# Environmental Population Analysis

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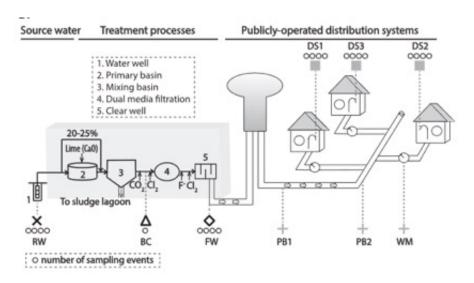


Figure 1: scheme

# 1 Environmental analysis

RW: Raw Water before treatment

BC: Before Chlorination FW: Finished Water DS1-DS3: tap water PB1-PB2: biofilm in pipes

WM: biofilm in water meters

We are going to study the variation of microbial populations before entering the circuit (RW), at the end of the treatment (FW) and tap water samples in three houses (DS1, DS2 and DS3). We will also study samples taken in June and July.

I propose you to run the pipeline I showed you in Unit 2 whit this dataset and answer the following questions:

- 1) How many reads have we got for each sample?
- 2) Which is the trimming length you are using for the denoising step?
- 3) How many ASVs do you have before filtering deblur-table? And after filtering?
- 4) Which is the average frequency of sequences per sample before filtering deblur table?
- 5) Which is the sample with the lower number of sequences after filtering deblur table? And the one with the highest number?
- 6) Which is the most abundant phylum in each sample?
- 7) Has the study enough coverage to allow us to make any statistical inference on communities' diversity?
- 8) Studying the Unifrac Weighted PCoA plot. Is there any effect of water treatment or sampling moment on the bacteria communities?
- 9) If we compare Untreated samples (RW) vs Treated samples (FW, DS1, DS2, DS3) which are the Phyla or Classes explaining the differences among both groups? (Hint: use LEfSe)

#### **Dataset Contents:**

- 1) fastq folder: raw sample sequences
- 2) 85\_otus.fasta and 85\_otus\_taxonomy.txt: taxonomy database
- 3) metadata.txt: sample metadata. I have included some columns useful for diversity analyses.
- 4) primers.txt: information on primers used for 16S PCR amplification
- 5) quiz.docx: this file
- 6) samplemanifest: manifest file with information of the ubication of fastq files and their corresponding tags.

### 1.1 Responses

1) How many reads have we got for each sample?

From *grep* against fastq files and verified after import on *qiime*.

File	#reads
SRR3593621_1.fastq	52945
SRR3593621_2.fastq	52945
SRR3593622_1.fastq	62218
SRR3593622_2.fastq	62218
SRR3593623_1.fastq	92740
SRR3593623_2.fastq	92740
SRR3593625_1.fastq	70366
SRR3593625_2.fastq	70366
SRR3593627_1.fastq	100615
SRR3593627_2.fastq	100615
SRR3593628_1.fastq	78495
SRR3593628_2.fastq	78495
SRR3593631_1.fastq	97332
SRR3593631_2.fastq	97332
SRR3593632_1.fastq	84361
SRR3593632_2.fastq	84361
SRR3593664_1.fastq	101827
SRR3593664_2.fastq	101827
SRR3593665_1.fastq	84850
SRR3593665_2.fastq	84850

2) Which is the trimming length you are using for the denoising step?

The quality of the reads is incremented substantially after the merge step by VSEARCH, consequence of a great overlap within forward and reverse sequences. In fact the filtering by means of 'qiime quality-filter q-score-joined' doesn't drop any read.

index Unknown	A startantanta	Destar de la con-	Caldianatas	Chlass M.	Chlorofford	Constants =	Planetautes -	NI annual and	004	OD44	002 -	Planctomycetes ~	Dont a character of	Culturalization	wes	Address 1	Comm
		Bacteroidetes														Month	
SRR35936230.0	257.0	0.0	0.0	0.0	0.0	2847.0	0.0	0.0	0.0	0.0	0.0	183.0	29274.0	0.0	0.0	June	DS1
SRR35936250.0	65.0	0.0	0.0	0.0	0.0	5817.0	0.0	0.0	0.0	0.0	0.0	114.0	20791.0	0.0	0.0	July	DS1
SRR35936270.0	94.0	756.0	0.0	0.0	0.0	13014.0	0.0	0.0	0.0	3.0	0.0	4235.0	22101.0	0.0	0.0	June	DS2
SRR35936283.0	27.0	96.0	0.0	0.0	0.0	5388.0	0.0	0.0	0.0	0.0	2.0	1081.0	20020.0	0.0	0.0	July	DS2
SRR35936310.0	0.0	2499.0	0.0	0.0	0.0	32169.0	0.0	0.0	0.0	0.0	0.0	662.0	6601.0	3.0	0.0	June	DS3
SRR35936322.0	0.0	51.0	0.0	0.0	0.0	21105.0	0.0	0.0	0.0	0.0	0.0	124.0	11733.0	0.0	0.0	July	DS3
SRR3593664 40.0	211.0	30.0	0.0	0.0	0.0	10267.0	0.0	0.0	0.0	0.0	0.0	160.0	24818.0	3.0	0.0	June	FW
SRR35936653.0	0.0	0.0	0.0	0.0	0.0	9009.0	0.0	0.0	0.0	0.0	0.0	143.0	23019.0	0.0	0.0	July	FW
SRR35936210.0	10.0	169.0	35.0	153.0	703.0	24.0	167.0	36.0	10.0	3365.0	337.0	0.0	868.0	10652.0	57.0	June	RW
SRR35936220.0	25.0	218.0	40.0	527.0	1376.0	28.0	808.0	289.0	20.0	5803.0	879.0	0.0	4992.0	45.0	246.0	July	RW

Figure 2: Taxonomy by philum

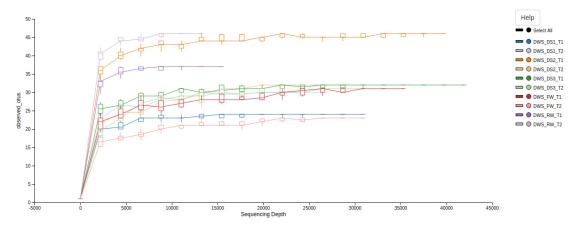


Figure 3: Rarefaction curves

I choose 372 that retains Q >= 38.

- 3) How many ASVs do you have before filtering deblur-table? And after filtering? Before filtering I've 765 features after 104.
- 4) Which is the average frequency of sequences per sample before filtering deblur table? >30,070
- 5) Which is the sample with the lower number of sequences after filtering deblur table? And the one with the highest number?

The sample SRR3593622 has the lower number of sequences: 15,296 The sample SRR3593631 has the higher number of sequences: 41,934

6) Which is the most abundant phylum in each sample?

The marked in the table of figure 2.

- 7) Has the study enough coverage to allow us to make any statistical inference on communities diversity? Yes, the rarefaction curves reach saturation asymptotic pattern, no more reads would give us more observed OTUS (figure 3).
- 8) Studying the Unifrac Weighted PCoA plot. Is there any effect of water treatment or sampling moment on the bacteria communities?

The water treatment groups cluster together nearly over axis2-axis3 plane, and the not treated water groups far along the axis1. As axis1 explains 43% of differences, we conclude that treated groups are most in common between than between the not treated groups (figure 4).

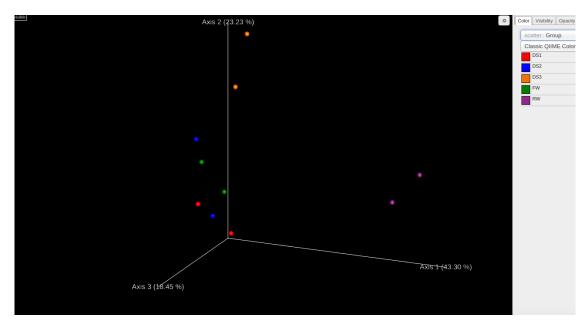


Figure 4: PCoA groups

Also the graph evidences the dissimilarity between DS3 groups and the other treated groups, above on the axis2. The biofilm presence in the distribution, surely is the explaining factor.

The difference in months are less relevant as seen in figure 5. In the case of treated groups month juny groups cluster nearer to the axis2.

9) If we compare Untreated samples (RW) vs Treated samples (FW, DS1, DS2, DS3) which are the Phyla or Classes explaining the differences among both groups? (Hint: use LEfSe)

The classes are drawn in the figure 6 LDA representation (TT treated and TN untrated). The most explanatory respectively are cyanobacteria and sphirocaetes + OP11, coherently with the table of question 6.

Also the graph evidences the higher diversity in the not treated water, as expected.

# 1.2 Pipeline

#### 1.2.1 Preprocessing and quality check

```
Script 1.2.1 (python)

import warnings
warnings.filterwarnings('ignore')
import pandas as pd
import matplotlib.pyplot as plt

FILE_ID = "SRR"
FASTQ_STR = "@SRR"
```

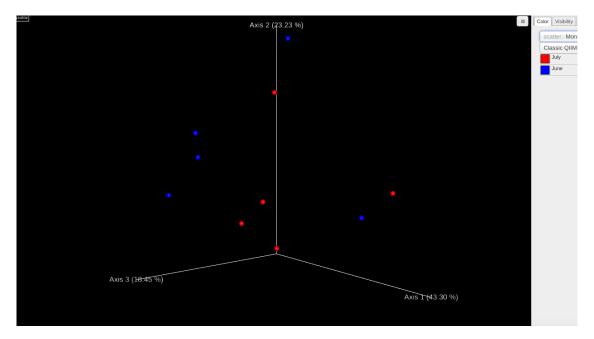


Figure 5: PCoA months

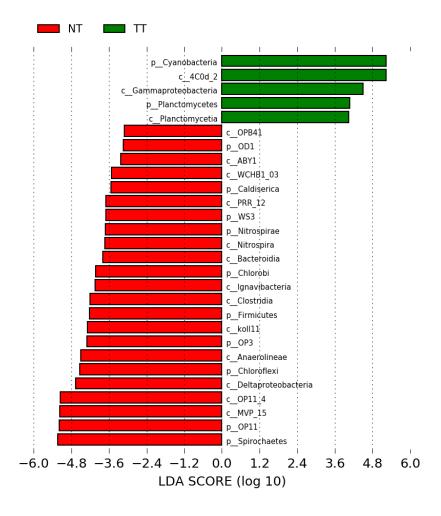


Figure 6: LDA treated/not treated

```
CCACGCCCCTTTACGCCCCGTCCTTTCC
+SRR3593621.1 1 length=300
88@--;<C@,C,-6;,6,<C@E@C,+,8,,,;;,B@C,,65;,4>,,@A?,5,6;,;,C6,,,,,,6,,,,6,,8;,,8,,,4,:,5,,94,,
  ,,99,,,,,9,4,,,,,,5+,3>9+934459526389+,923<9*0*09;@**3*26*++6*6++20+*))++**4)10008*03><sub>1</sub>
   *0*+0*3:;+:9):)**320**3*))*3;;*205:;=D*80)1*)**+*001010:8;87**3*;018>5))>@E):7A*19/))*)-/-
  -)-5(-(((((()))((((.(((,//./)
==> SRR3593622_1.fastq <==
@SRR3593622.1 1 length=300
{\tt TACGAAGGGGGCTAGCGTTGTTCGGATTTACTGGGCGTAAAGCGCACGTAGGCGGTTTTTTAAGTCAGGGGTGAAATCCCAAGGCTCAACCTT}_{1}
   GGAACTGCCTTTGATACTGGAAGTCTCGAGTCCGGGAGAGGTGAGTGGAATTGCTAGTGTAGAGGTGAAATTCGTAGATATTCGCAAGA
   {\tt ACACCAGTGGCGAAGGCGGCTCACTGGCCCGGTACTGACGCTGAGGTGCGAAAGCGTGGGGAGCAAACAGGATTAGATACCCTGGTAGT}
   CCACGCCGTAAACTATGGATGCTAGCCGT
+SRR3593622.1 1 length=300
CCCC@FFGGGGGGGGGGGGGGGGGGGFFCFFFGECFFGGGFG:+8@EFFG@FF+>BDDEE<EFC,C,,@FEGFGEE?=,,:?DFAFFGEEE
   9<,,4A?=<EFD<,A<?F9,,,::AF;?<7DF?>F+8@==FF7,,9=+F,,:,@,,8@FDFE9=:D*>D,@3=CDGGDFFGFAD>>7CC
   ,>,>FE,C<7<=E=@EDB75>5+2A8+*8*/*211:48CE1:*775C)4>?>>B73;@DB66>>*;D5(<<07@?F66<CF86*546<A |
   AB6<BF?0>?::<<2<62).,3994(,,4
==> SRR3593622_2.fastq <==
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TACGGCGTTGACTACCACGCTATCTAATCCTCTTTTCTCCCCACGCTTTCGCACCTCAGCGTCAGTACCTTGCCAGTGTGCCGCCTTCG
   \texttt{CCACTGTTGTTCTCCCGACTCTTACGCCTTTCACCTCTCCACTCCCAGTTCCACTCTCCCCTACTCGAGACTTCCATTTTCAA \ | \ |
   AGGCAGTTCCAAGTTTTCGCCTTGGCATT
+SRR3593622.1 1 length=300
_{\rightarrow} 0,54+>68+++B;,4A,,++8+<>;,+53?;,5>0,24;+;08>+3=0=0+0*0)1A)*389**)53+4*+/)0+***,*14)-55-7(_{\parallel}
  -624.))/.;17/)),(,(((/6)676((/,=2)63,4<(,-343(.))5<6))66:).2(-.:(33,,(-.-1(((..4<A)))))))
  ))((((,.4))),).))),-3,()((,).
==> SRR3593623_1.fastq <==
@SRR3593623.1 1 length=300
A CACCAGTGGCGAAGGCGGCTCACTGGACTGTTATTGACGCTGCGGTGCGAAAGCTTGGGGAGCAACCAGGATTAGATACCCTGGTAGT\\
   CCACGCCGTAACCGATGATAACTAGCTGT
+SRR3593623.1 1 length=300
C@CCCGGGGGGGGGGGGGGGDFFG7@;,CE<;FC<8C@C@,CFC77+8@C:E@6@:+8=C,C,,<CC,,,,6C,,CE,,:C,,,:@E=C,CC==
  ,9,,<<,,?EFA,,,<:F,,,:A,9E@,,5A@,,5,++,8:A+,,98+A,CB>=,,9CA@==,,8@+,,,@=D+@A?6@,ECC,,++53 [
   ,:,@F*4@3,;55*>*9>):::,4B8,*22/+314<11<*(6*)/):)421*72:*15)3(413*0*)(0(,8=>?2.0<<<?*/...4_|
   90*8(4,(42:549(3,).)).6).(46:
==> SRR3593623_2.fastq <==
@SRR3593623.1 1 length=300
```

```
\tt TTTCCCCCTTTACTTCCCCCTTATCTTCTCCCCCCCTCTTTCGCTCCTCTTCATTTCCTCTCCCGTTATCCTCCTCTC
   GCCTCTCTTCTTCTCCGAATATCTACCTATTTCACCTCTACCCCGGTAATTCCACTCTCCTCCTCCCGCCTTCAAGCTCTGCACTCTTA
   CATGCACTTCTGCATTTCAGCCCCATCCT
+SRR3593623.1 1 length=300
8@6--6CFC;E++7@+C6BF@EEEB,,98+++,,;EE,,;,66>B,,EF<@+,6,8+++,,,5C<,,,,,69,,,,:,,,4,,99,99,4,,9
   ?@,9,,,+4,,,4,,9A,,++,*,)9+*4<,4,9?;++0+368++*03=<+*0+380)*+)+42*+4+20+*5:7+*3,))10**359* |
   15>*10)**+*1*2//*)))))*2/*/****10*/00075*9*/((,0((//)6)743)),.6631((((-()))))))-)))(.(-5-
   )))),)-4))-))))..)))-(-((((((,
==> SRR3593625_1.fastq <==
@SRR3593625.1 1 length=300
{	t TACGTAGGGTCCAAGCGTTAATCGGAATTACTGGGCGTACAGCGTTCGCAGGCGGTTTTTCAAGTCCGATGTGAAATCCCCTTGCTTAACTTT
   GGTATTGCTTTTGTTACTGCTCGTCTTGAGTTTGTCAGAGGTGGCTAGAATTCCTCGTGTAGCAGTGAAATGCGTAGTGATGTGGTGGA
   ATACCGTTGGCGAAGGCAGCCCCTGGGATAACACTGACGCTCATGCACGAAAGCTTGGGGAGCAACCAGGTTTAGTTACCCTGGTAGT
   CCTCGCCCTAAACGATGTCAACTAGTTGT
+SRR3593625.1 1 length=300
BBCCCGGGGGFGFGGGGGGG>,<FDGC7DAC6ECEFC@F@+@FCC@,88+88@+86@@,9,,,69,:66+88E,,69<C666,,:@F<:,CCC,
   ,,,,9<55,9A,,:,55C,,,9++6A+,,,C,:,B,4,,:+,++,8,,C,C?4@,7@F:@=,7,7C8,5,@,@+6=C+,,7,7,6,+3+
   6=*639((4.,+5((2(.))).62)64)6
==> SRR3593625_2.fastq <==
@SRR3593625.1 1 length=300
\mathsf{TTTGGCGTTGACTACCCCTCTCTATTCCTCTTTTCTCCCCACTCTTTCGTCCATGACCGTCACTTTTATCCCACCTCGCTCCCTTCT
   {\tt CCATCTGTATTCCTCCTCATCTCTACGCCTTTCTCTGCTACACCTCGTATTCTACCCCCCTCTGCCCCCCTCTACCCCTTCTGTCTCCA
   ATTCAACTCCCTAGTTATCCTCCTCGCTT
+SRR3593625.1 1 length=300
8B<--6CDDCE@+7@+B6BF@E@C,,,68+86,,CFFF,6,84>C,4EF,C496,@6,,,,,,66,,,66?:++7,,89,,59,,5,4,,59
_{\rightarrow} C,,++,48+++:9,,9,+++9,543,+2,47,5>?,33;+90,=+5=+?++3*1)2+**6):9+)6+62*+303++**,)0*)1))1)*
   :6*1:**3*2;****-)76/8AE76;)/(0(4**1**0088*5(-(()((./.)173(.3(63)))(,((,-,))6((,(()).))--)_{1})
   (-))))),()(.)))-.).,((((,(
==> SRR3593627_1.fastq <==
@SRR3593627.1 1 length=300
GATACTGCTCTTAATACTGTCAGACTCGAGTGTGGTAGAGGCTAGTGGAATTCCCAGTGTAGCGGTGAATTGCGTAGTTATTGGGATGA
   {\tt TCACCGGTGGCGTAGGCGACTTCCTGGGCCATTACTGACACTGAGGAACGCAAAGCCAGGGGGAGCGAATGGGATTAGATACCCCTGTAGT
   CCTGGCCGTAAACGTTGTCTACTAGTCGT
+SRR3593627.1 1 length=300
CCCCCGGGDGGGFGFFGGGDCCFEG@@FE<CFECEC@F+,6C,;<CC@B,CCCCBCC,:C9,EE9C<,:CFE,CC,,:9,,,@CG<CCFC== |
  ,,,,6<,6,,<,,,,<<5C,,5,,,9A,4,+C+<57A;,,,=+4,,9,,C,CA>>5,,8,C@=;>:C775,@==7@6C+@,@=,,3,,6,
   ,:,:>8+@<+;@3**5***4;*,4=;,*/4*4,,,9+14<0>**2**055@752(0);.((2(3=*/).92(4??2.62<<0)*1.).6<sub>|</sub>
  5=0).3<(4(-/66(41,).).6).))-4
==> SRR3593627_2.fastq <==
@SRR3593627.1 1 length=300
```

```
TTCAACCTTGCGCCCGTACTACTCAGGCGGGATACTTATCGCGTTAGCTGCGTCACATCACTGTTCGATACCCCATACGCCTAGTATCCATCG
   \tt TTTACCGCCAGCACTACTGCGGTATCTAATCCCTTTCGCTCCCCTCGCTTTCGTTCCTCCGTGTCAGTTATGCCCCAGCTCCTCGCCTA
   CAGTTCAGTTTCAGGTTTGACCCCCAATC
+SRR3593627.1 1 length=300
@C@8-;CFFFFC+6@:F@FGAF9E?66C@+++8,BFGC@698BEE7AEE,C+,6,8,9C,,,,,95,,6,86C,,4,:,,8?,,:,594,9,+
   :A<+A,++6+++,94,A,,,++3+3>3+,47=5,:=+0::DBDC8*+*=9900418ACB+0:*40++51*+**3;?**10)*00)-7>(_|
   7256(-50)+*109/96;3((6(1?557(,(247C37;22(49).)))(((..:<)44().44:72:)(((-,((((.64-5)((-(.)
   6)-.)6))..--))).,-(-).3,,((.(
==> SRR3593628_1.fastq <==
@SRR3593628.1 1 length=300
GAAACTGCTCTTAATACTGTCTGACTCGAGTGTGGTAGAGGCTATTGGATTTCCCAGTGTAGCGGTGAAATGCGTAGTTATTGGGAAGA
   \mathsf{TCACCGGTGGCGTAGGCGACTTCCTGGGCCTTTACTGACACTGAGGAACGAAAGCCTGGGGAGCGAATCGGATTAGATACCCCTGTAGT
   CCTGGCCTTACACGTTGGCTACTAGTCGT
+SRR3593628.1 1 length=300
-CCCCGGGFGGGGGGGGGSBCFCC,6CE;<FEFC@6C6,CC,888668,:CC,CBCC,:@,,CC9C,,:CFF66,,,<9,,,8@F5:,C9,6
   ,,,,,9,5,,<,,,955C,,9,,,4:44,+:+<,+9,,,98+4,,9,,9,:A4=7,7A:C0,;++B++,,09=36+0+0,0=,,,,,+0 [
   ,,,:>++@339@3*5*9**11*,3=,,**/*4,519+4<,0>*9***)/6(1)438).)2(1(:**9.(0(-8@28)6+3<+.**.6).<sub>|</sub>
   6=/...36)4, < .8(4(((341:)5))(4
==> SRR3593628_2.fastq <==
@SRR3593628.1 1 length=300
{\tt TTCAACCTTGCGCCCGTACTACTCAGGCGGGATACTTATCGCGTTAGCTTCGCCACTTCACTTGTCTATACCCGATACCCCTAGTATCCATCG}
   TTTACCGCCAGGACTACTGCGGTATCTACTCCCTTTCGCTCCCCTGTCTTTCGTTCCTCAGTGTCAGTTATCGCCCAGCTACTCGCCTT
   \tt CCCCACCTTTGTTCTTCCCTATATCTACGCATTTCACCTCTACCCTGGGAATTCCACTTCCCTCTTCCACACTCGAGTCTGCCAGTTTC \\ | |
   CCGTGCACTTTCAGGTTTCACCCCCACTC
+SRR3593628.1 1 length=300
AC---;CFFFFC+6@@FCEG,C,B9;66@:++8,BFFDA;9@CEG?6ED,C+,646,6:,,,,,:5,,9,<<6++68>,9:A,,:,5@=,9,+
  :A<+9,448++++99,85,,++34:><+,47@,,:@3*::FEFEC*+5=CD;5681AEA+0<+5;++53*;*)8;C**4)**00)/7<)
   :)09)(/()4*17CC?5>=*.0*9@C6701(.,9C))7.2)76)/)((((//7?))))-44?2)65>4(4<?:((.4).53)).)-)_{1}
   .)-((,().,-.)))).)).((-((,,
==> SRR3593631_1.fastq <==
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GGTACTGCCCTTGATACTGTCTATCTTGATTCTTGTAGTGGCGATTGGAATTCCTAGTGTAGAGGTGAAATTCGTAGTTATTCGGAAGA
   {\tt TCACCAGTGGCGAAGGCGACTCCTTGGACCTGTCTTGCCGCTGAGGTTCGACAGCTTTGGGGAGCCACCCGGTTTAGTTACCCTGTTAGT}
   CCTCGCCGTACACGTTGTTACCTATCTTT
+SRR3593631.1 1 length=300
B@CCC@FGD7CFEFGFGGG>C@F@B@,CCC6EC@C@8C+,,CC@6+77@68@,+8+8=CCE,,:CC,,,,9C,9,<95,4,,,4@E=,:F44+
  ++++4<,5,,:=,,,,5C,,,,,,8C,,,,,<7@@,,,7,,,++++83,3,:>=@,,3C,@3,,,5@+,8,7>;35;@+7,@<=,,***, |
   ,3,8>,,67,34***/8*)*4*+2;:**.***5+49+/0*(4))/*2)4(.*.,1)1)04(-(3*+0.(04(45.:).+3<+1**.5).
   <?*.,22(-4(*64(4((.))-.).).)6
==> SRR3593631_2.fastq <==
@SRR3593631.1 1 length=300
```

```
{\tt TTTACTCTTGCGACCGTACTCCCCCGGCGGTTCACTTATTGCGTTAGCTTCGCCCACCCCCCTTCTTTCCACCCCCGCCCCCCTTTTTATCCTCTT
   ACCTCCCTTCCCGCTTTTCCCCCCCTCTCT
+SRR3593631.1 1 length=300
@B@--6CEDCE@+6@+B,BF@F@E+++77++6,,:FF,,6966>C7,EE,9+,6,@6=+++449C,5,,,59=+++7+++4,,95,59,7,,7
   8?,0,,,+4,,,37,9=,,+++*,),++3573,7::+2049>C,0*+033+*0*11*)**0*3+*+4+4/2*1:2**)*((+1*05.>* [
   ((5)3,(()+/.(...)()(/))).)/(((,0..))4((,).).).()((,.).(.(,(-,(-,((((((.))))-,-,,,(((-.)))-(...)))))))
   ))((.(,(..((((,-())))32(((((,
==> SRR3593632_1.fastq <==
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{\tt TACGTAGGATGCAAGCGTTGTCCGGATTTATTGGGCGTAAAGAGTTCGTAGGTGGTTTGTTAAGTTTGGTGTTAAAGATTGGGGCTCAACCCT}_{1}
   GATACTGCACTGAATACTGCCAGAGTCTCGAGTGTGGTAGAGGCTAGTGGAATTCCCAGTGTAGCGGTGAAATGCGTAGATATTGGGAAGA
   {\tt ACACCGGTGGCGTAGGCGACTAGCTGGGCCATAACTGACACTGAGGAACGAAAGCCAGGGGAGCGAATGGGATTAGATACCCCAGTAGT}
   CCTGGCCGTAAACGATGGATACTAGGCGT
+SRR3593632.1 1 length=300
-ACCCFGGFFFGGGFFEFGGGGGGFEGEFCFGGGGGGGGFFCGEE@FCCFGEGGFED,CECCFG<CFCFGGGGGGGF,6C6,CCEG<CFG<8C
   <?,,6C@9,,C,:,?C,FE,,4?,9A=D<FF+BFFFGGG:9=,CFFG9FE=>5,EFGEEEDFGGGFF,@,=E@CE+@=DA,BEE,AF |
   ,@@FGG6EEEDE:@FEG8C9;*,0BFF*04*=,>8C@BF60509FC*):??EFFF)08>?66(./:>5:FF??FFF2AGDC8585>44:
   <FFB:::2906CA:6<8?(.6:AA2029<
==> SRR3593632_2.fastq <==
@SRR3593632.1 1 length=300
\tt TTCAACCTTGCGGCCGTACTTCTCAGGCGGTATACTTATTGCGTTAGCTGCGCCACTCCACCTTTCGATCCCCCACACCCCTTGTTCCCATCT
   \tt CGCCTCCTGTTTTCCTCCCTCTATCTCCGTTTTTCCCCTCTACCCGGTGATTTCCTCTCCCCTCTCCCACACTCGATTCTGCCATTTTA
   CAGTCCTTTTTCGTTGTTCACCCCCCATC
+SRR3593632.1 1 length=300
AC6A-,=CDFFF+7F:CFGG,E,CFC<68@++6,CFF@6,;,>BE7@EF,67+,+8,,:,,,,6,,,,,96+++,6,4+,,,5,,4,,44,
  <A,9:,+++++++8+49,,,+83+8>2+,+38++8@=*1*;==A8*+*6*3304)1;C=+)5*3)++5+*3)*3*?45,))*))-(-)
   1((/((,()2)1()).)/()(/)16.5)(()0((()/8(-().)((()(().--6).-((,((-3(,,41((81(.()))))).))--)_1)
   ..4.).))).).-.((-(--.-4(((4,...
==> SRR3593664_1.fastq <==
@SRR3593664.1 1 length=300
{\tt TACGTAGGATGCAAGCGTTGTCCGGATTTATTGGGCGTAAAGCGTTCGTAGGTGGTTTTTTAAGTTTTGGTGTTAAATCTTCCGGCTCCACCCT}
   GATACTGCTCTTAATACTGTCAGACTCGAGTGTGGTAGAGGCTATTGGATTTCCCAGTGTAGCGGTGAATTGCGTAGTTTTTTGGATTA
   {\tt TCCCCGTTGGCGTAGGCGACTTTCTGGTCCTTTACTGACACTGAGGAACGAAAGCCTGGGTAGCGAATCGGATTAGTTCCCCCTTTAGT
   CCTGGCCGTACACGATGGTTCCTAGTCGT
+SRR3593664.1 1 length=300
CCCCCGGG?FFGCGGGGGGG7C@FCF86CC,<ECCEC@F@,,C,88686@,::;,98C@,9@,,:<6@,,::EF<@9,,99,,,8@F4,6C94=
   ,,,,5<,9,,<,,,9<9C,,5,,,9A4+,+C+<,+995,,,+,,,9,,5;:A447,,8,8@,4++@++5,@,@3@+@+@,@=+++,,4> [
   606)(36(-3(*.4(3-()-),...))-.4
==> SRR3593664_2.fastq <==
@SRR3593664.1 1 length=300
```

```
TTCAACCTTGCGCCCGTACTACTCAGGCGGTATACTTATCGCGTTAGCTTCGCCACTTCCCCCTTCTATACCCCCATACCCCTTGTATCCTTCT
      \tt CGCCTCCTGTTTTATTCCCAATATCTTCGCTTTTCCCCGCTACACTTGGTTTTCCTCTCGCCTCTACCACCCTCGATTCTCCCATTTTC \mid
\hookrightarrow CAGTGCAGTTTCAGTTTTTCTCCCCCCTT
+SRR3593664.1 1 length=300
@B6--6CFECEF+,@+@+BF9F,EF;6C8+++:5EFG<@,:6@CE76ED,C+,6,?,,:,,,++64,,6,669,,6,9,,:?,,:,,44,9,,<sub>|</sub>
      <:9,A,,+4++,,94,9,,,++3+3>++,444,,9=338:?C=C8*+*60=0*151@DD+)5+60++21*2**5=D**+))*03*308* [
     :)85))/))5*10/1/*/7*(7)98**1/((055@*.5(4..2)6.)+))(,/)7))1((,4,4()6)).(--((((.)))..()-).)
      ))...6)))--))))-))(,)66,((-,(
==> SRR3593665_1.fastq <==
@SRR3593665.1 1 length=300
{\tt ACACCAGTGGCGAAGGCGGCTCACTGGACTGGTATTGACGCTGAGGTGCGAAAGCGTGGGGAGCAAACAGGATTAGATACCCTGGTAGT}
      CCACGCCGTAAACGATGATAACTAGCTGT
+SRR3593665.1 1 length=300
CCCCCGGGGGGGGGGGGGGGGGGGGFFFEGGGGFFFGEF@@@@FFGGCCG7CCC,C<<FFF,C9,CFFGEF9CAE,,=FFGCFFGDFD
      8=,,<?=AAEFE9,,C?F@@9EE+@FD@8=FD?EF,+?<FFF798CDFGFFGFF,+8@@EFC9EGFC:8,ECF@DFG>DFGGEDC85;D
      7@ > FC > 5DFGGGGDDGF5CCED + ; CFC * 2 = 55 > ; = CFCGE1?DBF : D3?B : 5 < 9?) \\ 8 > BO < > ; CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 3 < 8F6D84 < < | CC > ; 6F? < BF7 > 95 + 
      >F4>?9:69??:6?9:365)6<A<7(64<
==> SRR3593665_2.fastq <==
@SRR3593665.1 1 length=300
TTTAATCTTGCGACCGTACTCCCCAGGCGGATAACTTAATGCGTTAGCTTCGCCACCAAAGTTCTGTGAACCCTGACAGCTAGTTATCATCGT
      {\tt TTTCGGCGTGGACTACCAGGGTATCTTATCCTGTTTGCTCCCCACGCTTTCGCACCCCAGCGTCAATACCAGTTCAGTTATCCGCCTTC}
      \rightarrow AAGGCAATTCTGGATTTTAGCTCCATGCT
+SRR3593665.1 1 length=300
CCCC-CFFFFFGC@CCFFGGDFEEEFDCCC7@,5FFG<,<E<EEGFEGF,C@78,?8<,,,9AEE,<9,,:C?,4,:,,95,,CA,:@,@;,A
ED,9++4+8+++4,,AB,,+?439:C++7===,@EE?79??@EF8*60@F+*:+15*)*+05::)+;+3)+)3:?7*?,;*4;5):=<3
     49A*:.)*/*18**976(---/*/*5@((((27796@3273>)67@3)(233)9)7(/(462,),46.(())<<)))((-(-))..642

        <!> → ()),((.)...)).)4))(.).4().()

SRR3593621_1.fastq:52945
SRR3593621_2.fastq:52945
SRR3593622_1.fastq:62218
SRR3593622_2.fastq:62218
SRR3593623_1.fastq:92740
SRR3593623_2.fastq:92740
SRR3593625_1.fastq:70366
SRR3593625_2.fastq:70366
SRR3593627_1.fastq:100615
SRR3593627_2.fastq:100615
SRR3593628_1.fastq:78495
SRR3593628_2.fastq:78495
SRR3593631_1.fastq:97332
SRR3593631_2.fastq:97332
SRR3593632_1.fastq:84361
SRR3593632_2.fastq:84361
SRR3593664_1.fastq:101827
SRR3593664_2.fastq:101827
```

```
SRR3593665_1.fastq:84850
SRR3593665_2.fastq:84850
```

Imported samplemanifest as PairedEndFastqManifestPhred33 to paired-end-demux.qza

# Script 1.2.4 (bash)

#### Output

Saved Visualization to: paired-end-demux.qzv

#### 1.2.2 Determination of ASV using Deblur

### Sample pre-processing

```
Script 1.2.5 (bash)
```

```
--o-joined-sequences joined-reads.qza
qiime demux summarize --i-data joined-reads.qza --o-visualization joined-reads.qzv

# Filtering of the readings according to their quality.
qiime quality-filter q-score-joined --i-demux joined-reads.qza \
--o-filter-stats filt_stats.qza \
--o-filtered-sequences joined-filt-reads.qza

qiime demux summarize --i-data joined-filt-reads.qza --o-visualization joined-filt-reads.qzv

EOT
```

```
Saved SampleData[JoinedSequencesWithQuality] to: joined-reads.qza
Saved Visualization to: joined-reads.qzv
Saved SampleData[JoinedSequencesWithQuality] to: joined-filt-reads.qza
Saved QualityFilterStats to: filt_stats.qza
Saved Visualization to: joined-filt-reads.qzv
```

#### **Determination of ASV/features**

```
Script 1 2 6 (bach)
```

```
1 %%bash
ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"</pre>
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
4 source activate qiime2-2018.11
5 cd Documentos/Tema_2
7 rm -rf deblur_output
  qiime deblur denoise-16S --i-demultiplexed-seqs joined-filt-reads.qza \
                            --p-trim-length 372 \
10
                            --p-sample-stats \
                            --p-jobs-to-start 2 \
11
12
                            --p-min-reads 1 \
                            --output-dir deblur_output
13
14
  qiime feature-table summarize --i-table deblur_output/table.qza --o-visualization
   → deblur_output/deblur_table_summary.qzv
17
18 EOT
```

#### Output

```
Saved FeatureTable[Frequency] to: deblur_output/table.qza
Saved FeatureData[Sequence] to: deblur_output/representative_sequences.qza
Saved DeblurStats to: deblur_output/stats.qza
Saved Visualization to: deblur_output/deblur_table_summary.qzv
```

```
1 %%bash
ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"</pre>
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
  source activate qiime2-2018.11
5 cd Documentos/Tema_2
  # Exclude sOTUS that have a frequency below 0.1% of the mean depth.
  # This threshold would exclude those sOTUs that are due to Illumina sequencing errors (0.1%
   \leftrightarrow of total reads).
qiime feature-table filter-features --i-table deblur_output/table.qza \
11
                                        --p-min-frequency 30 \
                                        --p-min-samples 1 \
12
                                        --o-filtered-table deblur_output/deblur_table_filt.qza
13
14
  # Exclude low frequency sOTUS
16 qiime feature-table filter-seqs --i-data deblur_output/representative_sequences.qza \
                                    --i-table deblur_output/deblur_table_filt.qza \
17
                                    --o-filtered-data deblur_output/rep_seqs_filt.qza
18
19
20
21 # Summarize
qiime feature-table summarize --i-table deblur_output/deblur_table_filt.qza
   → --o-visualization deblur_output/deblur_table_filt_summary.qzv
23
24 EOT
```

```
Saved FeatureTable[Frequency] to: deblur_output/deblur_table_filt.qza
Saved FeatureData[Sequence] to: deblur_output/rep_seqs_filt.qza
Saved Visualization to: deblur_output/deblur_table_filt_summary.qzv
```

#### 1.2.3 Phylogenetic distances determination using FastTree

```
Script 1.2.8 (bash)

1 %%bash
2 ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
4 source activate qiime2-2018.11
5 cd Documentos/Tema_2
6 rm -rf tree_out
7 mkdir tree_out
8 #Sequence alignment
9 qiime alignment mafft --i-sequences deblur_output/rep_seqs_filt.qza \
--p-n-threads 3 \
11 --o-alignment tree_out/rep_seqs_filt_aligned.qza
```

```
12
   #Mask hypervariable regions
13
   qiime alignment mask --i-alignment tree_out/rep_seqs_filt_aligned.qza \
                         --o-masked-alignment tree_out/rep_seqs_filt_aligned_masked.qza
15
16
   #Calculate phylogenie
17
18
   qiime phylogeny fasttree --i-alignment tree_out/rep_seqs_filt_aligned_masked.qza \
19
                             --p-n-threads 2 \
20
                             --o-tree tree_out/rep_seqs_filt_aligned_masked_tree
21
22
   #Root the tree
23
24
25
   qiime phylogeny midpoint-root --i-tree tree_out/rep_seqs_filt_aligned_masked_tree.qza \
                                  --o-rooted-tree
26

→ tree_out/rep_seqs_filt_aligned_masked_tree_rooted.qza

27
  EOT
28
```

```
Saved FeatureData[AlignedSequence] to: tree_out/rep_seqs_filt_aligned.qza
Saved FeatureData[AlignedSequence] to: tree_out/rep_seqs_filt_aligned_masked.qza
Saved Phylogeny[Unrooted] to: tree_out/rep_seqs_filt_aligned_masked_tree.qza
Saved Phylogeny[Rooted] to: tree_out/rep_seqs_filt_aligned_masked_tree_rooted.qza
```

#### 1.2.4 Taxonomic assignment

#### Assignment database training

```
1 %%bash
ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"</pre>
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
  source activate qiime2-2018.11
5 cd Documentos/Tema_2
  #Import reference sequences
8 qiime tools import \
    --type 'FeatureData[Sequence]' \
    --input-path 85_otus.fasta \
10
    --output-path 85_otus.qza
11
12
13 #Import reference taxonomy
14 qiime tools import \
    --type 'FeatureData[Taxonomy]' \
15
    --input-format HeaderlessTSVTaxonomyFormat \
16
17
    --input-path 85_otu_taxonomy.txt \
18
    --output-path ref-taxonomy.qza
```

```
19
20 EOT
```

Imported 85\_otus.fasta as DNASequencesDirectoryFormat to 85\_otus.qza
Imported 85\_otu\_taxonomy.txt as HeaderlessTSVTaxonomyFormat to ref-taxonomy.qza

```
1 %%bash
ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"</pre>
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
4 source activate qiime2-2018.11
5 cd Documentos/Tema_2
7 #Trim reference sequences to the region intra-primers according to primers.txt
g qiime feature-classifier extract-reads \
    --i-sequences 85_otus.qza \
    --p-f-primer GTGCCAGCMGCCGCGGTAA \
10
    --p-r-primer CCGTCAATTCMTTTRAGTTT \
11
    --p-min-length 100 \
13
    --p-max-length 400 \
    --o-reads ref-seqs.qza
14
15
16 #Generate classifier naive-bayes
giime feature-classifier fit-classifier-naive-bayes
18
    --i-reference-reads ref-seqs.qza \
19
    --i-reference-taxonomy ref-taxonomy.qza \
    --o-classifier classifier.qza
21
22 EOT
```

#### Output

```
Saved FeatureData[Sequence] to: ref-seqs.qza
Saved TaxonomicClassifier to: classifier.qza
```

#### Taxonomic assignment of representative sequences

```
Script 1.2.11 (bash)

1 %%bash
2 ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
4 source activate qiime2-2018.11
5 cd Documentos/Tema_2

6
7 rm -rf taxa
```

```
#Taxonomic assignment of the representative sequences of each sOTU
qiime feature-classifier classify-sklearn --i-reads deblur_output/rep_seqs_filt.qza \
--i-classifier classifier.qza \
--p-n-jobs 2 \
--output-dir taxa

#Export to tabular file
qiime tools export --input-path taxa/classification.qza --output-path taxa

#Obtain interactive graph to visualize the abundance in each sOTU per sample
qiime taxa barplot --i-table deblur_output/deblur_table_filt.qza \
--i-taxonomy taxa/classification.qza \
--m-metadata-file metadata.txt \
--o-visualization taxa/taxa_barplot.qzv

EOT
```

```
Saved FeatureData[Taxonomy] to: taxa/classification.qza
Exported taxa/classification.qza as TSVTaxonomyDirectoryFormat to directory taxa
Saved Visualization to: taxa/taxa_barplot.qzv
```

#### 1.2.5 Diversity analysis

#### Alpha diversity

```
1 %%bash
ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"</pre>
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
4 source activate qiime2-2018.11
5 cd Documentos/Tema_2
7 # Obtain rarefaction curves with max-depht = num of reads of the richest sample
  qiime diversity alpha-rarefaction --i-table deblur_output/deblur_table_filt.qza \
                                      --p-max-depth 41934 \
10
                                      --p-steps 20 \
                                      --i-phylogeny
11

    tree_out/rep_seqs_filt_aligned_masked_tree_rooted.qza \

12
                                      --m-metadata-file metadata.txt \
                                      --o-visualization rarefaction_curves.qzv
13
14
15 EOT
```

### Output

```
Saved Visualization to: rarefaction_curves.qzv
```

#### Beta diversity

```
Script 1.2.13 (bash)
1 %%bash
ssh microbioinf@192.168.56.101 /bin/bash <<"EOT"</pre>
3 export PATH=$PATH:/home/microbioinf/miniconda3/bin
4 source activate giime2-2018.11
5 cd Documentos/Tema_2
6 rm -rf diversity
7 # Obtain metrics curves with sampling-depth 19845 = num of reads of the poorest sample
8 qiime diversity core-metrics-phylogenetic --i-table deblur_output/deblur_table_filt.qza \
                                                --i-phylogeny tree_out/rep_seqs_filt_aligned_maske_
                                                \rightarrow d_tree_rooted.qza
                                                → \
                                               --p-sampling-depth 15296 \
10
                                               --m-metadata-file metadata.txt \
11
                                               --p-n-jobs 2 \setminus
12
13
                                               --output-dir diversity
14
15 EOT
```

### Output

```
Saved FeatureTable[Frequency] to: diversity/rarefied_table.qza
Saved SampleData[AlphaDiversity] % Properties(['phylogenetic']) to:

→ diversity/faith_pd_vector.qza

Saved SampleData[AlphaDiversity] to: diversity/observed_otus_vector.qza
Saved SampleData[AlphaDiversity] to: diversity/shannon_vector.qza
Saved SampleData[AlphaDiversity] to: diversity/evenness_vector.qza
Saved DistanceMatrix % Properties(['phylogenetic']) to:

→ diversity/unweighted_unifrac_distance_matrix.qza

Saved DistanceMatrix % Properties(['phylogenetic']) to:

→ diversity/weighted_unifrac_distance_matrix.qza

Saved DistanceMatrix to: diversity/jaccard_distance_matrix.qza
Saved DistanceMatrix to: diversity/bray_curtis_distance_matrix.qza
Saved PCoAResults to: diversity/unweighted_unifrac_pcoa_results.qza
Saved PCoAResults to: diversity/weighted_unifrac_pcoa_results.qza
Saved PCoAResults to: diversity/jaccard_pcoa_results.qza
Saved PCoAResults to: diversity/bray_curtis_pcoa_results.qza
Saved Visualization to: diversity/unweighted_unifrac_emperor.qzv
Saved Visualization to: diversity/weighted_unifrac_emperor.qzv
Saved Visualization to: diversity/jaccard_emperor.qzv
Saved Visualization to: diversity/bray_curtis_emperor.qzv
```

#### Script 1.2.14 (bash)

```
6 qiime taxa collapse --i-table deblur_output/deblur_table_filt.qza \
                       --o-collapsed-table deblur_output/L3_collapse_table.qza \
                       --p-level 3 \
8
                       --i-taxonomy taxa/classification.qza
9
10
  qiime tools export --input-path deblur_output/L3_collapse_table.qza \
11
                      --output-path lefse_table/
12
13
biom convert -i lefse_table/feature-table.biom \
                -o lefse_table/feature-table.txt \
15
                --header-key "taxonomy" --to-tsv
16
17
18 EOT
```

Saved FeatureTable[Frequency] to: deblur\_output/L3\_collapse\_table.qza Exported deblur\_output/L3\_collapse\_table.qza as BIOMV210DirFmt to directory lefse\_table/