

High-dimensional cytometry data analysis

STA426 lecture materials

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Background

- Introduction: single-cell analysis, high-dimensional cytometry
 - see lecture slides from Week 10
- Differential discovery analyses
 - 10-50 protein markers per cell
 - cell type and cell state markers
 - cell populations (types) defined using clustering
 - testing for differential abundance (DA) of cell populations and differential states (DS) within cell populations

Outline

Interactive demo

- R-based differential discovery analysis workflow for high-dimensional cytometry data
- we will follow a modified version of the CATALYST vignette (short version of workflow) and CyTOF workflow (long version)

Links

- Bioconductor: http://bioconductor.org/
- CyTOF workflow: http://bioconductor.org/packages/cytofWorkflow
- Paper describing CyTOF workflow in more detail: https://f1000research.com/articles/6-748/v2
- CATALYST package: http://bioconductor.org/packages/CATALYST
- CATALYST vignette:
 http://bioconductor.org/packages/release/bioc/vignettes/CATALYST/inst/doc/differential_analysis.html
- diffcyt package: http://bioconductor.org/packages/diffcyt

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CyTOF workflow and F1000 paper

CyTOF workflow: differential discovery in high-throughput high-dimensional cytometry datasets

Malgorzata Nowicka^{1,2}, Carsten Krieg³, Lukas M. Weber^{1,2}, Felix J. Hartmann³, Silvia Guglietta⁴, Burkhard Becher³, Mitchell P. Levesque⁵ and Mark D. Robinson^{1,2*}

F1000Research



METHOD ARTICLE

CyTOF workflow: differential discovery in high-throughput high-dimensional cytometry datasets [version 2; referees: 2 approved]

Malgorzata Nowicka^{1,2}, Carsten Krieg ^{1,3}, Lukas M. Weber ^{1,2}, Felix J. Hartmann ^{3,4}, Silvia Guglietta⁴, Burkhard Becher³, Mitchell P. Levesque⁵, Mark D. Robinson ^{1,2}

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Open Peer Review

Referee Status:

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CATALYST vignette

Differential analysis with CATALYST

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30 October 2018

Package

CATALYST 1.6.0

Contents

- 1 Example data
- 2 Data organization: The daFrame class
- 3 Diagnostic plots
 - 3.1 plotCounts: Number of cells measured per sample
 - 3.2 plotMDs: Multi-dimensional scaling plot
 - 3.3 plotExprHeatmap : Heatmap of (scaled) median marker expressions

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Exercise

- Perform a "<u>null comparison</u>" using code and data from the CATALYST vignette and/or CyTOF workflow
 - e.g. 4 vs. 4 comparison of "Reference" samples only (instead of comparing stimulated vs. reference samples)
 - note: the CATALYST vignette contains a subset of the full dataset; if you need more samples, try downloading the full data using code from the CyTOF workflow
 - re-run the analysis by modifying inputs to the plotting functions and differential testing functions
 - plot and interpret the results
 - what do the results show? what did you expect?