# dpcR: web server and R package for analysis of dPCR experiments

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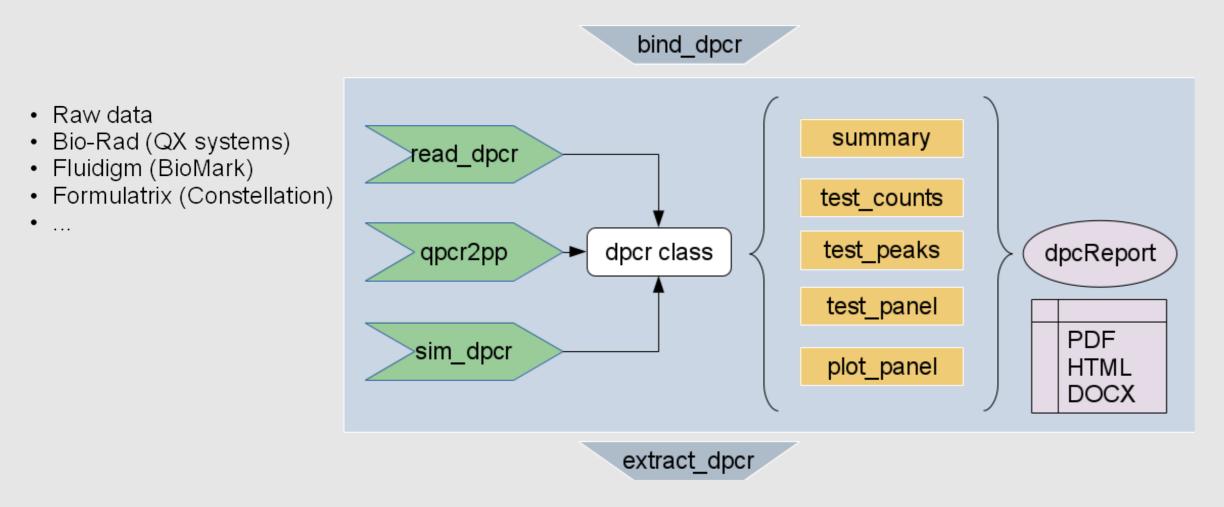
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#### Introduction

dPCR reaction consists of multiple amplifications occurring in numerous small partitions. The result of dPCR is a binary vector describing states of partitions (positive in case of detected amplification, negative otherwise). This data is further used to estimate the main parameter,  $\lambda$ , which may be interpreted as the mean number of template molecules per partition.

We created dpcR, an open source **R** package for reproducible analysis of dPCR data, fully compatible with dMIQE requirements.

#### dpcR workflow



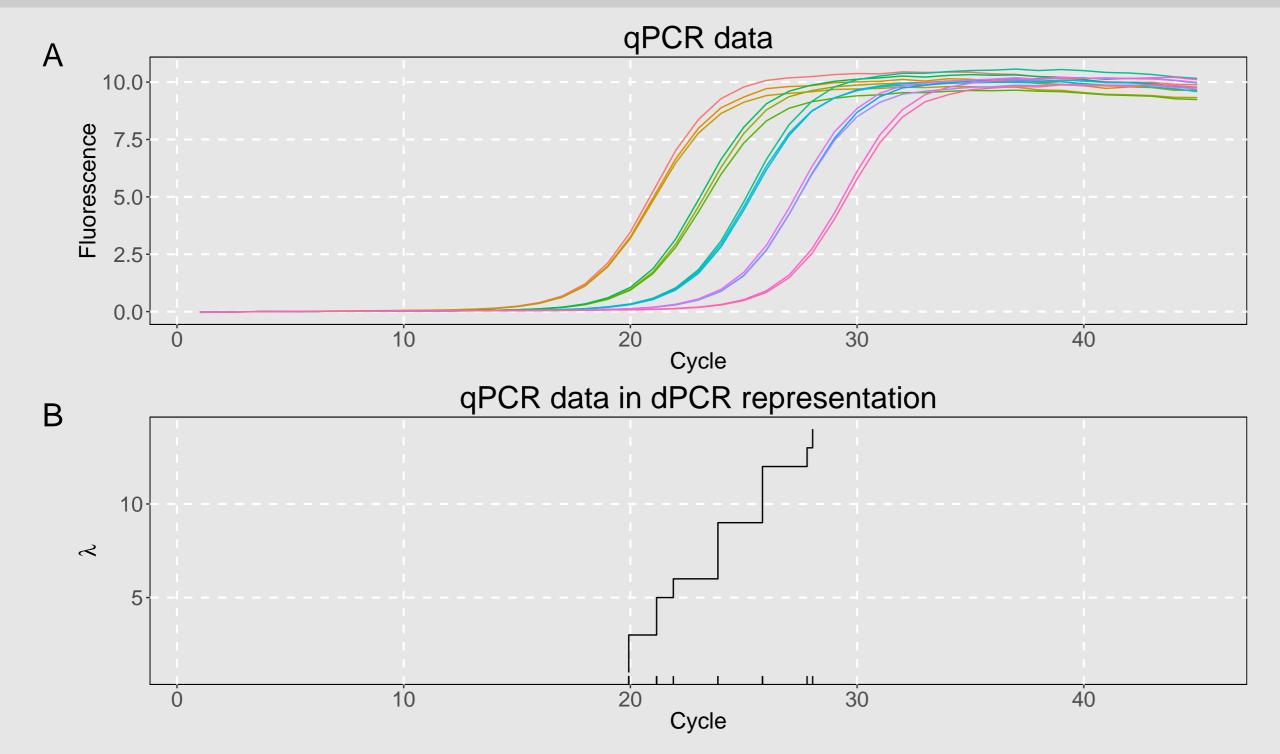
The workflow diagram shows main functions available at the each step of a dPCR data analysis.

### Data import

Import functions limit availability of the package by determining which datasets can be easily processed using the provided framework. Since the RDML format for dPCR is not yet established, we wrote function read\_dpcr streamlining data import from several systems produced by Bio-Rad, Fluidigm and Formulatrix.

To cover experimental or not yet included systems, we created a "raw data" format (see Supplementary Files for description). The user can manually arrange his data in this format and import it to the dpcR package. Such input files can be created in a spreadsheet program or a text editor.

### Integration of qPCR data



The dPCR methodology may be used to analyze qPCR data (Mojtahedi et al., 2014). Quantification points (Cq) are computed using the real-time measurements of several amplification curves (A). Next, the Cq values are binarized and treated as the status of partitions effectively converting multiple qPCR experiments into a dPCR (B). This functionality is supported by the *qpcr2pp* function.

### **Availability**

dpcReport web server:

www.smorfland.uni.wroc.pl/dpcReport

dpcR download:

http://cran.r-project.org/package=dpcR

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## Bibliography

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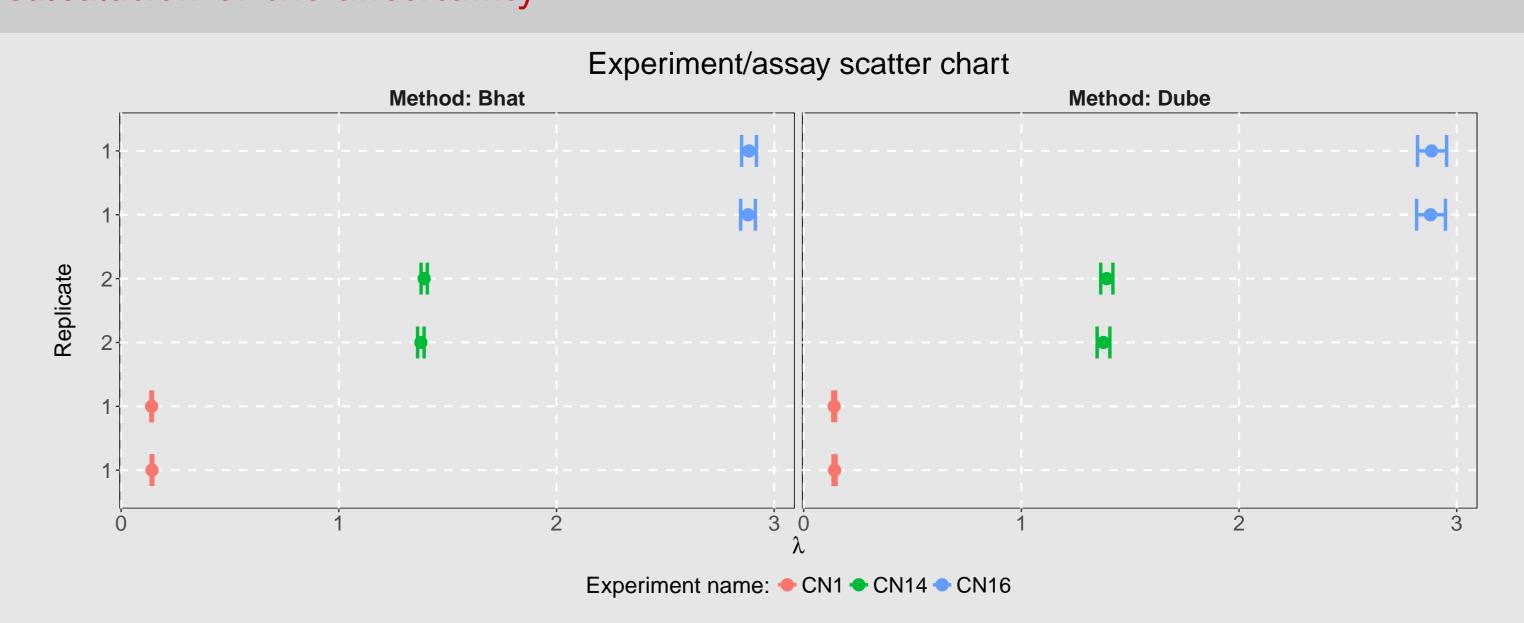
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### Case study: analysis of dPCR data

We present the functionalities of dpcR using the previously published data set consisting of three experiments repeated twice (Dorazio and Hunter, 2015).

> Experiment Assay Positive partitions Total partitions MYC 1687 CN1 12765 MYC 1787 CN1 13681 CN14 MYC 9913 13259 MYC 11117 CN14 14794 CN16 MYC 13919 14747

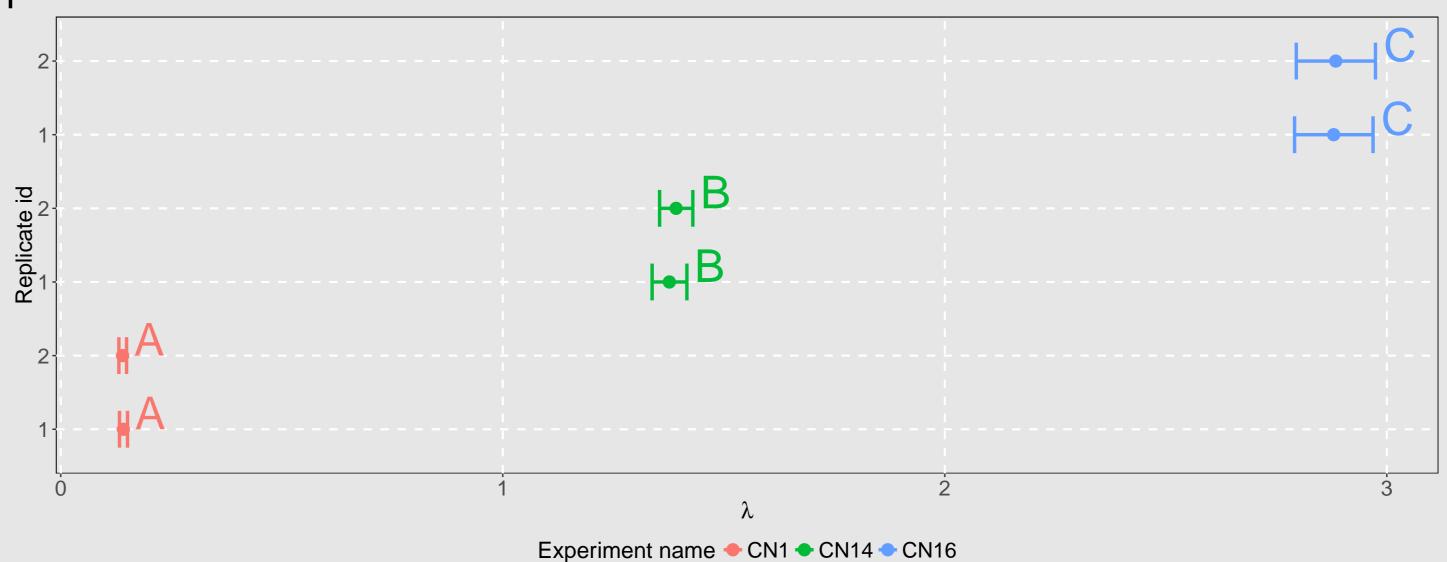
### Calculation of the uncertainty



To determine the uncertainty of the estimated  $\lambda$  dpcR employs two previously published peer-reviewed methods Dube et al. (2008); Bhat et al. (2009).

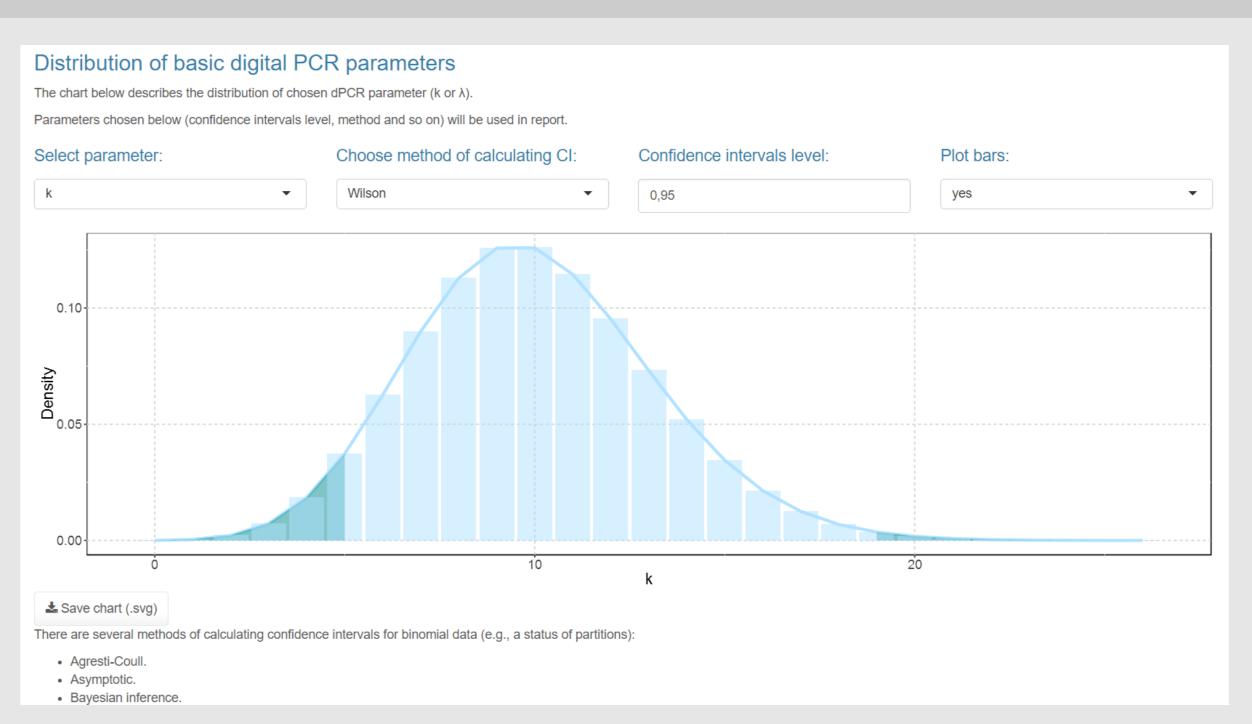
### Comparison of individual runs

The dpcR package covers peer-reviewed methods of comparing results of dPCR experiments. Here, by the comparison we understand a procedure, where all data points from all runs are considered and affect the final outcome.



Two methods, GLM and MRT, conduct such analysis on the run level by comparing individual runs against each other (Burdukiewicz et al., 2016). Additionally, we also implemented a method for individual dPCR experiments (not runs) (Dorazio and Hunter, 2015). All methods automatically assigns experiments to groups based on their  $\lambda$  values (A, B and C on the figure above).

### dpcReport



The majority of functions described above is also accessible using the web server dpcReport and does not require any experience with R. To preserve the reproducible research principle dpcReport generates highly customizable reports, which may even include  $\mathbf{R}$  code required to recreate an analysis.

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