Bias-UQ-PCR

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ONE

GET DATA

```
\verb|src.get_data.cycle_to_index|(cycle: int)| \rightarrow int
            Parameters
                cycle (int) – cycle number i, 0 to n
            Returns
                index in matrix or array
            Return type
                int
src.get_data.file_to_numpy(file_abs_path: str) \rightarrow ndarray
            Parameters
                file_abs_path (str) – path to file name
      Notes
      All fluorescence values are divided by 10^6 before any analysis
            Returns
                n by m matrix of fluorescence, {\bf F}
            Return type
                np.ndarray
\verb|src.get_data.index_to_cycle| (\textit{index: int}) \rightarrow int|
            Parameters
                index (int) – index of cycle (0 to n-1)
            Returns
                cycle number (1 to n)
            Return type
                int
```

2 Chapter 1. Get Data

TWO

WELLS

```
src.wells.column\_row\_to\_well(\mathit{ix: int, iy: int}) \rightarrow str
      Convert indices to well
           Parameters
                  • ix (int) - x (column) index
                  • iy (int) – y (row) index
           Returns
               name of well
           Return type
                str
src.wells.number\_to\_column(number: int) \rightarrow int
      Get column index associated with well number
           Parameters
               number (int) – well number (0 to 95)
           Returns
               column (0 to 11)
           Return type
               int
src.wells.number\_to\_row(number: int) \rightarrow int
      Get the row number associated with a well number
           Parameters
               number (int) - well number
               row number (0 to 7)
           Return type
src.wells.number\_to\_well(number: int) \rightarrow str
      Get well name from number
           Parameters
               number (int) – well number (0 to 95)
           Returns
               well name (A1 to H12)
```

```
Return type
               str
src.wells.well\_to\_column(well: str) \rightarrow int
      Convert well name to column
           Parameters
               well (str) – name of well
           Returns
               ix - x-index for well (row)
           Return type
               int
src.wells.well\_to\_column\_row(well: str) \rightarrow Tuple[int]
      Convert well name to column, row
           Parameters
               well (str) – name of well
           Returns
               column index, row index
           Return type
               tuple(int, int)
src.wells.well_to_number(well: str) \rightarrow int
      Returns number of well
           Parameters
               well (str) – name of well (e.g., "A1")
               well number (0 to 95)
           Return type
               int
src.wells.well\_to\_row(well: str) \rightarrow int
      Well to y index
           Parameters
               well(str) – well name
           Returns
               iy – y-index of well (row)
           Return type
               int
```

4 Chapter 2. Wells

THREE

AMPLIFICATION

class src.amplification(R: float, pbar: float, E_U0: array, V_U0: ndarray)

Parameters

- 11 (float) Largest eigenvalue of \mathbf{A} , λ_1
- 12 (float) Smallest eigenvalue of \mathbf{A} , λ_2
- **x1** (np.array) Right eigenvector of A corresponding to λ_1 , \mathbf{x}_1
- **x2** (np.array) Right eigenvector of A corresponding to λ_2 , x_2
- **z1** (*np.array*) Left eigenvector of **A** corresponding to λ_1 , \mathbf{z}_1
- **z2** (*np.array*) Left eigenvector of **A** corresponding to λ_2 , \mathbf{z}_2
- K1 (np.ndarray) Matrix K_1 defined in (25)
- **K2** (np.ndarray) Matrix \mathbf{K}_2 defined in (25)

__init__(R: float, pbar: float, E_U0: array, V_U0: ndarray)

Parameters

- R(float) ratio of amplification probabilities, R
- **pbar** (*float*) geometric mean of amplification probabilities, \bar{p}
- **E_U0** (*np.array*) initial expected values of both strands $\mathbb{E}[\mathbf{U}_0]$, 2 by 1 matrix
- **V_U0** (*np.ndarray*) initial variances of both strands $Var[U_0]$, 2 by 2 matrix

 $get_A() \rightarrow ndarray$

Returns

matrix A calculated by decomposition (13)

Return type

np.ndarray

get_Atoi(i: int) \rightarrow ndarray

Parameters

i (int) – cycle number

Returns

matrix A^i calculated by decomposition (15)

Return type

np.ndarray

```
get_EXi_over_EYi(cycles: array) \rightarrow array
               Calculate \mathbb{E}[X_i]/\mathbb{E}[Y_i] for a variety of cycles i
                    Parameters
                          cycles (np. array) – cycles (integers) to calculate for each i
                    Returns
                          \mathbb{E}\left[X_i\right]/\mathbb{E}\left[Y_i\right]
                    Return type
                          np.array
       \mathtt{get\_E\_Ui}(i: int) \rightarrow \operatorname{array}
                    Parameters
                          i (int) – cycle number
                    Returns
                          matrix \mathbb{E}\left[\mathbf{U}_{i}\right] = \mathbf{A}^{i}\mathbb{E}\left[\mathbf{U}_{0}\right]
                    Return type
                          np.array
       get_V_Ui(i: int) \rightarrow ndarray
                    Parameters
                          i (int) – cycle number
                    Returns
                          Var[\mathbf{U}_i] obtained by Equation (27)
                    Return type
                          np.ndarray
       initialize()
               Initialize \mathbf{K}_{\ell} via (25), \nu_{j,k} via (28a), and \eta_{j,k}^{\ell} via (28b).
src.amplification.eval_R(p_fr: float, p_rf: float)
       Calculate R from p_{\rm rf} and p_{\rm fr}
               Parameters
                       • p_fr (float) – probability of forward to reverse amplification, p_{\rm fr}
                       • p_rf (float) – probability of reverse to forward amplification, p_{\rm rf}
               Returns
                    R = \sqrt{\frac{p_{\rm rf}}{p_{\rm fr}}}
               Return type
                    float
src.amplification.get_pfr_prf(R: float, pbar: float)
       Get p_{\mathrm{fr}} and p_{\mathrm{rf}} from R and \bar{p}
              Parameters
                       • \mathbf{R} (float) – square root of ratio of probabilities, R
                       • pbar (float) – geometric mean of probabilities, \bar{p}
               Return type
                    tuple(p_fr, p_rf)
```

MOLAR FLUORESCENCE

class src.molar_fluorescence .MolarFluorescence (C: array, files: List[str], name: str)

Parameters

- **f** (*np.ndarray*) molar fluorescences for each cycle/well **f**, n by number of wells matrix Determined in units of fluorescence divided by (pmol/L)
- **df** (np.ndarray) standard deviation in molar fluorescences σ , n by number of wells matrix Determined in units of fluorescence divided by (pmol/L)
- **cv** (*np.ndarray*) Coefficient of variation in molar fluorescences σ/\mathbf{f} ,
- **q** (*int*) number of plates (different concentrations)
- **n** (*int*) number of cycles
- m (int) number of wells
- **F** (np.ndarray) raw fluorescence data (scaled by 10^6 as described in get_data.py). Tensor of dimensions $n \times m \times q$

__init__(*C*: array, files: List[str], name: str)

Parameters

- C (np.array) concentrations of reporter in pmol/L
- **files** (*List[str]*) list of file names (absolute paths)
- name (str) name of reporter (e.g., FAM, Probe)

calculate()

Perform calculations of ${\bf f}$ and standard deviation σ

print_cv()

Print information relating to coefficient of variation

KINETIC PCR

Specific subclass for hydrolysis probes

Parameters

- **n** (*int*) number of cycles
- m (int) number of wells
- **d** (*np.ndarray*) array of incremental increases in fluorescences, n by m
- **b** (*np.ndarray*) array of background signals, n by m
- **dd** (*np.ndarray*) array of standard deviation in incremental increases in fluorescences, n by m
- db (np.ndarray) array of standard deviation in background signals, n by m
- **E_F** (np.ndarray) expected value of fluorescence, n by m, $\mathbb{E}\left[F\right]$
- **V_F** (*np.ndarray*) variance of fluorescence, n by m, Var [F]
- **E_DX** (np. array) expected value of change in X, length n, $\mathbf{E}[\Delta X_i]$
- **V_DX** (np. array) variance value of change in X, length n, $Var[\Delta X_i]$
- cycles (np.array) cycle numbers, 1 to n

__init__(C: float, Vol: float, f_plus: ndarray, f_minus: ndarray, R: float, pbar: float, E_U0: array, V_U0: ndarray, S plus: ndarray, S minus: ndarray, **kwargs) \rightarrow None

Parameters

- R(float) ratio of amplification probabilities, R
- **pbar** (float) geometric mean of amplification probabilities, \bar{p}
- **E_U0** (*np.array*) initial expected values of both strands $\mathbb{E}[\mathbf{U}_0]$, 2 array
- **V_U0** (np.ndarray) initial variances of both strands $Var[U_0]$, 2 by 2 matrix
- **f_plus** (*np.ndarray*) molar fluorescences for each cycle/well of active reporter **f**⁺, n by number of wells matrix Determined in units of fluorescence divided by (pmol/L)
- **f_minus** (*np.ndarray*) molar fluorescences for each cycle/well of inactive reporter **f**⁻, n by number of wells matrix Determined in units of fluorescence divided by (pmol/L)
- C (float) Total concentration of reporters in pmol/L, C

- **Vol** (*float*) Total volume of solution in L, V
- **s_plus** (np.ndarray) standard deviation in molar fluorescences for each cycle/well of active reporter σ^+ , n by number of wells matrix Determined in units of fluorescence divided by (pmol/L)
- **s_minus** (np.ndarray) standard deviation molar fluorescences for each cycle/well of inactive reporter σ^- , n by number of wells matrix Determined in units of fluorescence divided by (pmol/L)
- **kwargs** (*dict*) extra kwargs for Amplification class

calculate()

Performs calculations, filling in E_F, V_F, E_DX, and V_DX.

get_Cov_XiX0(i)

Parameters

i (int) – cycle number

Returns

Cov $[X_i, X_0]$, see (43)

Return type

float

 $get_E_DX(i) \rightarrow float$

Parameters

i (int) – cycle number

Returns

 $\mathbb{E}\left[\Delta X_i\right]$

Return type

float

$get_V_DX(i)$

Parameters

i (int) – cycle number

Returns

 $Var[\Delta X_i]$

Return type

float

src.kinetic_PCR.plot_fluorescence_curve(kls: HydrolysisProbes, ax: axis, wm1: int)

Parameters

- kls (HydrolysisProbes) Contains all amplification data. Has already computed values
- ax (matplotlib.axes) axes to plot on
- wm1 (int) well number

SIX

PLOTTING FIGURES

plot_figures.plot_figure2(R=0.9, pbar=0.85, max_cycle=4)

Parameters

- **R** (float, optional) choice for value of R, defaults to 0.9
- **pbar** (*float*, *optional*) choice for value of \bar{p} , defaults to 0.85
- max_cycle (int, optional) choice for maximum cycle to plot, defaults to 4

plot_figures.plot_figure6(model: HydrolysisProbes, wm1: int)

Parameters

- **model** (HydrolysisProbes) Contains all of the parameters for calculation of fluorescence curves
- **wm1** (*int*) well number (0 to 95)

Notes

The methods model.E_U0 and model.V_U0 are updated in place during plotting of each subplot

LIMIT OF DETECTION

```
class src.lod.LOD(input_type: str)
           Parameters
                input_type (str) - Type of nucleic acids input. Either "ds-DNA" (see (4)), "fs-RNA" (see
                (5)), or "rs-RNA" (see (6)).
      L(chi, kappa, R, pbar, r)
                Parameters
                    • chi (float) – parameter relating \mathbb{E}[I] to Var[I] (see (50))
                    • kappa (float) – number of standard deviations allowed to be above background, \kappa see
                      (51)
                    • R (float) – square-root of amplification efficiency ratio (see (3))
                    • pbar (float) – geometric mean of amplification efficiencies (see (2))
                    • r (float) – probability of reverse-transcription
                Returns
                    L as in (56)
               Return type
                    int
     M(chi, L)
                Parameters
                    • chi (float) – relationship between expected value and variance
                    • L (int) – limit of detection from (56)
                Returns
                    M as in (57)
                Return type
                    float
      alpha(R)
               Parameters
                    R (float) – square-root of amplification efficiency ratio
                Returns
                    \alpha as in (35a)
```

Return type

float

beta(R, pbar, r)

Parameters

- **R** (*float*) square-root of amplification efficiency ratio (see (3))
- **pbar** (*float*) geometric mean of amplification efficiencies (see (2))
- **r** (*float*) probability of reverse-transcription

Returns

 β as in (35b)

Return type

float

src.lod.main(chi=1, kappa=3, N=100)

Estimate range of LOD due to different assays. Prints out results.

Parameters

- **chi** (*float*, *optional*) Relationship between expected value an variance, defaults to 1 (Poisson distribution)
- **kappa** (*float*, *optional*) Number of standard deviations for statistical significance, defaults to 3
- N (int, optional) number of points in interval, defaults to 100

src.lod.my_int(x)

Parameters

x (float) -

Returns

 $\min \{ y \in \mathbb{N} \mid y \ge x \}$

Return type

int

Notes

The set $\mathbb{N} := \{1, 2, \ldots\}.$

```
>>> my_int(0.9)
1
>>> my_int(1.1)
2
>>> my_int(1.)
1
>>> my_int(2.)
2
>>> my_int(2.01)
3
>>> my_int(1.999)
2
```

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