DryMass Documentation

Release 0.1.4

Paul Müller

Contents:

1	Intro 1.1 1.2		DryMass?	3 3	
2		ry Notes			
	2.1		tation of cell dry mass	5	
		2.1.1	Definition	5	
		2.1.2	Relative and absolute dry mass	6	
		2.1.3	Notes and gotchas	6	
3	Getti	ng starte		7	
	3.1	Installir	ng DryMass	7	
		3.1.1	Upgrade	7	
		3.1.2	Known issues	8	
	3.2		and line interface	8	
		3.2.1	dm_convert	8	
		3.2.2	dm_extract_roi	9	
		3.2.3	dm_analyze_sphere	9	
	3.3	_	rration file	9	
		3.3.1	[bg] Background correction	10	
		3.3.2	[holo] Hologram analysis	10	
		3.3.3	[meta] Image meta data	10	
		3.3.4	[output] Supplementary data output	11	
		3.3.5	[roi] Extraction of regions of interest	11	
		3.3.6	[specimen] Specimen parameters	11	
		3.3.7	[sphere] Sphere-based image analysis	11	
4	Tuto	rials		13	
	4.1	T1: Bea	ad analysis (CLI)	13	
		4.1.1	Introduction	13	
		4.1.2	Prerequisites	13	
		4.1.3	Execute dm_analyze_sphere	13	
		4.1.4	Examine the results	14	
		4.1.5	Post-processing	15	
	4.2	T2: HL	60 cell analysis (CLI)	16	
		4.2.1	Introduction	16	
		4.2.2	Prerequisites	16	

Рy	thon I	Module I	ndex	39
Bi	bliogr	aphy		37
9	Indic	ces and ta	ables	35
8	Bilbl	iography		33
7	7.1 7.2 7.3 7.4 7.5	version version	0.1.4 0.1.3 0.1.2 0.1.1 0.1.0	31 31 32
6	Code 6.1	e reference cfg_fun	ce cs	29 29
5	Code 5.1 5.2		es ss computation with radial inclusion factor	
		4.2.3 4.2.4 4.2.5 4.2.6 4.2.7	Find regions of interest Set 2nd order polynomial background correction Perform sphere analysis Plot the results Discussion	17 17 20
		4 2 2	Find marines of interest	16

DryMass is a user-friendly quantitative phase imaging analysis software. This is the documentation of DryMass version 0.1.4.

Contents: 1

2 Contents:

CHAPTER 1

Introduction

1.1 What is DryMass?

DryMass is a software for quantitative phase imaging (QPI) analysis with functionalities such as

- extraction of meta data (e.g. wavelength, acquisition time) from experimental data files,
- quantitative phase image background correction,
- · determination of dry mass for biological cells, or
- extraction of refractive index and radius for spherical phase objects such as liquid droplets, microgel beads, or cells.

1.2 Quantitative phase imaging

Quantitative phase imaging (QPI) is a 2D imaging technique that quantifies the phase retardation of a wave traveling through a specimen. For instance, digital holographic microscopy (DHM) [KvB07] can be used to record the quantitative phase image of biological cells, yielding the optical density from which the *dry mass* or the refractive index (RI) can be computed. Another example is electron holography [LL02] which can be used to visualize p-n junctions due to the different electronic potentials in the doped semiconductors. DryMass was designed for the analysis of single cells (typical units for distance [µm] and wavelength [nm]), but the concepts used apply to both methods.

Theory Notes

2.1 Computation of cell dry mass

2.1.1 Definition

The concept of cell dry mass computation was first introduced by Barer [Bar52]. The dry mass m of a biological cell is defined by its non-aqueous fraction f(x, y, z) (concentration or density in g/L), i.e. the number of grams of protein and DNA within the cell volume (excluding salts).

$$m = \iiint f(x, y, z) \, dx dy dz$$

The assumption of dry mass computation in QPI is that f(x, y, z) is proportional to the RI of the cell n(x, y, z) with a proportionality constant called the refraction increment α (units [mL/g])

$$n(x, y, z) = n_{intra} + \alpha f(x, y, z)$$

with the RI of the intracellular fluid n_{intra} , a dilute salt solution. These two equations can be combined to

$$m = \frac{1}{\alpha} \cdot \iiint (n(x, y, z) - n_{\text{intra}}) \, dx dy dz. \tag{2.1}$$

In QPI, the RI is measured indirectly as a projected quantitative phase retardation image $\phi(x,y)$.

$$\phi(x,y) = \frac{2\pi}{\lambda} \int (n(x,y,z) - n_{\text{med}}) dz$$

with the vacuum wavelength λ of the imaging light and the refractive index of the cell-embedding medium n_{med} . Integrating the above equation over the detector area (x, y) yields

$$\iint \phi(x,y) \, dx dy = \frac{2\pi}{\lambda} \iiint (n(x,y,z) - n_{\text{med}}) \, dx dy dz$$
 (2.2)

If the embedding medium has the same refractive index as the intracellular solute ($n_{\text{med}} = n_{\text{intra}}$), then equations (2.1) and (2.2) can be combined to

$$m_{\text{med=intra}} = \frac{\lambda}{2\pi\alpha} \cdot \iint \phi(x,y) \, dx dy.$$

For a discrete image, this formula simplifies to

$$m_{\text{med=intra}} = \frac{\lambda}{2\pi\alpha} \cdot \Delta A \cdot \sum_{i,j} \phi(x_i, y_j)$$
 (2.3)

with the pixel area ΔA and a pixel-wise summation of the phase data.

2.1.2 Relative and absolute dry mass

If however the medium surrounding the cell has a different refractive index ($n_{\rm med} \neq n_{\rm intra}$), then the phase ϕ is measured relative to the RI of the medium $n_{\rm med}$ which causes an underestimation of the dry mass if $n_{\rm med} > n_{\rm intra}$. For instance, a cell could be immersed in a protein solution or embedded in a hydrogel with a refractive index of $n_{\rm med} = n_{\rm intra} + 0.002$. For a spherical cell with a radius of 10µm, the resulting dry mass is underestimated by 46pg. Therefore, it is called "relative dry mass" $m_{\rm rel}$.

$$m_{\rm rel} = \frac{\lambda}{2\pi\alpha} \cdot \iint \phi(x,y) \, dx dy,$$

If the imaged phase object is spherical with the radius R, then the "absolute dry mass" $m_{\rm abs}$ can be computed by splitting equation (2.1) into relative mass and suppressed spherical mass.

$$m_{
m abs} = rac{1}{lpha} \cdot \iiint (n(x, y, z) - n_{
m med} + n_{
m med} - n_{
m intra}) \, dx dy dz$$

= $m_{
m rel} + rac{4\pi}{3\alpha} R^3 (n_{
m med} - n_{
m intra})$

For a visualization of the deviation of the relative dry mass from the actual dry mass for spherical objects, please have a look at the *relative vs. absolute dry mass example*.

2.1.3 Notes and gotchas

- The default refraction increment in DryMass is α = 0.18mL/g, as suggested for cells based on the refraction increment of cellular constituents by references [BJ54] and [Bar53]. The refraction increment can be manually set using the *configuration* key "refraction increment" in the "sphere" section.
- Variations in the refraction increment may occur and thus the above considerations are not always valid. The refraction increment is little dependent on pH and temperature, but may be strongly dependent on wavelength (e.g. serum albumin $\alpha_{SA@366nm} = 0.198mL/g$ and $\alpha_{SA@656nm} = 0.179mL/g$) [BJ54].
- The refractive index of the intracellular fluid in DryMass is assumed to be $n_{\text{intra}} = 1.335$, an educated guess based on the refractive index of phosphate buffered saline (PBS), whose osmolarity and ion concentrations match those of the human body.
- **Dry mass and actual mass** of a cell differ by the weight of the intracellular fluid. This weight difference is defined by the volume of the cell minus the volume of the protein and DNA content. While it seems to be difficult to define a partial specific volume (PSV) for DNA, there appears to be a consensus regarding the PSV of proteins, yielding approximately 0.73mL/g (see e.g. reference [Bar57] as well as [HGC94] and question 843 of the O-manual referring to it). For example, the protein and DNA of a cell with a radius of 10µm and a dry mass of 350pg (cell volume 4.19pL, average refractive index 1.35) occupy approximately 0.73mL/g · 350pg = 0.256pL (assuming the PSV of protein and DNA are similar). Therefore, the actual volume of the intracellular fluid is 3.93pL (94% of the cell volume) which is equivalent to a mass of 3.93ng resulting in a total (actual) cell mass of 4.28ng. Thus, the dry mass of this cell makes up approximately 10% of its actual mass which leads to a total mass that is about 2% heavier than the equivalent volume of pure water (4.19ng).

CHAPTER 3

Getting started

3.1 Installing DryMass

DryMass is written in pure Python and supports Python version 3.5 and higher. DryMass depends on several other scientific Python packages, including:

- numpy,
- scikit-image (segmentation).
- qpimage (phase data manipulation),
- qpformat (file formats),
- qpsphere (refractive index analysis, segmentation),

To install DryMass, use one of the following methods (package dependencies will be installed automatically):

- from PyPI: pip install drymass
- from sources: pip install . or python setup.py install

3.1.1 Upgrade

If you have installed on older version of DryMass and wish to upgrade to the latest version, use

```
pip uninstall drymass followed by pip install drymass.

If you wish to install a specific version of DryMass (e.g. 0.1.0), use
```

```
pip install 'drymass==0.1.0'.
```

3.1.2 Known issues

• If you try to install from PyPI and get an error message similar to

"Could not find a version that satisfies the requirement drymass (from versions:) No matching distribution found for drymass",

please make sure that you are using Python version 3.5 or higher with python —version. If that is already the case, please run pip —vvv install drymass and create an issue with the error messages (e.g. as a screenshot) that you get.

• If you are using Windows and the installation fails because scikit-image cannot be installed, e.g.

```
"Rolling back uninstall of scikit-image

Command python.exe [...] –compile failed with error code 1 in [...]/scikit-image",
```

and you are using the Anaconda Python distribution, please install *scikit-image* via conda install scikit-image. If you are not using Anaconda, you can install one of the wheels provided by Christoph Gohlke (download e.g. "scikit_image0.13.1cp35cp35mwin_amd64.whl" if you have installed the 64bit version of Python 3.5, navigate to the download directory and run pip install scikit_image0.13.1cp35cp35mwin_amd64.whl).

3.2 Command line interface

DryMass comes with a command line interface (CLI). To use the CLI, a command shell is required, such as the command prompt Cmd.exe on Windows, or Terminal.app on MacOS. Please note that if DryMass is installed in a virtual environment, then the DryMass CLI is only available if this environment is activated.

3.2.1 dm_convert

This command converts experimental data on disk to the TIF file format for use with Fiji/ImageJ and to the hdf5-based qpimage data file format. The experimental data files are loaded with the qpformat library, which supports several quantitative phase imaging file formats. If a specific format is not supported, please create an issue at the qpimage issue page. A typical use case of dm_convert on Windows is

```
dm_convert "d:\\data\path\to\experiment"
```

which is equivalent to

```
d:
cd "data\path\to"
dm_convert experiment
```

If this command is run initially for an experimental data set, the user is asked to enter or confirm imaging wavelength and detector pixel size. Then, a new directory d:\\data\path\to\experiment_dm is created with the following files:

drymass.cfg the user-editable drymass configuration file which is used in subsequent analysis steps

sensor_data.h5 the experimental data (including meta data) in the hdf5-based qpimage data file format sensor data.tif the experimental phase and amplitude series data as a tif file, importable in Fiji/ImageJ

Note that it is possible to edit the *drymass.cfg* file and to re-run the dm_convert command (or any other of the commands below) with these updated parameters.

3.2.2 dm extract roi

This command automatically finds and extracts regions of interest (ROIs) and performs an automated background correction for single-cell analysis. The usage is the same as that of dm_convert:

```
dm_extract_roi "d:\\data\path\to\experiment"
```

The command dm_extract_roi automatically runs dm_convert if it has not been run before. If ROI detection fails, the search parameters have to manually be updated in the *drymass configuration file*. The most important parameter is the diameter of the specimen in microns ("size um" in the specimen section); all other parameters are defined in the roi section. Note that the default parameters for the roi section are not written to the configuration file until dm_extract_roi is run. The following files are created by dm_extract_roi:

roi_data.h5 the extracted, background-corrected ROI data (including meta data) in the hdf5-based qpimage data file format

roi_data.tif the extracted, background-corrected ROI data as a tif file, importable in Fiji/ImageJ

roi slices.txt the locations of the ROIs found as a txt file

sensor_roi_images.tif rendered sensor phase images with labeled ROIs; only created if "roi images" is set to "True" in the output section of the drymass configuration file

3.2.3 dm analyze sphere

This command is used for the analysis of spherical phase objects such as liquid droplets, beads, or suspended cells. The basic principle is thoroughly described in reference [SSM+16]. In short, this approach assumes that the objects found with dm_extract_roi are homogenous and spherical which allows to extract parameters such as radius and refractive index from a single phase image (as opposed to tomographic approaches that require an acquisition of multiple phase images from different directions). The parameters for the sphere analysis, such as analysis method and scattering model are defined in the *sphere* section of the *drymass configuration file*. For an overview of the available models, please refer to the qpsphere docs. The following files are created by dm_analyze_sphere (METHOD is the analysis method and MODEL is the scattering model defined in *drymass.cfg*):

sphere_METHOD_MODEL_data.h5 the quantitative sphere simulation data using *MODEL* with the parameters obtained with the combination of *METHOD* and *MODEL* for each of the ROIs obtained with dm_extract_roi in the hdf5-based qpimage data file format

sphere_METHOD_MODEL_images.tif rendered phase and intensity images of the input ROIs and the corresponding simulation, a difference, and a line plot through the phase image for visual inspection as a tif file, importable in Fiji/ImageJ

sphere_METHOD_MODEL_statistics.txt the analysis results, including refractive index, radius, and relative and absolute dry mass as a txt file.

3.3 Configuration file

The DryMass configuration file *drymass.cfg* is located in the root of the output folder ("_*dm*" appended to the data path). The configuration file is divided into sections.

3.3.1 [bg] Background correction

DryMass uses the Python library qpimage for background correction. For detailed information on the algorithms (and the corresponding keyword arguments) used, please see <code>qpimage.bg_estimate</code>.

- amplitude data = none (int_or_str) Amplitude bg correction file or index Image indexing starts with 1.
- amplitude offset = mean (lcstr) Amplitude bg correction offset method

 Valid values are defined in qpimage.bg_estimate.VALID_FIT_OFFSETS.
- amplitude profile = tilt (*lcstr*) Amplitude bg correction profile method

 Valid values are defined in <code>qpimage.bg_estimate.VALID_FIT_PROFILES</code>.
- amplitude binary threshold = nan (float_or_str) Binary image threshold value or method If not nan, defines either a threshold for background segmentation or a method in skimage.filters.
- amplitude border perc = 10 (float) Amplitude bg border region to analyze [%]
- amplitude border px = 5 (int) Amplitude bg border region to analyze [px]
- **enabled** = True (fbool) Enable bg correction globally Set to *False* when manually editing *roi_slices.txt*.
- phase data = none (int_or_str) Phase bg correction file or index Image indexing starts with 1.
- **phase offset** = mean (*lcstr*) Phase bg correction offset method Valid values are defined in qpimage.bg_estimate.VALID_FIT_OFFSETS.
- phase profile = tilt (lcstr) Phase bg correction profile method

 Valid values are defined in qpimage.bg_estimate.VALID_FIT_PROFILES.
- **phase binary threshold** = nan (float_or_str) Binary image threshold value or method

 If not nan, defines either a threshold for background segmentation or a method in skimage.filters.
- **phase border perc** = 10 (float) Phase bg border region to analyze [%]
- **phase border px** = 5 (int) Phase bg border region to analyze [px]

3.3.2 [holo] Hologram analysis

These parameters tune the hologram analysis step (if applicable). The parameters shown are passed to <code>qpimage.holo.get_field()</code>.

- **filter name** = disk (str) Filter name for sideband isolation
- **filter size** = 1/3 (float) Filter size (fraction of the sideband frequency
- sideband = 1 (floattuple_or_one) Sideband ± 1 or frequency coordinates

3.3.3 [meta] Image meta data

This section contains meta data of the experiment.

- medium index = nan (float) Refractive index of the surrounding medium
- pixel size um = nan (float) Detector pixel size [µm]
- wavelength nm = nan (float) Imaging wavelength [nm]

3.3.4 [output] Supplementary data output

This section defines what additional data are written to disk.

- roi images = True (fbool) Rendered phase images with ROI location
- sphere images = True (fbool) Phase/Intensity images for sphere analysis
- sensor tif data = True (fbool) Phase/Amplitude sensor tif data

3.3.5 [roi] Extraction of regions of interest

The extraction of ROIs is done in drymass.extractroi.extract_roi().

- **dist border** = 10 (int) Minimum distance of objects to image border [px]
- eccentricity max = 0.7 (float) Allowed maximal eccentricity of the specimen
- **enabled** = True (fbool) Perform automated search for ROIs If set to *False*, the file "roi_slices.txt" must contain ROIs.
- exclude overlap = 30.0 (float) Allowed distance between two objects [px]
- **force** = () (tupletupleint) Force ROI coordinates (x1,x2,y1,y2) [px]
- pad border = 40 (int) Padding of object regions [px]
- size variation = 0.5 (float) Allowed variation relative to specimen size

3.3.6 [specimen] Specimen parameters

Prior information about the analyzed object(s).

• size um = 10 (float) – Approximate diameter of the specimen [μm] This is used as the initial value for the sphere analysis.

3.3.7 [sphere] Sphere-based image analysis

Retrieval of refractive index and radius is done with the Python module qpsphere. The parameters either apply to qpsphere.edgefit.contour_canny() or to qpsphere.imagefit.alg.match_phase(), depending on which analysis approach is used.

- edge coarse = 0.4 (float) Coarse edge detection filter size
- edge fine = 0.1 (float) Fine edge detection filter size
- edge clip radius min = 0.9 (float) Interior edge point filtering radius
- edge clip radius max = 1.1 (float) Exterior edge point filtering radius
- edge iter = 20 (int) Maximum number iterations for coarse edge detection
- image fit range position = 0.05 (float) Fit interpolation range for radius
- image fit range radius = 0.05 (float) Fit interpolation range for radius
- image fit range refractive index = $0.10 \, (float)$ Fit interpolation range for refractive index
- image fix phase offset = False (fbool) Fix the simulation background phase to zero
- image iter = 100 (int) Maximum number of iterations for image fitting

- image stop delta position = 1 (float) Stopping criterion for position
- image stop delta radius = 0.0010 (float) Stopping criterion for radius
- image stop delta refractive index = 0.0005 (float) Stopping criterion for refractive index
- image verbosity = 1 (int) Verbosity level of image fitting algorithm
- **method** = edge (1cstr) Method for determining sphere parameters Valid values are *edge* (edge-detection approach) or *image* (2D phase image fitting).
- model = projection (lcstr) Physical sphere model

 Valid values are defined in qpsphere.models.available. If method=edge, then model must be set to projection. If method=image, setting model to rytov-sc has the best trade-off between accuracy and speed.
- refraction increment = $0.18 \, (float) Refraction increment [mL/g]$
- radial inclusion factor = 1.2 (float) Radial inclusion factor for dry mass computation

CHAPTER 4

Tutorials

4.1 T1: Bead analysis (CLI)

4.1.1 Introduction

Microgel beads are transparent, homogeneous, and spherical objects that are ideal test objects for quantitative phase imaging. The DryMass command $dm_analyze_sphere$ can estimate the average refractive index of such homogeneous objects. This is a short tutorial that will reproduce the data presented in supplementary figure 2a of reference [SCG+17].

4.1.2 Prerequisites

For this tutorial, you need:

- Python 3.5 or above and DryMass version 0.1.1 or above (see *Installing DryMass*)
- Fiji or Windows Photo Viewer (for data visualization)
- Experimental data set: QLSR_PAA_beads.zip

4.1.3 Execute dm_analyze_sphere

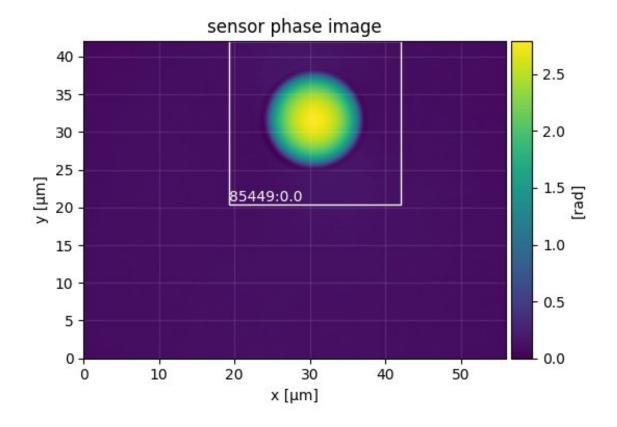
DryMass comes with a *Command line interface* (CLI) which is made available after the installation. We will use the DryMass command *dm_analyze_sphere* to extract the refractive index values of a population of microgel beads. Using the command shell of your operating system, navigate to the location of QLSR_PAA_beads.zip and execute the command dm_analyze_sphere with QLSR_PAA_beads.zip as an argument. You will be prompted for the refractive index of the surrounding medium (1.335), the detector pixel size in microns (0.14), and the wavelength in nanometers (647). Simply type in these values (press the *Enter* key to let DryMass acknowledge each input). On Windows, this will look similar to this (2.5x time lapse):

DryMass has created a directory called QLSR_PAA_beads.zip_dm (the input argument with an $_dm$ appended) which contains the following files

- drymass.cfg: DryMass Configuration file
- roi_data.h5: regions of interest (ROIs)
- roi_data.tif: phase and amplitude data of the ROIs as a tif file
- roi_slices.txt: positions of the ROIs
- sensor_data.h5: full sensor QPI data
- sensor_data.tif: full sensor phase and amplitude data as a tif file
- sensor_roi_images.tif: plotted full sensor phase images with ROIs
- sphere_edge_projection_data.h5: simulated (projection) phase and amplitude data
- sphere_edge_projection_images.tif: visualization of the sphere analysis of the ROIs as a tif file
- sphere_edge_projection_statistics.txt: sphere analysis results as a text file

4.1.4 Examine the results

Let's have a look at *sensor_roi_images.tif* (using Fiji or Windows Photo Viewer). This is the first image stored in the tif file:

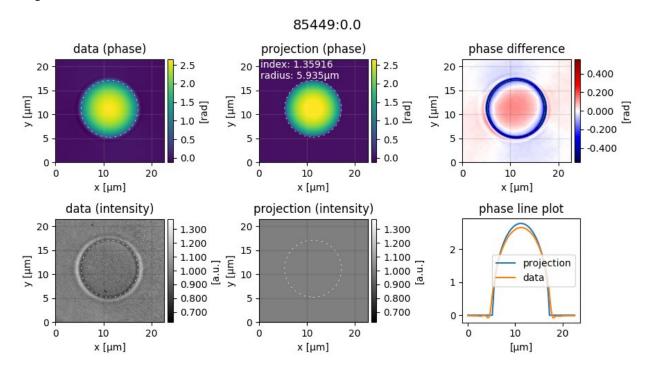


It shows the full sensor phase image of the first bead. The white rectangle indicates the ROI that was found by DryMass, labeled with the identifier 85449:0.0. The file sensor_roi_images.tif allows you to check that DryMass has

14 Chapter 4. Tutorials

correctly found the objects that you are interested in. If the beads were not detected correctly, we would probably have to adjust the size parameter in the *Configuration file* (see also *dm_extract_roi*).

It appears that DryMass has correctly found all beads with the default settings. Next, open the file *sphere_edge_projection_images.tif*. The identifier of the first ROI is shown at the top, the first column contains phase and intensity of the experimental data, the second column contains the modeled data (with refractive index and radius used for the simulation), and the third column shows the phase-difference as well as line plots through the phase images.



Note that the modeled intensity image is all-one, because the projection model only models the optical thickness and thus only affects the phase data. Also, note that the phase-difference image between data and model only has small deviations in the background phase. If there were large ramp-like structures or offsets, we would have to modify the background correction.

4.1.5 Post-processing

A closer examination of the phase-difference images shows that there seem to be either deformed beads or imaging artifacts in the images with the identifiers (prepend 85449:): 3.0, 6.0, 23.0, 25.0, 26.0, 34.0, 35.0, 38.0, 39.0, 50.0, 51.0, 54.0, 57.0, 59.0, 63.0, 66.0, and 70.0. Due to their asymmetry we ignore these images in our analysis by removing the respective rows from *sphere_edge_projection_statistics.txt* (Note that this file will be overridden when dm_analyze_sphere is executed again). We can then load the statistics file into a statistical analysis application and compute the average and the standard deviation of the refractive index. In Python, this can be done with

```
import numpy as np
ri = np.loadtxt("sphere_edge_projection_statistics.txt", usecols=(1,))
print("average: ", np.average(ri))
print("standard deviation: ", np.std(ri))
```

which will yield a refractive index of 1.357 ± 0.004 which agrees well with the value given in reference [SCG+17] (1.356 \pm 0.004); The small difference can be explained by a slightly modified analysis pipeline and originally more strict selection criteria.

4.2 T2: HL60 cell analysis (CLI)

4.2.1 Introduction

HL60 cells in suspension are inhomogeneous, almost-spherical objects. To estimate an average refractive index (RI) of an HL60 cell population, the DryMass command $dm_analyze_sphere$ can be used. This tutorial reproduces data presented in figure 5d of reference [MSG+18].

4.2.2 Prerequisites

For this tutorial, you need:

- Python 3.5 or above and DryMass version 0.1.4 or above (see *Installing DryMass*)
- Fiji or Windows Photo Viewer (for data visualization)
- Experimental data set: DHM_HL60_cells.zip

4.2.3 Find regions of interest

Note: You can skip this part by copying *roi_slices.txt* from *DHM_HL60_cells.zip* into the *DHM_HL60_cells.zip_dm* folder, running *dm_convert* and manually adding the [roi] section to *drymass.cfg* with enabled = False.

We proceed slightly different than in *tutorial 1*. Before we use the command *dm_analyze_sphere* to extract the RI values of the HL60 cells, we have to modify our configuration. We start by executing dm_extract_roi DHM_HL60_cells.zip which prompts us for the *pixel size* (0.107µm), and the *wavelength* (633nm), which can be found in the *readme.txt* file inside the zip archive. This command imports the raw data and searches for cells in the phase data. Opening the file *sensor_roi_images.tif*, we realize that the search parameters are not set optimally. This is image 27:

We want to exclude small ROIs and ROIs with a large overlap. Furthermore, we want to include all large cells (see e.g. image 39). Thus, we change the following configuration keys in *drymass.cfg*:

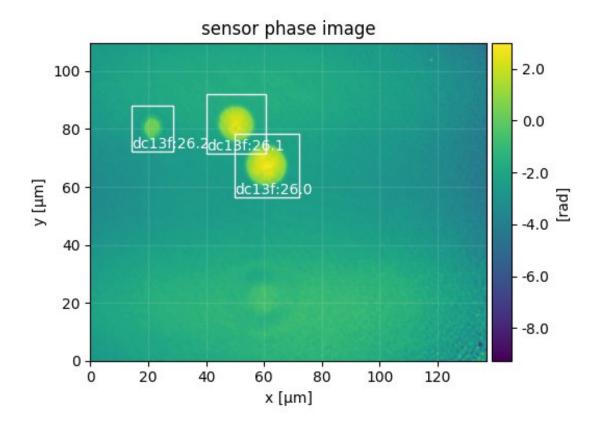
```
[specimen]
size um = 13  # approximate cell diameter we are looking for [µm]

[roi]
pad border = 80  # increase border size around cells
size variation = 0.2  # do not allow large variations of specimen size
exclude overlap = 100  # exclude ROIs with an overlap > 100px
```

With the new configuration, we run dm_extract_roi DHM_HL60_cells.zip again. Now all cells are detected. However, we want to exclude a few due to artifacts or shape issues. To achieve that, we disable the automatic search for ROIs in *drymass.cfg*

```
[roi]
enabled = False  # use existing roi_slices.txt
```

and remove the undesired ROIs from *roi_slices.txt*, which are 7.3, 14.1, 17.1, 17.2 and 34.1. There should now be a total of 87 ROIs.



4.2.4 Set 2nd order polynomial background correction

The default setting for background correction in DryMass is *tilt* which means that all phase data are corrected by fitting a 2D tilt image to the image borders. For the present dataset, a second order polynomial fit is a better approach, because the background phase does not follow a linear trend. Thus, we choose the *poly2o* profile and additionally set the fitting border width to 30 pixels. These are the updated lines in the [bg] section of *drymass.cfg*:

```
[bg]
phase border px = 30
phase profile = poly2o
```

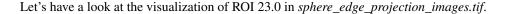
4.2.5 Perform sphere analysis

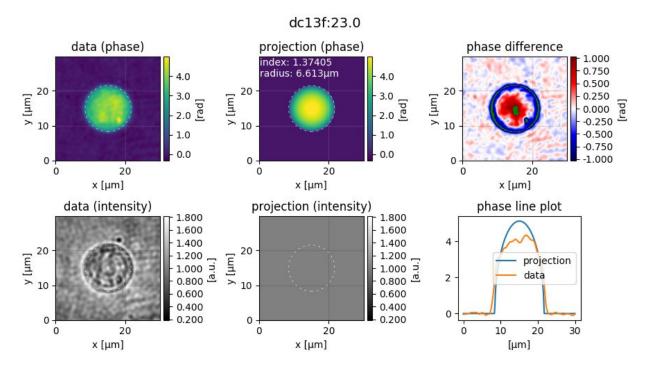
We now run $dm_analyze_sphere DHM_HL60_cells.zip$ and are asked to enter the RI of the medium (1.335). By default, the RI of the cells is computed according to [SSM+15]. The following files are created during this step:

- sphere_edge_projection_data.h5: QPI data
- sphere_edge_projection_images.tif: data visualization
- sphere_edge_projection_statistics.txt: results

Note: Warnings about *slice and QPImage identifiers* can safely be ignored. Setting the RI of the medium changes the internal ROI identifiers. Since we have fixed the ROIs, the identifiers do not match anymore, but the enumeration

is still correct.





The first column shows the experimental data, the second column shows the modeled data (with the cell perimeter indicated by a dashed circle), and the third column contains a residual image (pay attention to the colorbar, green means that the values are outside of the displayed range) and a line plot through the center of the cell. What is most striking about these data is that the RI is overestimated while the radius is underestimated by the edge-projection model. The explanation is that the radius of the cell is determined with an edge-detection algorithm applied to the phase image. Since the edge-detection algorithm determines the edge on the slope of the phase profile and not where the phase profile starts to deviate from the background, it underestimates the radius. The solution to this problem is to take into account the full phase image when determining RI and radius [KKL+07] [MSG+18].

This can be achieved by modifying the [sphere] section of *drymass.cfg*. In figure 5d of reference [MSG+18], multiple RI-retrieval methods are applied and compared for the same cell population. To repdroduce these data, we run dm_analyze_sphere DHM_HL60_cells.zip three more times with a modified [sphere] section (note that this may take a while).

• Run 1: phase image fit with a projection model

```
[sphere]
method = image
model = projection
```

which produces the files

- sphere_image_projection_data.h5
- sphere_image_projection_images.tif
- sphere_image_projection_statistics.txt
- Run 2: phase image fit with the Rytov approximation

18 Chapter 4. Tutorials

```
[sphere]
method = image
model = rytov
```

which produces the files

- sphere_image_rytov_data.h5
- sphere_image_rytov_images.tif
- sphere_image_rytov_statistics.txt
- Run 3: phase image fit with the systematically corrected Rytov approximation

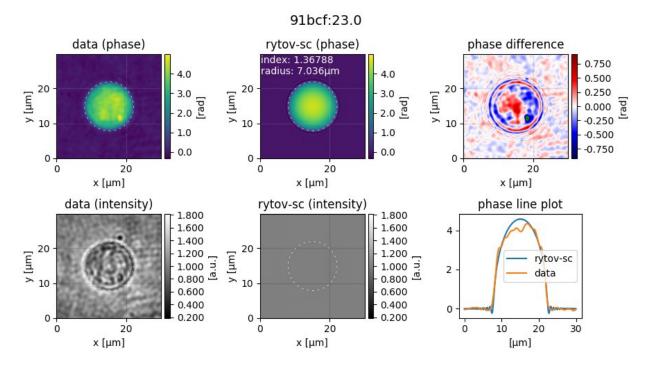
```
[sphere]
method = image
model = rytov-sc
```

which produces the files

- sphere_image_rytov-sc_data.h5
- sphere_image_rytov-sc_images.tif
- sphere_image_rytov-sc_statistics.txt

Note: We omitted the case model = mie-avg which is part of figure 5d in reference [MSG+18], because of the long fitting time.

To verify that the full-phase-image-based approaches indeed yield lower residuals than the edge-detection approach, let's have a look at ROI 23.0 of *sphere_image_rytov-sc_images.tif*.



The phase difference and the phase line plots look much better now. Observed deviations mostly originate from the inhomogeneity of the cell.

4.2.6 Plot the results

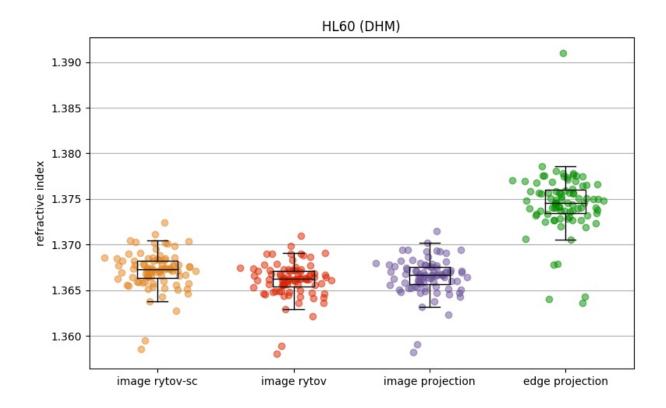
To plot the results, we use the following Python script.

```
import matplotlib.pylab as plt
   import numpy as np
2
   def dot_boxplot(ax, data, colors, labels, **kwargs):
        """Combined box and scatter plot"""
6
       box_list = []
8
       for ii in range(len(data)):
            # set same random state for every scatter plot
10
            rs = np.random.RandomState(42).get_state()
11
           np.random.set_state(rs)
12
           y = data[ii]
           x = np.random.normal(ii+1, 0.15, len(y))
14
            plt.plot(x, y, 'o', alpha=0.5, color=colors[ii])
15
           box list.append(v)
16
17
       ax.boxplot(box_list,
18
                   sym="",
                   medianprops={"color": "black", "linestyle": "solid"},
20
21
                   widths=0.3,
                   labels=labels,
22
                   **kwarqs)
23
       plt.grid(axis="y")
24
25
   if __name__ == "__main__":
27
       ri_data = [
28
           np.loadtxt("sphere_image_rytov-sc_statistics.txt", usecols=(1,)),
29
            np.loadtxt("sphere_image_rytov_statistics.txt", usecols=(1,)),
30
            np.loadtxt("sphere_image_projection_statistics.txt", usecols=(1,)),
31
            np.loadtxt("sphere_edge_projection_statistics.txt", usecols=(1,)),
32
       colors = ["#E48620", "#DE2400", "#6e559d", "#048E00"]
34
       labels = ["image rytov-sc", "image rytov",
35
                  "image projection", "edge projection"]
36
37
       plt.figure(figsize=(8, 5))
38
       ax = plt.subplot(111, title="HL60 (DHM)")
       ax.set_ylabel("refractive index")
40
       dot_boxplot(ax=ax, data=ri_data, colors=colors, labels=labels)
41
       plt.tight_layout()
42
       plt.show()
```

4.2.7 Discussion

The above figure correctly reproduces the message conveyed with figure 5d of reference [MSG+18]. There are only minor differences that can be explained by a slightly different analysis pipeline:

- In [MSG+18], 84 cells were analyzed as opposed to the 87 cells shown here. This can be attributed to the improved object detection pipeline introduced in DryMass 0.1.4.
- In [MSG+18], the phase data were background-corrected with background data (not included in



DHM_HL60_cells.zip) and a linear model (phase profile = tilt) as opposed to a second order polynomial model (which was introduced in DryMass 0.1.3). However, this does not seem to have any significant effect on the results, which indicates that the analysis methods are robust.

- There is a prominent outlier in the *edge projection* results set. The reason for this outlier is a falsely detected contour (see ROI 1.0). This ROI was not included in the analysis of [MSG+18].
- Other minor differences might originate from the fact that the hologram data is processed differently ([holo] section of *drymass.cfg*). In [MSG+18], a gaussian filter is used whereas DryMass defaults to a disk filter. For more information on this topic, see e.g. Hologram filter choice.

22 Chapter 4. Tutorials

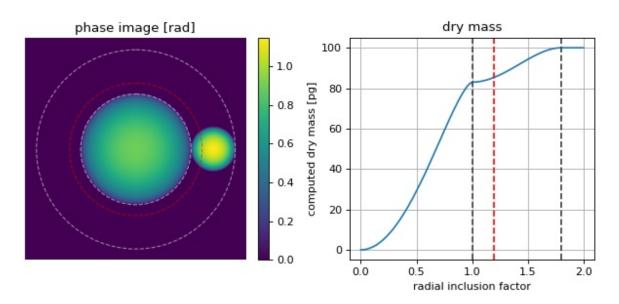
CHAPTER 5

Code examples

5.1 Dry mass computation with radial inclusion factor

This examples illustrates the usage of the "radial inclusion factor" which is defined in the configuration section "sphere" and used in drymass.anasphere.relative_dry_mass() with the keyword argument rad_fact.

The phase image is computed from two spheres whose dry masses add up to 100pg with the larger sphere having a dry mass of 83pg. The larger sphere is located at the center of the image which is also used as the origin for dry mass computation. The radius of the larger sphere is known ($10\mu m$). Thus, the corresponding radius (inner circle) corresponds to a radial inclusion factor of 1. In DryMass, the default radial inclusion factor is set to 1.2 (red). In some cases, this inclusion factor must be increased or decreased depending on whether additional information (the smaller sphere) should be included in the dry mass computation or not.



mass_radial_inclusion_factor.py

```
from drymass.anasphere import relative_dry_mass
   import matplotlib
   import matplotlib.pylab as plt
   import numpy as np
   import qpimage
   import qpsphere
   # refraction increment
   alpha = .18 \# [mL/g]
   # general simulation parameters
11
   medium\_index = 1.333
12
   model = "projection"
13
   wavelength = 500e-9 # [m]
14
   pixel_size = 1e-7 # [m]
15
   grid\_size = (400, 400) \# [px]
17
   # sphere parameters
18
   dry_masses = [83, 17] \# [pg]
19
   radii = [10, 4] \# [\mu m]
20
   centers = [(200, 200), (200, 340)] # [px]
21
22
23
   phase_data = np.zeros(grid_size, dtype=float)
   for m, r, c in zip(dry_masses, radii, centers):
24
       # compute refractive index from dry mass
25
       r_m = r * 1e-6
26
       alpha_m3g = alpha * 1e-6
27
       m_g = m * 1e-12
28
       n = 1.333 + 3 * alpha_m3g * m_g / (4 * np.pi * (r_m**3))
29
       # generate example dataset
       qpi = qpsphere.simulate(radius=r_m,
31
                                 sphere_index=n,
32
                                 medium_index=medium_index,
33
                                 wavelength=wavelength,
34
35
                                 pixel_size=pixel_size,
                                 model=model,
                                 grid_size=grid_size,
                                 center=c)
38
       phase_data += qpi.pha
39
40
   qpi_sum = qpimage.QPImage(data=phase_data,
41
                               which_data="phase",
42
                               meta_data={"wavelength": wavelength,
43
                                           "pixel size": pixel_size,
                                           "medium index": medium_index})
45
46
   # compute dry mass in dependence of radius
47
48
   mass_evolution = []
   mass_radii = []
   for rad_fact in np.linspace(0, 2.0, 100):
       dm = relative_dry_mass(qpi=qpi_sum,
51
                                radius=radii[0] * 1e-6,
52
                                center=centers[0],
53
54
                                alpha=alpha,
55
                                rad_fact=rad_fact)
       mass_evolution.append(dm * 1e12)
       mass_radii.append(rad_fact)
```

```
58
   # plot results
59
   fiq = plt.figure(figsize=(8, 3.8))
60
   matplotlib.rcParams["image.interpolation"] = "bicubic"
61
   # phase image
   ax1 = plt.subplot(121, title="phase image [rad]")
   ax1.axis("off")
   map1 = ax1.imshow(qpi_sum.pha)
65
   plt.colorbar(map1, ax=ax1, fraction=.048, pad=0.05)
66
   # dry mass vs. inclusion factor
67
   ax2 = plt.subplot(122, title="dry mass")
   ax2.plot(mass_radii, mass_evolution)
   ax2.set_ylabel("computed dry mass [pg]")
70
   ax2.set_xlabel("radial inclusion factor")
71
   ax2.grid()
72
   # radius indicators
73
   for r in [100, 180]:
74
       cx = centers[0][0] + .5
75
       cy = centers[0][1] + .5
       circle = plt.Circle((cx, cy), r,
77
                            color='w', fill=False, ls="dashed", lw=1, alpha=.5)
78
       ax1.add_artist(circle)
79
       ax2.axvline(r / 100, color="#404040", ls="dashed")
80
   # add default
81
   circle = plt.Circle((cx, cy), 120,
82
                        color='r', fill=False, ls="dashed", lw=1, alpha=.5)
83
   ax1.add_artist(circle)
84
   ax2.axvline(1.2, color="r", ls="dashed")
85
86
   plt.tight_layout()
87
   plt.show()
```

5.2 Comparison of relative and absolute dry mass

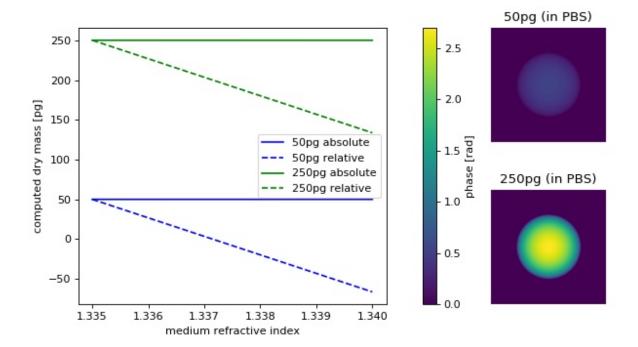
Relative dry mass is the dry mass computed relative to the surrounding medium. If the refractive index of the surrounding medium does not match that of the intracellular fluid (approximately 1.335), then the relative dry mass underestimates the actual dry mass. For a spherical cell, the absolute (corrected) dry mass can be computed as described in the theory section on *dry mass computation*.

This examples compares the relative dry mass (drymass.ansphere.relative_dry_mass()) to the absolute dry mass corrected for a spherical phase object (drymass.ansphere.absolute_dry_mass_sphere()). From simulated phase images (projection approach, wavelength 550nm) of two cell-like spheres with a radius of 10µm and dry masses of 50pg (n1.337) and 250pg (n1.346), the absolute and relative dry masses are computed with varying refractive index of the medium.

At the refractive index of phosphate buffered saline (PBS), absolute and relative dry mass are equivalent. As the refractive index of the medium increases, the relative drymass decreases linearly (independent of dry mass), underestimating the actual dry mass.

```
mass_relative_vs_absolute.py
```

```
from drymass.anasphere import absolute_dry_mass_sphere, relative_dry_mass
import matplotlib
import matplotlib.pylab as plt
import numpy as np
import qpsphere
```



```
6
   # refraction increment
   alpha = .18 \# [mL/g]
   # general simulation parameters
10
   model = "projection"
11
   wavelength = 500e-9 # [m]
12
   pixel_size = 1.8e-7  # [m]
13
   grid\_size = (200, 200) \# [px]
   # sphere parameters
   radius = 10 \# [\mu m]
17
   center = (100, 100)
                         # [px]
18
19
   dry_masses = [50, 250] # [pg]
20
   medium_indices = np.linspace(1.335, 1.34, 5)
21
22
23
   qpi_pbs = {}
24
   m_abs = {}
   m_rel = {}
25
   phase_data = np.zeros(grid_size, dtype=float)
26
   for m in dry_masses:
27
       # initiate results list
28
       m_abs[m] = []
       m_rel[m] = []
30
       # compute refractive index from dry mass
31
       r_m = radius * 1e-6
32
       alpha_m3g = alpha * 1e-6
33
       m_g = m * 1e-12
34
       n = 1.335 + 3 * alpha_m3g * m_g / (4 * np.pi * (r_m**3))
35
36
       for medium_index in medium_indices:
37
            # generate example dataset
```

```
gpi = gpsphere.simulate(radius=r_m,
38
                                      sphere_index=n,
39
                                      medium_index=medium_index,
40
                                      wavelength=wavelength,
41
                                      pixel_size=pixel_size,
42
                                      model=model,
                                      grid_size=grid_size,
44
                                      center=center)
45
            # absolute dry mass
46
           ma = absolute_dry_mass_sphere(qpi=qpi,
47
                                            radius=r_m,
48
                                            center=center,
                                            alpha=alpha,
50
                                            rad_fact=1.2)
51
           m_abs[m].append(ma * 1e12)
52
            # relative dry mass
53
           mr = relative_dry_mass(qpi=qpi,
54
                                     radius=r_m,
55
                                     center=center,
                                     alpha=alpha,
57
                                     rad_fact=1.2)
58
           m_rel[m].append(mr * 1e12)
59
            if medium_index == 1.335:
60
                qpi_pbs[m] = qpi
61
   # plot results
63
   fig = plt.figure(figsize=(8, 4.5))
64
   matplotlib.rcParams["image.interpolation"] = "bicubic"
65
   # phase images
66
   kw = {"vmax": qpi_pbs[dry_masses[1]].pha.max(),
67
          "vmin": qpi_pbs[dry_masses[1]].pha.min()}
   ax1 = plt.subplot2grid((2, 3), (0, 2))
   ax1.set_title("{}pg (in PBS)".format(dry_masses[0]))
71
   ax1.axis("off")
72
   map1 = ax1.imshow(qpi_pbs[dry_masses[0]].pha, **kw)
73
74
   ax2 = plt.subplot2grid((2, 3), (1, 2))
75
   ax2.set_title("{}pg (in PBS)".format(dry_masses[1]))
76
   ax2.axis("off")
77
   ax2.imshow(qpi_pbs[dry_masses[1]].pha, **kw)
78
79
   # overview plot
80
   ax3 = plt.subplot2grid((2, 3), (0, 0), colspan=2, rowspan=2)
81
   ax3.set_xlabel("medium refractive index")
82
   ax3.set_ylabel("computed dry mass [pg]")
83
   for m, c in zip(dry_masses, ["blue", "green"]):
84
       ax3.plot(medium_indices, m_abs[m], ls="solid", color=c,
85
                 label="{}pg absolute".format(m))
86
       ax3.plot(medium_indices, m_rel[m], ls="dashed", color=c,
87
                 label="{}pg relative".format(m))
88
   ax3.legend()
89
   plt.colorbar(map1, ax=ax3, fraction=.048, pad=0.1,
90
                 label="phase [rad]")
91
92
   plt.tight_layout()
93
   plt.subplots_adjust(wspace=.14)
   plt.show()
```

28

CHAPTER 6

Code reference

6.1 cfg_funcs

These methods are used to parse the values set in the Configuration file and convert them to the correct type.

```
drymass.cfg_funcs.fbool (value)
Boolean value from string or number

drymass.cfg_funcs.fintlist (alist)
List of integers from string or list of strings/integers

drymass.cfg_funcs.float_or_str (flt_or_str)
Float value from string or number

drymass.cfg_funcs.floattuple_or_one (fti)
Tuple of floats or ±1 from a string or a number

drymass.cfg_funcs.int_or_str(it_or_str)
Integer or string from a string or a number

drymass.cfg_funcs.lcstr(astr)
Convert a string to lower-case

drymass.cfg_funcs.tupletupleint (items)
A tuple containing x- and y- slice tuples from a string or tuple
```

CHAPTER 7

Changelog

List of changes in-between DryMass releases.

7.1 version 0.1.4

- feat: add local thresholding step before segmentation
- fix: check number of qpimages in sensor_data.h5 during dm_convert
- fix: "exclude overlap" only used for background image
- fix: not possible to analyze phasics data folder when raw data is present (qpformat 0.1.5)

7.2 version 0.1.3

- automatically fix inverted ranges when loading "roi_slices.txt"
- remove "holo" section from drymass.cfg if not relevant
- allow user-defined ROI selection via "[roi] enabled = False"
- added hologram analysis parameter tuning (qpimage 0.1.6)
- added 2D model fitting to sphere analysis (qpsphere 0.1.4)
- fixed cfg_funcs.int_or_str

7.3 version 0.1.2

- allow to disable sensor image tif export
- support input QPI data with different shapes

- fixed wrong assumption about definition of dry mass in cells (water vs. intracellular salt solution)
- allow to use separate file or series index for background correction with experimental data (#6)
- small visualization improvements

7.4 version 0.1.1

- add file name to image identifier and update plotting (#4)
- renamed "object" to "identifier" in statistics output
- binary-based background correction (manual or automated threshold)
- allow to disable background correction with "[bg] enabled = False"
- ask for missing meta data keys in CLI only when they are required

7.5 version 0.1.0

· initial release

\cap L	IAP1		\succ
$\cup \sqcap$	IAF	ı⊏⊓	U

Bilbliography

CHAPTER 9

Indices and tables

- genindex
- modindex
- search

36

Bibliography

- [Bar52] R. Barer. Interference Microscopy and Mass Determination. *Nature*, 169(4296):366–367, 1952. doi:10.1038/169366b0.
- [Bar53] R. Barer. Determination of dry mass, thickness, solid and water concentration in living cells. *Nature*, 172:1097–1098, 1953. doi:10.1038/1721097a0.
- [Bar57] R. Barer. Refractometry and interferometry of living cells. *Journal of the Optical Society of America*, 47(6):545, jun 1957. doi:10.1364/josa.47.000545.
- [BJ54] R. Barer and S. Joseph. Refractometry of Living Cells Part I. Basic Principles. *Quarterly Journal of Microscopical Science*, 171(2):38P–39P, 1954. doi:10.1038/171720a0.
- [HGC94] Y. Harpaz, M. Gerstein, and C. Chothia. Volume changes on protein folding. *Structure*, 2(7):641–649, jul 1994. doi:10.1016/s0969-2126(00)00065-4.
- [KKL+07] B. Kemper, S. Kosmeier, P. Langehanenberg, G. von Bally, I. Bredebusch, W. Domschke, and J. Schnekenburger. Integral refractive index determination of living suspension cells by multifocus digital holographic phase contrast microscopy. *Journal of Biomedical Optics*, 12(5):054009, 2007. doi:10.1117/1.2798639.
- [KvB07] B. Kemper and G. von Bally. Digital holographic microscopy for live cell applications and technical inspection. *Applied Optics*, 47(4):A52, oct 2007. doi:10.1364/ao.47.000a52.
- [LL02] M. Lehmann and H. Lichte. Tutorial on off-axis electron holography. *Microscopy and Microanalysis*, 8(06):447–466, dec 2002, doi:10.1017/s1431927602020147.
- [MSG+18] P. Müller, M. Schürmann, S. Girardo, G. Cojoc, and Guck J. Accurate evaluation of size and refractive index for spherical objects in quantitative phase imaging. *Optics Express*, 26(8):10729–10743, 2018. doi:10.1364/OE.26.010729.
- [SCG+17] M. Schürmann, G. Cojoc, S. Girardo, E. Ulbricht, J. Guck, and P. Müller. 3d correlative single-cell imaging utilizing fluorescence and refractive index tomography. *Journal of Biophotonics*, pages n/a, aug 2017. doi:10.1002/jbio.201700145.
- [SSM+15] M. Schürmann, J. Scholze, P. Müller, C. J. Chan, A. E. Ekpenyong, K. J. Chalut, and J. Guck. Chapter 9 Refractive index measurements of single, spherical cells using digital holographic microscopy. In Ewa K Paluch, editor, *Biophysical Methods in Cell Biology*, volume 125 of Methods in Cell Biology, pages 143–159. Academic Press, 2015. doi:10.1016/bs.mcb.2014.10.016.
- [SSM+16] M. Schürmann, J. Scholze, P. Müller, J. Guck, and C. J. Chan. Cell nuclei have lower refractive index and mass density than cytoplasm. *Journal of Biophotonics*, 9(10):1068–1076, oct 2016. doi:10.1002/jbio.201500273.

38 Bibliography

Python Module Index

d

drymass.cfg_funcs, 29

40 Python Module Index

Index

```
D
drymass.cfg_funcs (module), 29

F
fbool() (in module drymass.cfg_funcs), 29
fintlist() (in module drymass.cfg_funcs), 29
float_or_str() (in module drymass.cfg_funcs), 29
floattuple_or_one() (in module drymass.cfg_funcs), 29

I
int_or_str() (in module drymass.cfg_funcs), 29

L
lcstr() (in module drymass.cfg_funcs), 29

T
tupletupleint() (in module drymass.cfg_funcs), 29
```