D	710.08	20316.5	79.361	13492.1	358.91	154107.3	8919.14	37.886	37.532	0.63182	0.59267
Polygon2D	1015.9	64424.5	251.66	7813.26	68.502	124714.1	3707.97	14.366	1.9072	0.78402	0.85863
Polygon2D	1011.11	63754	249.04	20290.6	58.312	231600.6	3159.71	66.098	0.99523	0.53865	0.88852

# SAMPLE TO BE TRACKED FROM ONE IMAGING MODALITY TO ANOTHER





Sometimes additional modalities will help

Ecclem Cascaded transform/ Invert Transform IN ADDITION TO COORDINATES TRANSFER BETWEEN IMAGING MODALITIES, IMAGE REGISTRATION WILL HELP TO FIND THE RELATIONSHIP BETWEEN IMAGES





Ecclem Cascaded transform/ Invert Transform

# TRANSFORMATION CAN BE RIGID OR NON RIGID, BUT THEY CAN ALWAYS BE CASCADED



T a->d=T a->b o T b->c o T c->d

Ecclem Cascaded transform/ Invert Transform

### EXAMPLE OF USE OF CASCADED TRANSFORM

#### Cell

Resource

Volume 182, Issue 2, 23 July 2020, Pages 515-530.e17

3D Correlative Cryo-Structured Illumination Fluorescence and Soft X-ray Microscopy Elucidates Reovirus Intracellular Release Pathway

Ilias Kounatidis <sup>1 10</sup>, Megan L. Stanifer <sup>2 10</sup>, <u>Michael A. Phillips</u> <sup>1 3 4 10</sup>, <u>Perrine Paul-Gilloteaux</u> <sup>5 6</sup>, Xavier Heiligenstein <sup>7</sup>, <u>Hongchang Wang</u> <sup>1</sup>, <u>Chidinma A. Okolo</u> <sup>1</sup>, <u>Thomas M. Fish</u> <sup>1</sup>, <u>Matthew C. Spink</u> <sup>1</sup>, <u>David I. Stuart</u> <sup>1 4</sup>, <u>Ilan Davis</u> <sup>3</sup>, <u>Steeve Boulant</u> <sup>8 9</sup>, <u>Jonathan M. Grimes</u> <sup>1 4</sup>, <u>Ian M. Dobbie</u> <sup>3</sup>, <u>Maria Harkiolaki</u> <sup>1 11</sup> <sup>9</sup>,













#### **EXAMPLE FOR CRYO-SIM AND SOFT X-RAY CORRELATION** WORKFLOW

Kounatidis I, Stanifer ML, Phillips MA, Paul-Gilloteaux P, et al. 3D Correlative Cryo-Structured Illumination Fluorescence and Soft X-ray Microscopy Elucidates Reovirus Intracellular Release Pathway. Cell. 2020





1µm ullet

Test on mitochondria stained cells : here we could conclude that there were no deformation in the correlative imaging process: all discrepancy was in the expected range of rigid transformation



Data available on ZENODO

- U2OS cells stably expressing red fluorescence (mCherry-Galectin-3), indicators of endosomal membrane disruption
- infected by a a fluorescent reovirus green  $\bullet$ fluorescence (Alexa647-reovirus)
- sample vitrification: frozen in liquid nitrogen-cooled liquid ethane

# COMPUTING AND USING ERROR IN REGISTRATION

- One thing to know: Matching is NEVER PERFECT
  - Because your sample may deform/ evolve between two modalities
  - Because multimodality is usually also multiscale (very different resolution, one pixel can match hundred of pixels in the second modality)
  - Because none modality allows to perfectly locate one structure of interest (imaging resolution). Even when the sample did not deform at all , this will create an error you can not avoid, only reduce.

#### WE HAVE DEVELOPED A METHOD TO SPATIALLY ASSESS THE QUALITY OF REGISTRATION WITH NO GROUND TRUTH (NO OTHER INPUT THAT POINTS (OR SURFACE) USED FOR REGISTRATION: LOCALISATION NOISE AND ERROR REGISTRATION ARE ESTIMATED).

G. Potier, F. Lavancier, S. Kunne and P. Paul-Gilloteaux, "A Registration Error Estimation Framework for Correlative Imaging," *2021 IEEE International Conference on Image Processing (ICIP)*, 2021, pp. 131-135, doi: 10.1109/ICIP42928.2021.9506474.



400nm







LEAVE-ONE OUT approach: Correlated fluorescence and 3D electron microscopy with high sensitivity and spatial precision Kulkuski, Schorb et al. JCB 2011

fiducials

Not

fiducials



# APPLICATIONS

# EXAMPLE FOR CRYO-SIM AND SOFT X-RAY CORRELATION WORKFLOW

Kounatidis I, Stanifer ML, Phillips MA, Paul-Gilloteaux P, et al. 3D Correlative Cryo-Structured Illumination Fluorescence and Soft X-ray Microscopy Elucidates Reovirus Intracellular Release Pathway. Cell. 2020





Test on mitochondria stained cells : here we could conclude that there were no deformation in the correlative imaging process: all discrepancy was in the expected range of rigid transformation





#### reovirus-infected U2OS cells

1h after infection, a number of small but distinct vesicles are both Gal3 and MRV

positive



2h post infection smaller endosomes have now merged to give rise to MVBs that have distinct compartments infused with Gal3 while others have not been similarly compromised (presumably arising from concatenation of membranes from MRV-free vesicles). Carbon-rich virusinduced domed structures are also seen in single vesicles.



4 hours post infection Fluorescence is shown in smaller vesicles alongside large vesicle superstructures

#### CRYO FIB-SEM/ FM EXAMPLE WITH LIPID DROPLETS AS FIDUCIALS







Volume 24, Issue 7, 23 July 2021, 102714

Article

*In situ* fiducial markers for 3D correlative cryo-fluorescence and FIB-SEM imaging

Nadav Scher<sup>1</sup>, Katya Rechav<sup>2</sup>, Perrine Paul-Gilloteaux<sup>3</sup>, Ori Avinoam<sup>14</sup> 🙁 🖾

#### EXAMPLE OF CREATED WORKFLOW: CRYO FIB SEM AND CRYO WF









#### **STAR Protocols**

Volume 3, Issue 1, 18 March 2022, 101142

Protocol

Sample preparation and image registration for correlative cryo-FM and cryo-FIB-SEM of plunge-frozen mammalian cells

CellPress

Nadav Scher <sup>14</sup>, Katya Rechav <sup>2</sup>, Perrine Paul-Gilloteaux <sup>3</sup>, Ori Avinoam <sup>15</sup> 🙁 😆

#### Test affine transform: Deformation in one axis.

#### IN SITU LAMELLA







#### Acquisition:

Get Fluorescent Stack of area with bacteria : Target Area on the grid to make multiple lamella: link known Pick all Bacteria that can be found on the lamellae for Cryo-TEM: link lost

-> Need for automation of Tomograph-Fluo matching

Lea Swistak, Marvin Albert, Anna Sartori, Jost Enninga Institut Pasteur Paris

Unpublished work



Screenshots from ThermoFisher Ditactic Video for Cryo TEM on lamella











# CORRELATIVE MICROSCOPY

**Beyond CLEM** 

#### MORE MULTIMODAL (WHY MULTIMODAL?)



 Validate and understand a new modality or a new biomarker/probe/ contrast enhancement preparation.



Visualizing enteric nervous system activity through dye-free dynamic full-field optical coherence tomography

Tony Durand, Perrine Paul-Gilloteaux, Michalina Gora, Lara Laboudie, Emmanuel Coron, Isabelle Neveu, Michel Neunlist 🖾 & Philippe Naveilhan

Communications Biology 6, Article number: 236 (2023) Cite this article



# HELP TO LINK MULTIMODALITIES

#### Multimodality imaging and transcriptomics to phenotype mitral valve dystrophy in a unique knock-in Filamin-Arat model Get access >

Constance Delwarde, Claire Toquet, Pascal Aumond, Amir Hossein Kayvanjoo, Adrien Foucal, Benjamin Le Vely, Manon Baudic, Benjamin Lauzier, Stéphanie Blandin, Joëlle Véziers, Perrine Paul-Gilloteaux, Simon Lecointe, Estelle Baron, Ilaria Massaiu, Paolo Poggio, Séverine Rémy, Ignacio Anegon, Hervé Le Marec, Laurent Monassier, Jean Jacques Schott, Elvira Mass, Julien Barc, Thierry Le Tourneau, Jean Merot ⊠, Romain Capoulade ⊠

Cardiovascular Research, cvac136, https://doi.org/10.1093/cvr/cvac136 **Published:** 24 August 2022 Article history ▼







T



Masson's trichrome



#### Kratoscope: Serial sectioning and imaging





#### **Applications: Correlative imaging**

3D reconstruction from serial block face imaging





HPS staining on collected sections and segmentation of main organs 1/Heart, 2/Liver, 3/Lung, 4/Gut



Segmentation correlated to the corresponding slice of the serial block face imaging





2D section registered in the 3D volume and 3D segmentation of the heart was performed (ICY) Heart volume : 0.746 mm<sup>3</sup>.















# CONCLUSION

• Registration allow to link multimodal data through a transformation, which can be cascaded

- Example of applications in
  - Cryo Xray and cryo SIM
  - Cryo FIB SEM and cryo WF
  - In situ Cryo Tem of Iamellae
  - FFOCT and Confocal
  - Histology and MicroCT



# CONCLUSION

 Registration uncertainty can be estimated (accurate for rigid and affine registration for now-> non rigid local affine of

- This has multiple purposes:
  - Target area accuracy (Adding error margin for Example)



- Multimodal colocalisation
- Model selection (to be deformed or not to be deformed



# Acknowledgements

ANR-18-CE45-0015	ITX Nantes Guillaume Potier Stephan Kunne Laboratoire de M Frédéric Lavancier	lathématiques J. Leray	EC-CLEM work Weizmann Institute Nadav Scher Katya Rechav Ori Avinoam	flows Diamond Light Source Maria Harkiolaki Nina Vyas All team
MicroPICell Anabelle Justin Aurélie Doméné	<u>Kaerlabs</u>	Lea Swistak Jost Enninga Anna Sartori Marvin Albert	L'Institut du Thorax N Jean Mérot Pascal Aumond Constance Delwarde	Nantes
Stéphanie Blandin Philippe Hulin Magalie Feyeux Steven Nedellec Anne Gaignerie <i>Marianne Guisset</i> <i>Héloïse Duluc</i>	Perrine de Villemagr Pierre-Alix Dancer Guillaue Schmid Paul Dorval	AER LABS	Romain Capoulade Laetitia Rialland D-FFOCT Tens Nantes Philippe Naveilhan Tony Durand Michel Neunlist	







**EC-CLEM** error estimation







