Automated Gating of Flow Cytometry Data using the Bioconductor openCyto Framework

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What's inside?

The goal of this tutorial is to take manually gated data from a .wsp flowJo file and use the Bioconductor openCyto framework to create an automated gating procedure within R which can be replicated on any dataset. The basic functions used in this tutorial include:

```
openWorkspace()
parseWorkspace()
gatingTemplate()
gating()
plot()
plotGate()
```

The example data used in this tutorial is from Colorado State University's Microbiology, Immunology, and Pathology Department. Alternatively, you can input your own flow Jo Workspace and follow this tutorial, so long as the file is in .wsp format.

Getting Started

Here is an overview of the process to automate flow cytometry data using R's openCyto and what you will need to successfully automate your own flow cytometry analysis. The general steps to accomplish this are as follows:

- 1. Read in a manually gated flow Jo workspace in .wsp file format.
- 2. Parse raw FCS files from the read in workspace.
- 3. Visualize the manual gating template and resulting gates to verify gating scheme.
- 4. Create and read in a .csv gating template.
- 5. Automate gating.
- 6. Visualize automated gating template and gates to verify gating scheme.
- 7. Extract population statistics and relevant information.

This process is completed primarily with the openCyto package but calls upon other packages within the Bioconductor openCyto framework. Packages needed to complete this tutorial are listed at the end of this chapter. Descriptions of each function and R object used for this analysis are below.

2.1 Function and R Object Definitions

Function/Object Name	Definition
wsfile	flowJo .wsp file location
openWorkspace()	function used to read in **wsfile**
ws	read in data from flowJo
parseWorkspace()	function to extract FCS files from **ws**
gating_set	parsed FCS files to be gated
clone()	function used to create a clone of **gating_set**
gh	subset of gating_set
gt	.csv gating template
templateGen()	function used to generate a .csv template from existing manual gates
gatingTemplate()	function used to read in .csv template
gating()	function used to apply gates to a gating set
plot()	function to visualize gating tree
plotGate()	function to visualize gates

2.2 Required Packages and Installation

Before getting started, install and load the following libraries into a new R script. As you will see below, this tutorial uses the development version of <code>openCyto</code>. Use the following to ensure the correct packages are installed.

 $To \ install$

```
devtools::install_github("RGLab/openCyto", ref = "trunk")
install.packages("data.table")
install.packages("flowWorkspace")
install.packages("flowCore")
install.packages("flowStats")
install.packages("flowClust")
install.packages("plyr")
```

To load

```
library(openCyto)
library(flowWorkspace)
library(data.table)
library(flowCore)
library(flowStats)
library(flowClust)
library(plyr)
```

Working with your Manual Gating Scheme

Current methods for manually gating flow cytometry are both time consuming and costly, making automated gating an appealing option. The openCyto package allows users to take manually gated data from flowJo, reproduce those gates in R, and eventually automate the gating process.

The first step in this process is to bring a pre-existing flow of file into R in order to recreate the gating environment. The remainder of this chapter will detail the following:

- 1. Read in flowJo .wsp file
- 2. Parse FCS files
- 3. Visualize and verify manual gates
- 4. Clone data for later automation

3.1 Read in flow Jo file

Within flowJo, tranformation, compensation, and gating can be saved as either .xml or .wsp filetypes. This tutorial will only detail steps from a .wsp filetype saved from flowJo. Saving analysis within flowJo is detailed here

The result of step 1 will be replication of the manual transformation, compensation, and gating from the flow Jo workspace saved as an R object. Before you begin, be sure you have loaded the required packages outlined in the previous chapter.

Once all packages are loaded, save the .wsp file path as an R object called wsfile. Next, use openWorkspace() with your R object name to open the .wsp file in R, save this as ws. Here is an example of saving and opening wsfile. Following this step, ws will be saved as a flowWorkspace object containing groups of samples.

```
library(openCyto)
library(flowWorkspace)
library(data.table)
library(flowCore)
library(flowStats)
library(flowClust)
library(plyr)
```

wsfile <- "/Users/monhait/Desktop/flow_cyto/automated_gating/data/Young_v_Adult_D30_Tcell_Spleen.wsp"
ws <- openWorkspace(wsfile)

print(ws)

FlowJo Workspace Version 20.0
File location: /Users/monhait/Desktop/flow_cyto/automated_gating/data
File name: Young_v_Adult_D30_Tcell_Spleen.wsp
Workspace is open.
##
Groups in Workspace
Name Num.Samples
1 All Samples 10
2 Samples 10</pre>

3.2 Parse FCS files

Once this file exists as an R object, the raw FCS files are then read using the parseWorkspace function. This function will read the FCS files and transform, compensate, and gate according to parameters defined from the .wsp flowJo workspace. The parseWorskpace call requires ws (the .wsp workspace that was just read in from flowJo) and the name of the samples to read in. Other options may be customized based on particular needs. A new R object named gating_set is then created and will be a GatingSet object. The isNcdf = TRUE call saves this output to disk rather that into memory because the files are large. Here is an example of parsing FCS files.

gating_set <- parseWorkspace(ws, name = "Samples", path = "/Users/monhait/Desktop/flow_cyto/automated_g</pre>

```
## Parsing 10 samples
## windows version of flowJo workspace recognized.
## version X
## Creating ncdfFlowSet...
## All FCS files have the same following channels:
## Time
## SSC-H
## SSC-A
## FSC-H
## FSC-A
## BV421-H
## BV480-H
## BV510-H
## BV570-H
## BV605-H
## BV650-H
## BV711-H
## BV785-H
## BB515-H
## Alexa Fluor 532-H
## PE-H
## PE-Dazzle594-H
## PE-Cy5-H
## PerCP-Cy5.5-H
```

```
## PerCP-eFluor 710-H
## PE-Cy7-H
## APC-H
## APC-R700-H
## APC-Fire 750-H
## Zombie Nir-H
## AF-H
## BV421-A
## BV480-A
## BV510-A
## BV570-A
## BV605-A
## BV650-A
## BV711-A
## BV785-A
## BB515-A
## Alexa Fluor 532-A
## PE-A
## PE-Dazzle594-A
## PE-Cy5-A
## PerCP-Cy5.5-A
## PerCP-eFluor 710-A
## PE-Cy7-A
## APC-A
## APC-R700-A
## APC-Fire 750-A
## Zombie Nir-A
## AF-A
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_ADULT 1_20180823_174
## Compensating
## gating ...
## write SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_ADULT 2_20180823_174
## Compensating
## gating ...
## write SPLEEN_ADULT 2_20180823_174227_Unmixed.fcs_130445 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_ADULT 3_20180823_174
## Compensating
## gating ...
## write SPLEEN_ADULT 3_20180823_174339_Unmixed.fcs_140448 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_ADULT 4_20180823_174
## Compensating
## gating ...
```

write SPLEEN_ADULT 4_20180823_174455_Unmixed.fcs_131634 to empty cdf slot...

```
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_ADULT 5_20180823_174
## Compensating
## gating ...
## write SPLEEN_ADULT 5_20180823_174556_Unmixed.fcs_127923 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_YOUNG 1_20180823_173
## Compensating
## gating ...
## write SPLEEN_YOUNG 1_20180823_173545_Unmixed.fcs_138610 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_YOUNG 2_20180823_173
## Compensating
## gating ...
## write SPLEEN_YOUNG 2_20180823_173649_Unmixed.fcs_129312 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_YOUNG 3_20180823_173
## Compensating
## gating ...
## write SPLEEN_YOUNG 3_20180823_173758_Unmixed.fcs_134302 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_YOUNG 4_20180823_173
## Compensating
## gating ...
## write SPLEEN_YOUNG 4_20180823_173907_Unmixed.fcs_131867 to empty cdf slot...
## loading data: /Users/monhait/Desktop/flow_cyto/automated_gating/data/fcs/SPLEEN_YOUNG 5_20180823_174
## Compensating
## gating ...
## write SPLEEN_YOUNG 5_20180823_174010_Unmixed.fcs_125124 to empty cdf slot...
```

3.3 Visualize and Verify

done!

It is helpful to now visualize both the gating template and actual gates on a subset of the data in order to verify the gating scheme. This will ensure consistency between the flowJo workspace and the manual gates recreated in R. First, save a subset of the gating_set as follows. The following saves the first FCS file of gating_set as gh.

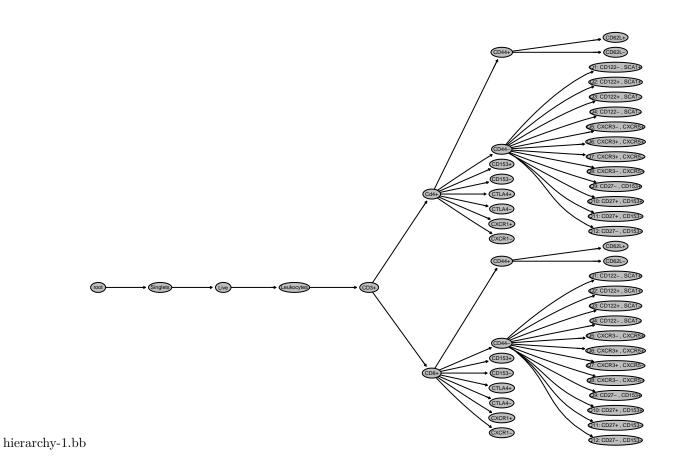
```
gh <- gating_set[[1]]
print(gh)

## Sample: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
## GatingHierarchy with 51 gates</pre>
```

3.3.1 plot()

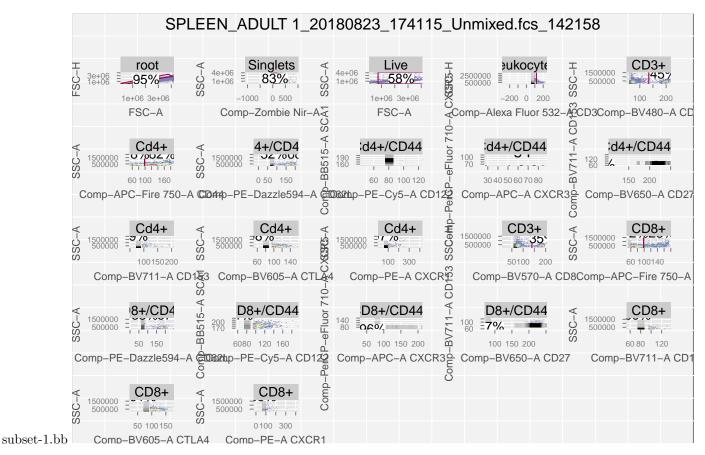
The plot() function will visualize the current gating hierarchy. This can be done for the entire gating hierarchy or a specific population as seen below.

plot(gh)



3.3.2 plotGate()

The plotGate() function will gate the designated subset of your data according to parameters replicated from flowJo.



^{**}Note the use of flowWorkspace.par.set() here. Chapter 5 of this tutorial will discuss customizations such as this one.

3.4 Clone

Now, the manual gating scheme has been replicated in R using openCyto and verified for consistency with the original flowJo workspace. The final step in this chapter will clone **gating_set** into a new R object named **auto_gating**.

```
auto_gating <- clone(gating_set)
print(auto_gating)</pre>
```

A GatingSet with 10 samples

Create .csv

The creation of a .csv gating template is arguably the most important step to automating flow cytometry analysis. The .csv template that you create will tell openCyto how to gate your data. Gating methods that are support currently by openCyto include:

quadrantGate
rangeGate
quantileGate
mindensity
tailgate
cytokine
flowClust
boundary
singletGate
transitional
plolyfunctionalityGate
flowDensity

4.1 .csv Gating Template Structure

In the gating template, each row corresponds to a single cell population and the method used to gate that population. The .csv must contain 10 predefined columns that will be listed below. Most cell population names listed in columns must be uniquely and follow certain guidelines. These include:

```
unique idenitifer for alias and parent columns
no commas in parent columns (otherwise opencyto will assume the population has multiple parents)
*restrict pop column to quadrant-only strings (++,+)
```

The required 10 columns are below.

4.1.1 Template Columns

```
alias- unique name/identifier for cell population

pop- +/- pattern to determine which subset or quadrant will be gated

parent- unique identifier for the parent population

dims- channel or marker names for gating

gating_method- gating function (supported options listed above)

gating_args- arguments to be passed to gating function collapseDataforGating- data is collapsed and
```

replicated across all samples groupBy- used to group samples into unique combinations preprocessing_method- preprocessing function preprocessing_args- arguments for preprocessing function

4.2 Creating the Template

The gating template can be created manually or assisted by the use of the templateGen() function. TemplateGen() will auto-fill the alias, pop, parent, and dims columns and the rest must be completed manually. To use templateGen(), you must input a GatingHierarchy object. In this example, that is gh, the subset created from gating_set.

```
gt <- templateGen(gh)
print(gt)</pre>
```

```
alias
                                            pop
## 1
                 Singlets
                                       Singlets
## 2
                      Live
                                           Live
## 3
               Leukocytes
                                     Leukocytes
## 4
                      CD3+
                                           CD3+
                                           CD8+
## 5
                      CD8+
## 6
                    CXCR1-
                                         CXCR1-
## 7
                    CXCR1+
                                         CXCR1+
## 8
                    CTLA4-
                                         CTLA4-
## 9
                    CTLA4+
                                         CTLA4+
## 10
                    CD153-
                                         CD153-
## 11
                    CD153+
                                         CD153+
## 12
                     CD44-
                                          CD44-
## 13 Q12: CD27- , CD153- Q12: CD27- , CD153-
## 14 Q11: CD27+ , CD153- Q11: CD27+ , CD153-
  15 Q10: CD27+ , CD153+ Q10: CD27+ , CD153+
       Q9: CD27- , CD153+ Q9: CD27- , CD153+
## 17 Q8: CXCR3- , CXCR5- Q8: CXCR3- , CXCR5-
## 18 Q7: CXCR3+ , CXCR5- Q7: CXCR3+ , CXCR5-
## 19 Q6: CXCR3+ , CXCR5+ Q6: CXCR3+ , CXCR5+
## 20 Q5: CXCR3- , CXCR5+ Q5: CXCR3- , CXCR5+
                            Q4: CD122- , SCA1-
## 21
       Q4: CD122- , SCA1-
       Q3: CD122+ , SCA1-
                            Q3: CD122+ , SCA1-
## 22
## 23
       Q2: CD122+ , SCA1+
                            Q2: CD122+ , SCA1+
## 24
       Q1: CD122- , SCA1+
                            Q1: CD122- , SCA1+
## 25
                     CD44+
                                          CD44+
## 26
                    CD62L-
                                         CD62L-
## 27
                    CD62L+
                                         CD62L+
## 28
                      Cd4+
                                           Cd4+
                    CXCR1-
## 29
                                         CXCR1-
## 30
                    CXCR1+
                                         CXCR1+
## 31
                    CTLA4-
                                         CTLA4-
## 32
                    CTLA4+
                                         CTLA4+
## 33
                    CD153-
                                         CD153-
## 34
                    CD153+
                                         CD153+
## 35
                     CD44-
                                          CD44-
## 36 Q12: CD27- , CD153- Q12: CD27- , CD153-
## 37 Q11: CD27+ , CD153- Q11: CD27+ , CD153-
```

```
## 38 Q10: CD27+ , CD153+ Q10: CD27+ , CD153+
       Q9: CD27- , CD153+ Q9: CD27- , CD153+
  40 Q8: CXCR3- , CXCR5- Q8: CXCR3- , CXCR5-
  41 Q7: CXCR3+ , CXCR5- Q7: CXCR3+ , CXCR5-
     Q6: CXCR3+ , CXCR5+ Q6: CXCR3+ , CXCR5+
  43 Q5: CXCR3- , CXCR5+ Q5: CXCR3- , CXCR5+
##
       Q4: CD122- , SCA1-
                           Q4: CD122- , SCA1-
  44
       Q3: CD122+ , SCA1-
## 45
                           Q3: CD122+ , SCA1-
##
   46
       Q2: CD122+ , SCA1+
                           Q2: CD122+ , SCA1+
##
  47
       Q1: CD122- , SCA1+
                           Q1: CD122- , SCA1+
##
   48
                    CD44+
                                         CD44+
##
  49
                   CD62L-
                                        CD62L-
##
   50
                   CD62L+
                                        CD62L+
##
                                          parent
##
  1
                                            root
##
  2
                                       /Singlets
##
  3
                                  /Singlets/Live
##
                      /Singlets/Live/Leukocytes
##
  5
                 /Singlets/Live/Leukocytes/CD3+
##
  6
            /Singlets/Live/Leukocytes/CD3+/CD8+
##
  7
            /Singlets/Live/Leukocytes/CD3+/CD8+
  8
            /Singlets/Live/Leukocytes/CD3+/CD8+
##
  9
            /Singlets/Live/Leukocytes/CD3+/CD8+
##
            /Singlets/Live/Leukocytes/CD3+/CD8+
##
  10
##
  11
            /Singlets/Live/Leukocytes/CD3+/CD8+
##
  12
            /Singlets/Live/Leukocytes/CD3+/CD8+
      /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
##
##
      /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
   15 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
  16 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
     /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
  18 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
  19 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
  20 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
     /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
  22 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
  23 /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
      /Singlets/Live/Leukocytes/CD3+/CD8+/CD44-
##
  24
##
  25
            /Singlets/Live/Leukocytes/CD3+/CD8+
     /Singlets/Live/Leukocytes/CD3+/CD8+/CD44+
##
  26
  27
      /Singlets/Live/Leukocytes/CD3+/CD8+/CD44+
##
  28
                 /Singlets/Live/Leukocytes/CD3+
##
   29
            /Singlets/Live/Leukocytes/CD3+/Cd4+
##
  30
            /Singlets/Live/Leukocytes/CD3+/Cd4+
##
  31
            /Singlets/Live/Leukocytes/CD3+/Cd4+
  32
##
            /Singlets/Live/Leukocytes/CD3+/Cd4+
##
   33
            /Singlets/Live/Leukocytes/CD3+/Cd4+
##
  34
            /Singlets/Live/Leukocytes/CD3+/Cd4+
##
   35
            /Singlets/Live/Leukocytes/CD3+/Cd4+
      /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
##
      /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
##
   37
  38 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
## 39 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
## 40 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
```

```
## 41 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
  42 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
  43 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
   44 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
##
   45 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
   46 /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
##
      /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44-
##
             /Singlets/Live/Leukocytes/CD3+/Cd4+
      /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44+
##
      /Singlets/Live/Leukocytes/CD3+/Cd4+/CD44+
##
                                       dims gating_method gating_args
##
   1
                               FSC-A, FSC-H
                                                       <NA>
                                                                    <NA>
##
  2
                                                       <NA>
                                                                    <NA>
                         Comp-Zombie Nir-A
                               FSC-A, SSC-A
## 3
                                                       <NA>
                                                                    <NA>
## 4
             Comp-Alexa Fluor 532-A, SSC-H
                                                       <NA>
                                                                    <NA>
##
  5
                        Comp-BV570-A, SSC-H
                                                       <NA>
                                                                    <NA>
##
  6
                                  Comp-PE-A
                                                       <NA>
                                                                    <NA>
##
   7
                                  Comp-PE-A
                                                       <NA>
                                                                    <NA>
## 8
                              Comp-BV605-A
                                                       <NA>
                                                                    <NA>
## 9
                              Comp-BV605-A
                                                       <NA>
                                                                    <NA>
## 10
                              Comp-BV711-A
                                                       <NA>
                                                                    <NA>
## 11
                              Comp-BV711-A
                                                       <NA>
                                                                    <NA>
## 12
                       Comp-APC-Fire 750-A
                                                       <NA>
                                                                    < NA >
##
   13
                Comp-BV650-A, Comp-BV711-A
                                                       <NA>
                                                                    <NA>
  14
##
                Comp-BV650-A, Comp-BV711-A
                                                       < NA >
                                                                    <NA>
##
   15
                Comp-BV650-A, Comp-BV711-A
                                                       <NA>
                                                                    <NA>
##
   16
                Comp-BV650-A, Comp-BV711-A
                                                       < NA >
                                                                    <NA>
##
      Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                       <NA>
                                                                    <NA>
   17
      Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                       <NA>
                                                                    <NA>
      Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                       <NA>
                                                                    <NA>
##
   20
      Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                       <NA>
                                                                    <NA>
##
   21
               Comp-PE-Cy5-A, Comp-BB515-A
                                                                    <NA>
                                                       <NA>
   22
##
               Comp-PE-Cy5-A, Comp-BB515-A
                                                       <NA>
                                                                    <NA>
  23
##
               Comp-PE-Cy5-A, Comp-BB515-A
                                                                    <NA>
                                                       <NA>
##
   24
               Comp-PE-Cy5-A, Comp-BB515-A
                                                       <NA>
                                                                    <NA>
##
  25
                       Comp-APC-Fire 750-A
                                                       < NA >
                                                                    <NA>
##
  26
                       Comp-PE-Dazzle594-A
                                                       <NA>
                                                                    <NA>
##
  27
                       Comp-PE-Dazzle594-A
                                                       <NA>
                                                                    <NA>
                        Comp-BV480-A,SSC-H
##
  28
                                                       <NA>
                                                                    <NA>
##
  29
                                  Comp-PE-A
                                                       <NA>
                                                                    < NA >
##
   30
                                  Comp-PE-A
                                                       <NA>
                                                                    <NA>
##
  31
                              Comp-BV605-A
                                                       <NA>
                                                                    <NA>
##
   32
                              Comp-BV605-A
                                                       <NA>
                                                                    <NA>
##
  33
                              Comp-BV711-A
                                                       <NA>
                                                                    <NA>
##
  34
                              Comp-BV711-A
                                                       <NA>
                                                                    <NA>
  35
                       Comp-APC-Fire 750-A
##
                                                       <NA>
                                                                    <NA>
##
   36
                Comp-BV650-A, Comp-BV711-A
                                                       <NA>
                                                                    <NA>
##
   37
                Comp-BV650-A, Comp-BV711-A
                                                       <NA>
                                                                    <NA>
##
   38
                Comp-BV650-A, Comp-BV711-A
                                                       <NA>
                                                                    <NA>
##
   39
                Comp-BV650-A, Comp-BV711-A
                                                       <NA>
                                                                    <NA>
      Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                       <NA>
                                                                    <NA>
## 41 Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                       <NA>
                                                                    <NA>
## 42 Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                                    <NA>
                                                       <NA>
## 43 Comp-APC-A, Comp-PerCP-eFluor 710-A
                                                                    <NA>
                                                       <NA>
```

##	44	Comp-PE-Cy5-A, Comp	-BB515-A	<na></na>	<na></na>	
##	45	Comp-PE-Cy5-A,Comp	-BB515-A	<na></na>	<na></na>	
##	46	Comp-PE-Cy5-A,Comp	<na></na>	<na></na>		
##	47	Comp-PE-Cy5-A,Comp	<na></na>	<na></na>		
##	48	Comp-APC-Fi	<na></na>	<na></na>		
##	49	Comp-PE-Daz	<na></na>	<na></na>		
##	50	Comp-PE-Daz	zle594-A	<na></na>	<na></na>	
##		collapseDataForGating grou	pBy prep	rocessing_method	preprocessing	args
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			INA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			(NA> (NA>	<na></na>		<na></na>
##			INA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
	14		:NA>	<na></na>		<na></na>
	15		:NA>	<na></na>		<na></na>
	16		NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
	18		:NA>	<na></na>		<na></na>
##	19	<na> <</na>	:NA>	<na></na>		<na></na>
##	20	<na> <</na>	:NA>	<na></na>		<na></na>
##	21	<na> <</na>	:NA>	<na></na>		<na></na>
##	22	<na> <</na>	:NA>	<na></na>		<na></na>
##	23	<na> <</na>	:NA>	<na></na>		<na></na>
##	24	<na> <</na>	:NA>	<na></na>		<na></na>
##	25	<na> <</na>	:NA>	<na></na>		<na></na>
##	26	<na> <</na>	:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			INA>	<na></na>		<na></na>
## ##			:NA>	<na></na>		<na></na>
##			(NA> (NA>	<na></na>		<na></na>
##			INA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
##			:NA>	<na></na>		<na></na>
	44		:NA>	<na></na>		<na></na>
##	45		:NA>	<na></na>		<na></na>
##	46	<na> <</na>	:NA>	<na></na>		<na></na>

## 47	<na></na>	<na></na>	<na></na>	<na></na>
## 48	<na></na>	<na></na>	<na></na>	<na></na>
## 49	<na></na>	<na></na>	<na></na>	<na></na>
## 50	<na></na>	<na></na>	<na></na>	<na></na>

The auto-filled template will generate within the R Console and can then be saved locally with the following code.

```
write.csv(gt, "gt.csv")
```

If you choose to create the gating template manually, the same conventions must be followed. Start with a blank spreadsheet. Next, fill in the 10 required column names. From there, use the manual gating hierarchy to fill in each cell population alias. Fill in the remainder accordingly.

There will likely be troubleshooting involved in this process. This is a great place to start if you're seeking more information on the gating template.

4.3 Load .csv into R

When the .csv gating template is complete, it is then read into R and saved as **gt**. The gating template will be saved as a GatingTemplate object.

```
gt <- gatingTemplate("/Users/monhait/Desktop/flow_cyto/automated_gating/data/gating_template/auto_templaterict = FALSE, strip_extra_quotes = TRUE)
print(gt)</pre>
```

Automate Gating

The flow cytometry equipment at CSU will compensate and transform the data automatically. Other tutorials may highlight the steps to compensate and transform data, but these are not relevant to CSU at this moment. In the event that equipment changes, it may be necessary to complete compensation and transformation steps to prepare data. More on the current equipment used as CSU here.

5.1 Apply Gating

At this point, you will either return to your cloned GatingSet object that contains raw FCS files or bring in new data to be gated using the same parameters. Apply \mathbf{gt} to the GatingSet object, where $\mathbf{x} = \mathbf{gt}$ and $\mathbf{y} = \mathbf{data}$ to be gated.

```
gating(x = gt, y = auto_gating)
```

Just as before, plot both the gating hierarchy and the automated gates. You may notice extra nodes have been added to the hierarchy. Chapter 5 will highlight additional cusomization to remove unwanted nodes and improve upon visualization.

5.2 Plot Automated Gating

```
plotGate(auto_gating)
plot(auto_gating)
```

5.3 Population Statistics

Both counts and frequencies can be generated for analysis. This can be generate based on the analysis completed in R, or pulled directly from flowJo. To pull from flowJo, simply at flowJo=TRUE to either code chunk below.

Counts

```
head(getPopStats(auto_gating,satistic="count"))
```

```
name Population
##
                                                                        Parent
## 1: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                           Singlets
                                                                          root
## 2: SPLEEN ADULT 1 20180823 174115 Unmixed.fcs 142158
                                                                      Singlets
## 3: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158 Leukocytes
                                                                          Live
## 4: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                               CD3+ Leukocytes
## 5: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                               Cd4+
                                                                          CD3+
## 6: SPLEEN ADULT 1 20180823 174115 Unmixed.fcs 142158 Cd4+/CD44+
                                                                          Cd4+
       Count ParentCount
## 1: 134378
                  142158
## 2: 111695
                  134378
## 3: 65104
                  111695
## 4:
        4781
                   65104
## 5:
        2151
                    4781
## 6:
        1760
                    2151
```

Frequencies

head(getPopStats(auto_gating,satistic="freq"))

```
name Population
                                                                        Parent
## 1: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                           Singlets
                                                                          root
## 2: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                               Live
                                                                      Singlets
## 3: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158 Leukocytes
                                                                          Live
## 4: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                               CD3+ Leukocytes
## 5: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158
                                                                          CD3+
## 6: SPLEEN_ADULT 1_20180823_174115_Unmixed.fcs_142158 Cd4+/CD44+
                                                                          Cd4+
       Count ParentCount
## 1: 134378
                  142158
## 2: 111695
                  134378
## 3: 65104
                  111695
## 4:
        4781
                   65104
## 5:
        2151
                    4781
## 6:
        1760
                    2151
```

Customization

It is possible that additional customization may be necessary when working with the openCyto framework. Below are three common customizations that will be outlined in this chapter.

- 1. Hiding unwanted nodes
- 2. Renaming nodes
- 3. Adjusting plots

6.1 Hiding unwanted nodes

When automating analysis, there may be nodes that were not predefined in the .csv gating template or nodes that may not be of interest in your particular analysis. Plotting the gating hierarchy using the plot() function will display this and then nodes can be hidden based on need with the following code. Below is an example of a "full" gating hierarchy and then the same hierarchy with the CD3+ node removed.

Full Hierarchy

```
plot(gh)
```

CD3+ Removed Hierarchy

To remove nodes, first save the unwanted nodes as an R object named **nodesToHide**. Next, use the code following the lapply() function, only replacing **gs** with your GatingSet object name.

```
nodesToHide <- "CD3+"
lapply(nodesToHide, function(thisNode)setNode(gs, thisNode, FALSE))</pre>
```

6.2 Renaming nodes

Rename nodes based on your preferences with the following code. Within the setNode function, the first input is the current cell population name and the second is the desired change.

```
setNode("Live", "Viable")
```

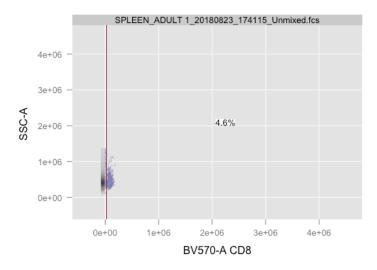
6.3 Adjusting plots

6.3.1 Adjust plot axes

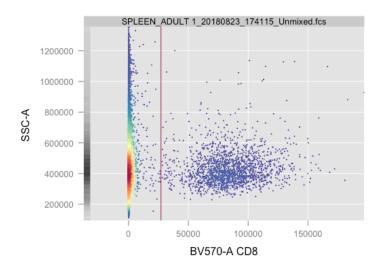
As seen in chapter 2, it may be necessary to adjust the plot axes in order to best view the gates. This is done using the code below. Setting xlim and ylim to "data" adjusts plot based on the actual data range, rather than instrument specifications. Custom ranges can also be input numerically.

Here is a comparison of xlim and ylim set as "instrument" and then "data".

Instrument



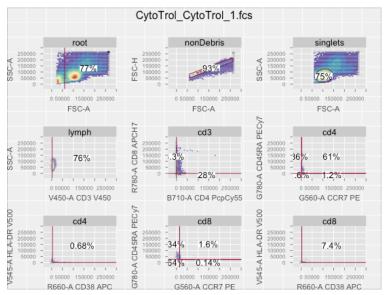
Data



6.3.2 Transform data for better visualization

Although data will not be altered in any way, transformation may allow for better visualization. The most common form of transformation for flow cytometry analysis is bioexponential. Below is a comparison of gates without transformation and gates that have been transformed.

Without Transformation



Transformed

