

ENV 790.30 - Time Series Analysis for Energy Data | Spring 2021

Assignment 2 - Due date 01/26/22

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Submission Instructions

You should open the .rmd file corresponding to this assignment on RStudio. The file is available on our class repository on Github.

Once you have the file open on your local machine the first thing you will do is change “Student Name” on line 4 with your name. Then you will start working through the assignment by **creating code and output** that answer each question. Be sure to use this assignment document. Your report should contain the answer to each question and any plots/tables you obtained (when applicable).

When you have completed the assignment, **Knit** the text and code into a single PDF file. Rename the pdf file such that it includes your first and last name (e.g., “LuanaLima_TSA_A02_Sp22.Rmd”). Submit this pdf using Sakai.

R packages

R packages needed for this assignment: “forecast”, “tseries”, and “dplyr”. Install these packages, if you haven’t done yet. Do not forget to load them before running your script, since they are NOT default packages.\

Data set information

Consider the data provided in the spreadsheet “Table_10.1_Renewable_Energy_Production_and_Consumption_by_Source” on our **Data** folder. The data comes from the US Energy Information and Administration and corresponds to the January 2022 Monthly Energy Review. The spreadsheet is ready to be used. Use the command *read.table()* to import the data in R or *panda.read_excel()* in Python (note that you will need to import pandas package). }

```
#Importing data set
energy_data <- read_xlsx(path="./Data/Table_10.1_Renewable_Energy_Production_and_Consumption_by_Source..
```

Question 1

You will work only with the following columns: Total Biomass Energy Production, Total Renewable Energy Production, Hydroelectric Power Consumption. Create a data frame structure with these three time series only. Use the command head() to verify your data.

```
energy_data <- energy_data[-c(1),4:6]
head(energy_data)
```

```
## # A tibble: 6 x 3
##   'Total Biomass Energy Production' 'Total Renewable Ener~ 'Hydroelectric Power~
##   <chr>                            <chr>                            <chr>
## 1 129.787                        403.981                        272.703
## 2 117.338                        360.9                          242.199
## 3 129.938                        400.161                        268.81
## 4 125.636                        380.47                         253.185
## 5 129.834                        392.141                        260.77
## 6 125.611                        377.232                        249.859
```

Question 2

Transform your data frame in a time series object and specify the starting point and frequency of the time series using the function `ts()`.

```
ts_energy_data <- ts(energy_data[,1:3])
ts_energy_data
```

```
## Time Series:
## Start = 1
## End = 585
## Frequency = 1
##   Total Biomass Energy Production Total Renewable Energy Production
##   1                               23                               73
##   2                               2                               38
##   3                               27                               68
##   4                               9                               52
##   5                               25                               57
##   6                               8                               47
##   7                               23                               39
##   8                               26                               33
##   9                               11                               20
##  10                               28                               21
##  11                               10                               26
##  12                               24                               76
##  13                               35                               121
##  14                               3                               66
##  15                               31                               97
##  16                               13                               94
##  17                               34                               106
##  18                               14                               81
##  19                               32                               82
##  20                               33                               54
##  21                               15                               34
##  22                               30                               29
##  23                               12                               32
##  24                               29                               46
##  25                               17                               59
##  26                               1                               41
##  27                               16                               98
##  28                               4                               75
##  29                               20                               91
##  30                               7                               86
```

## 31	19	65
## 32	22	40
## 33	6	28
## 34	21	42
## 35	5	53
## 36	18	72
## 37	43	93
## 38	36	60
## 39	44	105
## 40	37	62
## 41	42	88
## 42	38	85
## 43	45	92
## 44	46	64
## 45	39	36
## 46	47	44
## 47	40	31
## 48	48	37
## 49	59	48
## 50	41	19
## 51	58	43
## 52	52	30
## 53	57	35
## 54	51	24
## 55	53	25
## 56	55	23
## 57	50	22
## 58	56	27
## 59	49	45
## 60	54	67
## 61	69	123
## 62	60	56
## 63	70	112
## 64	63	115
## 65	67	190
## 66	62	111
## 67	66	109
## 68	72	79
## 69	64	58
## 70	71	51
## 71	65	50
## 72	68	78
## 73	78	137
## 74	61	55
## 75	84	156
## 76	74	132
## 77	82	230
## 78	73	125
## 79	79	100
## 80	83	80
## 81	75	49
## 82	80	63
## 83	76	87
## 84	81	101

## 85	111	202
## 86	89	99
## 87	110	174
## 88	96	197
## 89	104	294
## 90	94	247
## 91	105	179
## 92	107	108
## 93	97	69
## 94	108	71
## 95	98	83
## 96	106	139
## 97	146	164
## 98	92	104
## 99	148	129
## 100	123	122
## 101	142	206
## 102	121	244
## 103	140	235
## 104	141	147
## 105	124	77
## 106	147	89
## 107	122	90
## 108	143	195
## 109	164	287
## 110	99	234
## 111	160	355
## 112	132	293
## 113	159	313
## 114	133	296
## 115	162	298
## 116	161	214
## 117	134	114
## 118	166	124
## 119	135	176
## 120	163	302
## 121	250	390
## 122	152	303
## 123	251	410
## 124	205	387
## 125	252	415
## 126	206	405
## 127	253	367
## 128	254	320
## 129	207	192
## 130	255	185
## 131	208	265
## 132	256	419
## 133	291	406
## 134	191	339
## 135	293	413
## 136	227	396
## 137	290	423
## 138	228	372

## 139	295	362
## 140	296	305
## 141	230	178
## 142	298	205
## 143	235	221
## 144	300	331
## 145	326	375
## 146	186	276
## 147	327	309
## 148	266	279
## 149	321	353
## 150	267	266
## 151	322	233
## 152	325	191
## 153	268	148
## 154	323	187
## 155	269	254
## 156	324	337
## 157	278	220
## 158	154	203
## 159	274	382
## 160	216	347
## 161	273	356
## 162	217	317
## 163	276	283
## 164	277	211
## 165	220	180
## 166	275	207
## 167	221	239
## 168	279	330
## 169	238	299
## 170	144	145
## 171	240	250
## 172	197	198
## 173	233	269
## 174	200	167
## 175	242	169
## 176	244	141
## 177	199	118
## 178	234	127
## 179	198	96
## 180	237	188
## 181	312	243
## 182	209	134
## 183	315	173
## 184	259	153
## 185	311	222
## 186	264	146
## 187	318	126
## 188	320	119
## 189	265	103
## 190	316	95
## 191	258	140
## 192	313	181

## 193	364	271
## 194	232	162
## 195	371	332
## 196	297	324
## 197	222	391
## 198	271	360
## 199	339	310
## 200	392	280
## 201	359	225
## 202	389	274
## 203	391	300
## 204	399	336
## 205	202	275
## 206	165	268
## 207	241	400
## 208	188	325
## 209	113	312
## 210	77	261
## 211	137	252
## 212	246	246
## 213	213	136
## 214	193	160
## 215	139	159
## 216	247	322
## 217	375	404
## 218	100	166
## 219	128	297
## 220	86	241
## 221	102	348
## 222	109	284
## 223	112	253
## 224	287	277
## 225	368	238
## 226	280	168
## 227	223	170
## 228	365	321
## 229	396	340
## 230	180	142
## 231	149	210
## 232	114	133
## 233	87	150
## 234	184	248
## 235	282	223
## 236	377	236
## 237	292	157
## 238	376	182
## 239	354	249
## 240	351	358
## 241	384	394
## 242	219	196
## 243	349	354
## 244	168	318
## 245	88	343
## 246	90	264

## 247	119	237
## 248	346	258
## 249	285	163
## 250	331	172
## 251	345	208
## 252	356	295
## 253	419	359
## 254	245	186
## 255	342	326
## 256	195	291
## 257	93	242
## 258	130	245
## 259	385	345
## 260	294	216
## 261	210	113
## 262	380	193
## 263	341	213
## 264	347	278
## 265	229	292
## 266	103	201
## 267	211	366
## 268	366	341
## 269	171	335
## 270	169	385
## 271	407	433
## 272	416	416
## 273	374	251
## 274	406	381
## 275	367	374
## 276	348	418
## 277	382	437
## 278	158	408
## 279	333	450
## 280	101	377
## 281	185	427
## 282	304	439
## 283	397	441
## 284	409	426
## 285	334	282
## 286	420	403
## 287	411	386
## 288	360	430
## 289	388	453
## 290	167	392
## 291	288	452
## 292	299	434
## 293	372	455
## 294	187	440
## 295	335	443
## 296	355	398
## 297	286	281
## 298	418	414
## 299	357	315
## 300	329	349

## 301	394	421
## 302	117	338
## 303	218	417
## 304	215	365
## 305	283	436
## 306	85	346
## 307	249	395
## 308	305	344
## 309	270	224
## 310	369	219
## 311	181	154
## 312	383	373
## 313	381	428
## 314	145	333
## 315	116	393
## 316	281	368
## 317	404	442
## 318	196	409
## 319	353	424
## 320	332	361
## 321	239	209
## 322	174	155
## 323	303	240
## 324	192	289
## 325	151	263
## 326	248	255
## 327	350	380
## 328	307	401
## 329	308	383
## 330	172	270
## 331	314	314
## 332	310	262
## 333	214	128
## 334	378	171
## 335	340	212
## 336	309	199
## 337	176	130
## 338	95	74
## 339	136	151
## 340	125	102
## 341	115	116
## 342	126	149
## 343	150	117
## 344	157	138
## 345	127	61
## 346	170	84
## 347	138	70
## 348	155	143
## 349	175	194
## 350	91	107
## 351	131	158
## 352	120	227
## 353	156	319
## 354	129	334

## 355	194	311
## 356	153	175
## 357	182	110
## 358	231	131
## 359	179	152
## 360	224	228
## 361	204	177
## 362	118	120
## 363	189	267
## 364	177	272
## 365	178	379
## 366	173	364
## 367	225	308
## 368	212	257
## 369	183	135
## 370	203	144
## 371	190	161
## 372	289	307
## 373	317	285
## 374	201	184
## 375	272	273
## 376	260	229
## 377	243	301
## 378	236	328
## 379	330	304
## 380	306	259
## 381	226	204
## 382	302	183
## 383	263	217
## 384	352	378
## 385	358	342
## 386	261	232
## 387	336	306
## 388	257	286
## 389	319	399
## 390	301	384
## 391	363	388
## 392	362	288
## 393	314	165
## 394	337	189
## 395	328	218
## 396	373	316
## 397	390	420
## 398	262	323
## 399	361	371
## 400	284	412
## 401	338	444
## 402	344	431
## 403	386	402
## 404	393	327
## 405	370	200
## 406	387	231
## 407	379	290
## 408	400	350

## 409	405	422
## 410	343	226
## 411	401	411
## 412	395	397
## 413	402	425
## 414	398	376
## 415	412	389
## 416	410	351
## 417	403	215
## 418	414	256
## 419	413	260
## 420	421	363
## 421	435	429
## 422	415	352
## 423	428	435
## 424	423	438
## 425	431	462
## 426	422	463
## 427	434	458
## 428	438	432
## 429	425	329
## 430	433	370
## 431	432	369
## 432	430	445
## 433	424	449
## 434	408	357
## 435	427	448
## 436	417	460
## 437	426	472
## 438	429	468
## 439	439	457
## 440	443	446
## 441	437	407
## 442	440	451
## 443	442	456
## 444	447	471
## 445	458	467
## 446	441	447
## 447	465	475
## 448	451	464
## 449	457	484
## 450	453	494
## 451	468	479
## 452	476	465
## 453	459	454
## 454	472	461
## 455	471	474
## 456	492	485
## 457	490	492
## 458	446	480
## 459	481	518
## 460	455	515
## 461	467	532
## 462	477	527

## 463	489	510
## 464	496	491
## 465	473	470
## 466	486	481
## 467	491	487
## 468	529	504
## 469	488	499
## 470	454	473
## 471	475	508
## 472	452	497
## 473	474	512
## 474	460	503
## 475	461	488
## 476	470	482
## 477	449	459
## 478	456	466
## 479	450	469
## 480	464	496
## 481	478	509
## 482	445	477
## 483	485	502
## 484	469	519
## 485	498	537
## 486	493	524
## 487	524	516
## 488	510	490
## 489	482	476
## 490	518	489
## 491	515	495
## 492	558	511
## 493	528	523
## 494	462	478
## 495	534	536
## 496	503	543
## 497	526	540
## 498	531	538
## 499	562	526
## 500	551	493
## 501	507	483
## 502	538	500
## 503	525	513
## 504	573	528
## 505	542	522
## 506	466	498
## 507	519	531
## 508	497	525
## 509	530	521
## 510	523	507
## 511	557	514
## 512	552	506
## 513	504	486
## 514	520	501
## 515	521	520
## 516	559	549

## 517	544	545
## 518	499	535
## 519	546	565
## 520	487	551
## 521	533	553
## 522	536	534
## 523	555	542
## 524	568	517
## 525	517	505
## 526	537	529
## 527	545	530
## 528	583	566
## 529	565	562
## 530	483	544
## 531	560	8
## 532	502	1
## 533	541	14
## 534	532	581
## 535	556	561
## 536	572	541
## 537	516	533
## 538	554	552
## 539	563	550
## 540	579	560
## 541	577	575
## 542	508	558
## 543	576	5
## 544	535	7
## 545	570	15
## 546	561	9
## 547	580	567
## 548	582	572
## 549	539	539
## 550	575	554
## 551	566	557
## 552	581	569
## 553	569	571
## 554	494	547
## 555	553	585
## 556	527	12
## 557	564	16
## 558	550	4
## 559	574	584
## 560	571	570
## 561	512	556
## 562	549	564
## 563	547	555
## 564	578	568
## 565	567	577
## 566	506	579
## 567	522	583
## 568	436	559
## 569	448	6
## 570	463	13

## 571	495	582
## 572	500	573
## 573	479	548
## 574	501	563
## 575	505	576
## 576	540	578
## 577	509	2
## 578	444	546
## 579	511	17
## 580	480	11
## 581	543	18
## 582	514	10
## 583	548	580
## 584	513	3
## 585	484	574
## Hydroelectric Power Consumption		
## 1	460	
## 2	334	
## 3	449	
## 4	383	
## 5	419	
## 6	362	
## 7	307	
## 8	245	
## 9	56	
## 10	97	
## 11	185	
## 12	469	
## 13	548	
## 14	483	
## 15	506	
## 16	518	
## 17	523	
## 18	485	
## 19	473	
## 20	382	
## 21	262	
## 22	187	
## 23	250	
## 24	340	
## 25	430	
## 26	368	
## 27	521	
## 28	482	
## 29	512	
## 30	495	
## 31	445	
## 32	314	
## 33	214	
## 34	317	
## 35	400	
## 36	463	
## 37	466	
## 38	404	

##	39	477
##	40	387
##	41	442
##	42	446
##	43	464
##	44	361
##	45	200
##	46	240
##	47	172
##	48	196
##	49	226
##	50	18
##	51	182
##	52	118
##	53	120
##	54	67
##	55	51
##	56	48
##	57	41
##	58	66
##	59	215
##	60	328
##	61	425
##	62	295
##	63	409
##	64	435
##	65	538
##	66	429
##	67	398
##	68	292
##	69	244
##	70	154
##	71	175
##	72	289
##	73	423
##	74	253
##	75	454
##	76	438
##	77	543
##	78	421
##	79	318
##	80	248
##	81	126
##	82	190
##	83	300
##	84	316
##	85	436
##	86	259
##	87	395
##	88	450
##	89	544
##	90	507
##	91	403
##	92	209

## 93	106
## 94	82
## 95	145
## 96	299
## 97	311
## 98	254
## 99	223
## 100	230
## 101	392
## 102	478
## 103	437
## 104	274
## 105	85
## 106	94
## 107	136
## 108	373
## 109	493
## 110	488
## 111	558
## 112	524
## 113	527
## 114	526
## 115	502
## 116	375
## 117	184
## 118	174
## 119	355
## 120	516
## 121	552
## 122	529
## 123	565
## 124	563
## 125	576
## 126	569
## 127	532
## 128	468
## 129	287
## 130	235
## 131	422
## 132	578
## 133	557
## 134	519
## 135	564
## 136	559
## 137	577
## 138	546
## 139	505
## 140	434
## 141	237
## 142	234
## 143	304
## 144	457
## 145	510
## 146	465

## 147	418
## 148	411
## 149	479
## 150	377
## 151	263
## 152	188
## 153	124
## 154	191
## 155	332
## 156	441
## 157	267
## 158	351
## 159	535
## 160	508
## 161	501
## 162	476
## 163	389
## 164	256
## 165	251
## 166	261
## 167	343
## 168	467
## 169	444
## 170	255
## 171	350
## 172	293
## 173	394
## 174	238
## 175	199
## 176	107
## 177	96
## 178	88
## 179	52
## 180	246
## 181	284
## 182	130
## 183	157
## 184	134
## 185	249
## 186	121
## 187	50
## 188	37
## 189	34
## 190	14
## 191	101
## 192	171
## 193	257
## 194	127
## 195	335
## 196	408
## 197	534
## 198	474
## 199	337
## 200	218

## 201	147
## 202	210
## 203	270
## 204	297
## 205	384
## 206	426
## 207	539
## 208	472
## 209	514
## 210	533
## 211	407
## 212	283
## 213	79
## 214	149
## 215	227
## 216	432
## 217	484
## 218	326
## 219	490
## 220	487
## 221	551
## 222	486
## 223	439
## 224	313
## 225	144
## 226	103
## 227	146
## 228	325
## 229	308
## 230	115
## 231	315
## 232	197
## 233	336
## 234	347
## 235	205
## 236	125
## 237	70
## 238	60
## 239	193
## 240	415
## 241	448
## 242	222
## 243	385
## 244	471
## 245	560
## 246	500
## 247	391
## 248	220
## 249	83
## 250	81
## 251	112
## 252	290
## 253	233
## 254	186

## 255	339
## 256	390
## 257	440
## 258	410
## 259	329
## 260	179
## 261	36
## 262	63
## 263	119
## 264	281
## 265	399
## 266	412
## 267	522
## 268	386
## 269	497
## 270	553
## 271	492
## 272	369
## 273	166
## 274	319
## 275	431
## 276	537
## 277	562
## 278	572
## 279	583
## 280	573
## 281	581
## 282	575
## 283	531
## 284	455
## 285	276
## 286	298
## 287	342
## 288	556
## 289	579
## 290	566
## 291	585
## 292	570
## 293	582
## 294	584
## 295	568
## 296	470
## 297	322
## 298	379
## 299	333
## 300	433
## 301	520
## 302	550
## 303	567
## 304	513
## 305	580
## 306	574
## 307	515
## 308	397

## 309	195
## 310	100
## 311	155
## 312	401
## 313	540
## 314	517
## 315	571
## 316	480
## 317	528
## 318	555
## 319	545
## 320	428
## 321	202
## 322	151
## 323	221
## 324	393
## 325	413
## 326	279
## 327	458
## 328	509
## 329	481
## 330	402
## 331	356
## 332	258
## 333	65
## 334	46
## 335	111
## 336	138
## 337	108
## 338	61
## 339	192
## 340	74
## 341	123
## 342	204
## 343	77
## 344	110
## 345	13
## 346	11
## 347	15
## 348	131
## 349	243
## 350	161
## 351	203
## 352	358
## 353	452
## 354	498
## 355	414
## 356	207
## 357	42
## 358	45
## 359	137
## 360	236
## 361	173
## 362	133

## 363	348
## 364	366
## 365	530
## 366	504
## 367	371
## 368	294
## 369	78
## 370	76
## 371	129
## 372	341
## 373	282
## 374	181
## 375	280
## 376	178
## 377	327
## 378	381
## 379	296
## 380	219
## 381	163
## 382	87
## 383	183
## 384	424
## 385	338
## 386	217
## 387	278
## 388	285
## 389	461
## 390	443
## 391	416
## 392	213
## 393	39
## 394	58
## 395	104
## 396	241
## 397	456
## 398	353
## 399	344
## 400	491
## 401	549
## 402	525
## 403	376
## 404	212
## 405	35
## 406	32
## 407	142
## 408	206
## 409	405
## 410	71
## 411	320
## 412	309
## 413	406
## 414	264
## 415	247
## 416	117

## 417	1
## 418	2
## 419	9
## 420	64
## 421	158
## 422	73
## 423	201
## 424	228
## 425	447
## 426	499
## 427	372
## 428	177
## 429	16
## 430	5
## 431	7
## 432	162
## 433	277
## 434	43
## 435	198
## 436	370
## 437	503
## 438	496
## 439	273
## 440	93
## 441	33
## 442	98
## 443	160
## 444	330
## 445	224
## 446	139
## 447	153
## 448	75
## 449	345
## 450	511
## 451	323
## 452	116
## 453	29
## 454	38
## 455	92
## 456	265
## 457	360
## 458	301
## 459	541
## 460	542
## 461	561
## 462	554
## 463	547
## 464	365
## 465	169
## 466	99
## 467	140
## 468	286
## 469	231
## 470	102

## 471	357
## 472	364
## 473	459
## 474	388
## 475	374
## 476	229
## 477	28
## 478	10
## 479	55
## 480	225
## 481	312
## 482	109
## 483	114
## 484	324
## 485	453
## 486	420
## 487	417
## 488	165
## 489	19
## 490	24
## 491	31
## 492	143
## 493	164
## 494	27
## 495	288
## 496	331
## 497	378
## 498	346
## 499	291
## 500	84
## 501	6
## 502	22
## 503	49
## 504	194
## 505	260
## 506	168
## 507	266
## 508	180
## 509	80
## 510	91
## 511	113
## 512	54
## 513	3
## 514	8
## 515	59
## 516	216
## 517	310
## 518	252
## 519	380
## 520	321
## 521	305
## 522	208
## 523	122
## 524	62

## 525	4
## 526	17
## 527	40
## 528	170
## 529	352
## 530	232
## 531	462
## 532	451
## 533	536
## 534	489
## 535	349
## 536	148
## 537	47
## 538	21
## 539	68
## 540	159
## 541	272
## 542	269
## 543	306
## 544	396
## 545	475
## 546	367
## 547	275
## 548	135
## 549	44
## 550	53
## 551	128
## 552	167
## 553	239
## 554	152
## 555	302
## 556	359
## 557	494
## 558	363
## 559	242
## 560	141
## 561	25
## 562	20
## 563	57
## 564	95
## 565	211
## 566	271
## 567	176
## 568	150
## 569	427
## 570	354
## 571	303
## 572	156
## 573	23
## 574	26
## 575	69
## 576	86
## 577	268
## 578	90

```
## 579      89
## 580      30
## 581     132
## 582     189
## 583     105
## 584      72
## 585      12
```

Question 3

Compute mean and standard deviation for these three series.

```
mean(ts_energy_data[,1])
```

```
## [1] 291.5778
```

```
mean(ts_energy_data[,2])
```

```
## [1] 293
```

```
mean(ts_energy_data[,3])
```

```
## [1] 293
```

```
sd(ts_energy_data[,1])
```

```
## [1] 168.5232
```

```
sd(ts_energy_data[,2])
```

```
## [1] 169.0192
```

```
sd(ts_energy_data[,3])
```

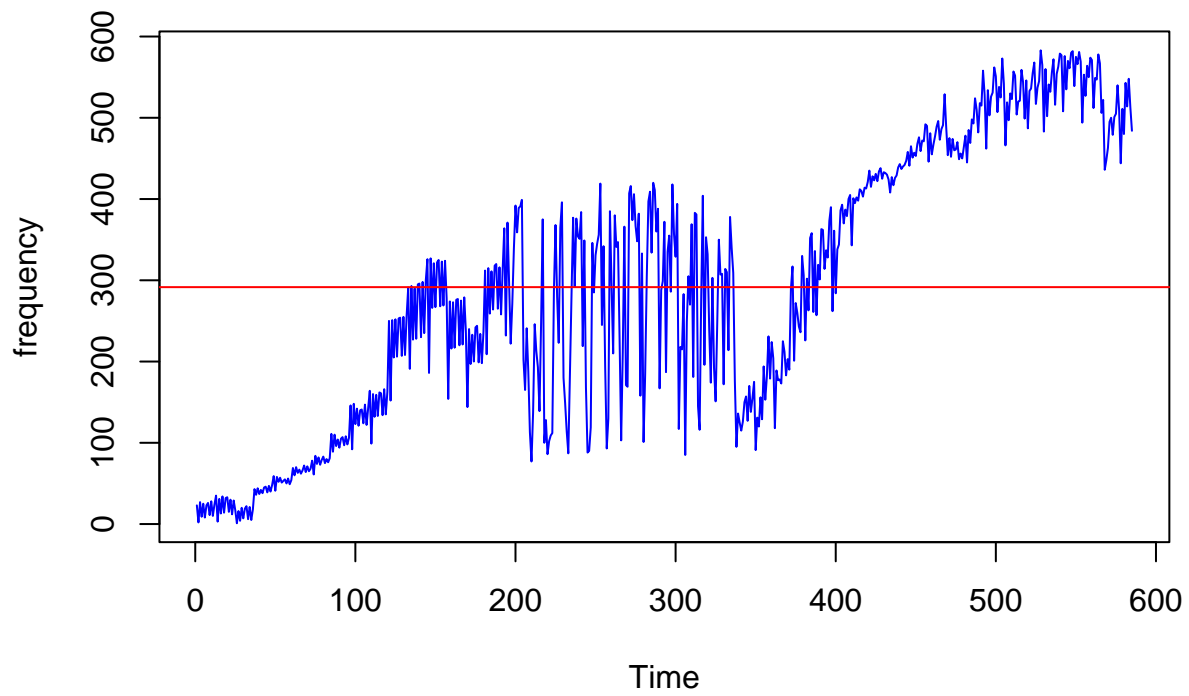
```
## [1] 169.0192
```

Question 4

Display and interpret the time series plot for each of these variables. Try to make your plot as informative as possible by writing titles, labels, etc. For each plot add a horizontal line at the mean of each series in a different color.

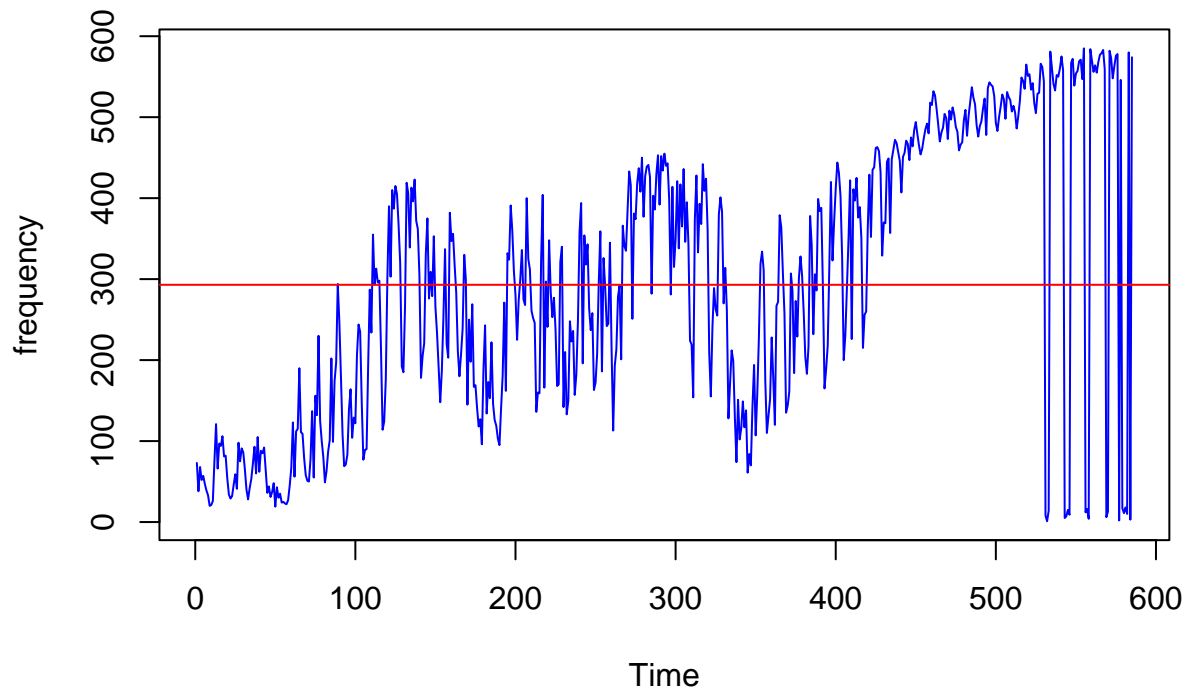
```
plot(ts_energy_data[,1],col="blue",ylab="frequency",main="Time Series Data for Total Biomass Energy Pro
abline(h=mean(ts_energy_data[,1]),col="red")
```


Time Series Data for Total Biomass Energy Production



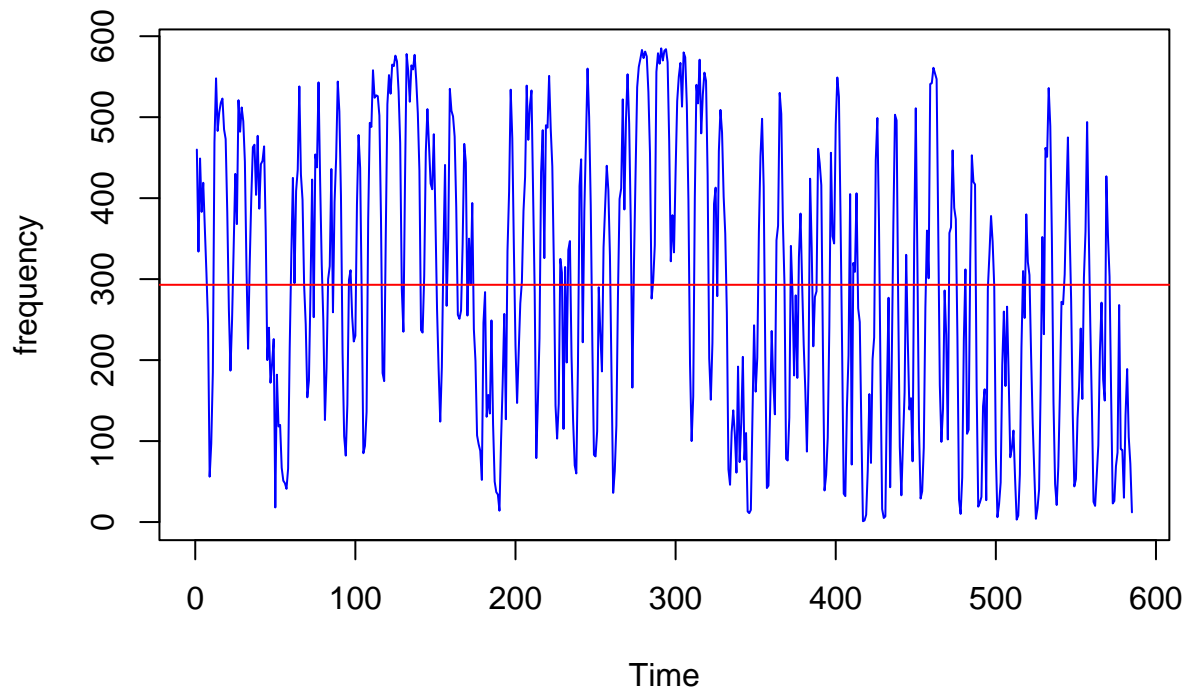
```
plot(ts_energy_data[,2],col="blue",ylab="frequency",main="Time Series Data for Total Renewable Energy P",  
abline(h=mean(ts_energy_data[,2]),col="red"))
```

Time Series Data for Total Renewable Energy Production



```
plot(ts_energy_data[,3],col="blue",ylab="frequency",main="Time Series Data for Hydroelectric Power Cons  
abline(h=mean(ts_energy_data[,3]),col="red")
```

Time Series Data for Hydroelectric Power Consumption



Question 5

Compute the correlation between these three series. Are they significantly correlated? Explain your answer. None of the three series are significantly correlated as the probability value for each correlation is above the absolute value of 0.5

```
cor(ts_energy_data[,1],ts_energy_data[,2])
```

```
## [1] 0.7325836
```

```
cor(ts_energy_data[,1],ts_energy_data[,3])
```

```
## [1] -0.2724661
```

```
cor(ts_energy_data[,2],ts_energy_data[,3])
```

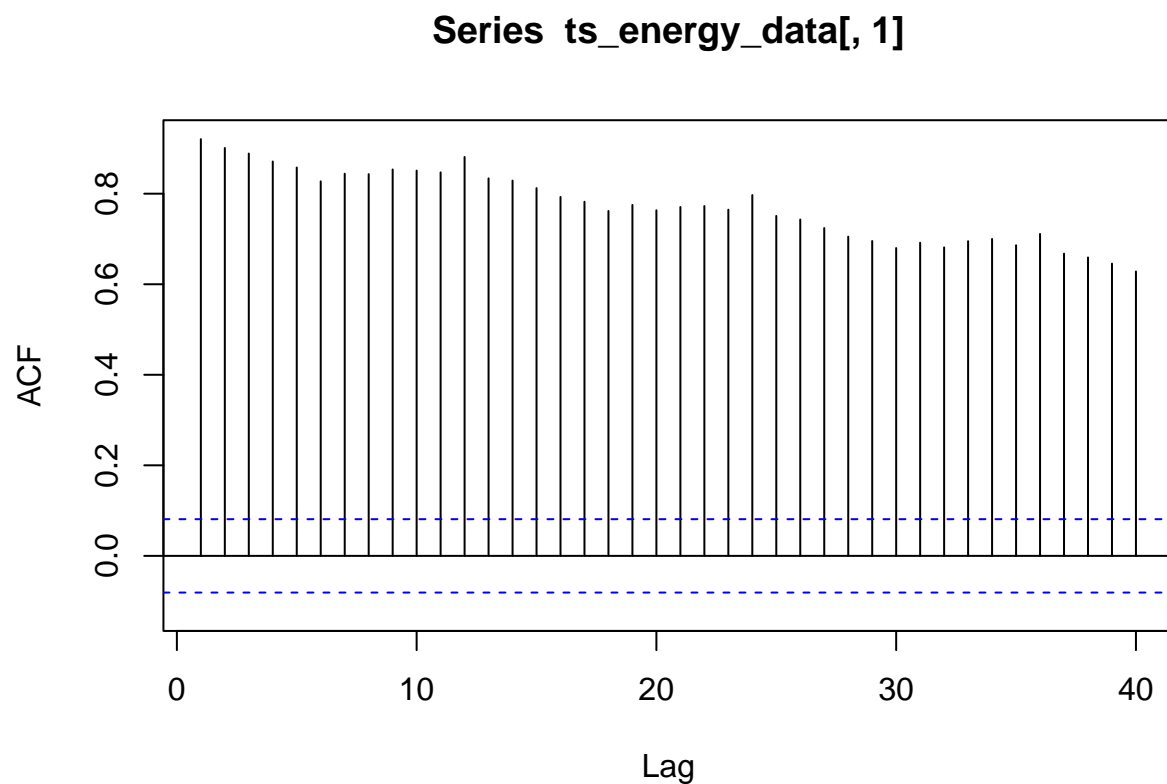
```
## [1] 0.06868406
```

Question 6

Compute the autocorrelation function from lag 1 up to lag 40 for these three variables. What can you say about these plots? Do the three of them have the same behavior? All three of these plots show some form of

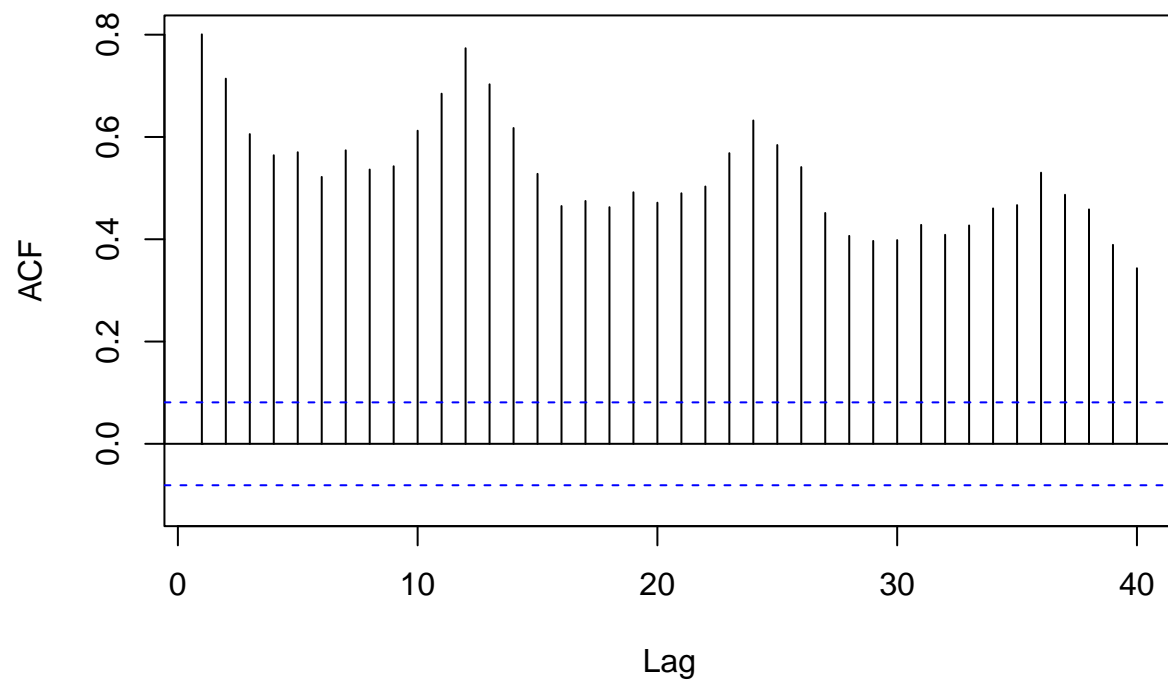
seasonality. The first graph has the least amount of seasonality, the second has a little more, and the third graph has the most seasonality.

```
TBEP_acf=Acf(ts_energy_data[,1],lag.max=40, type="correlation", plot=TRUE)
```



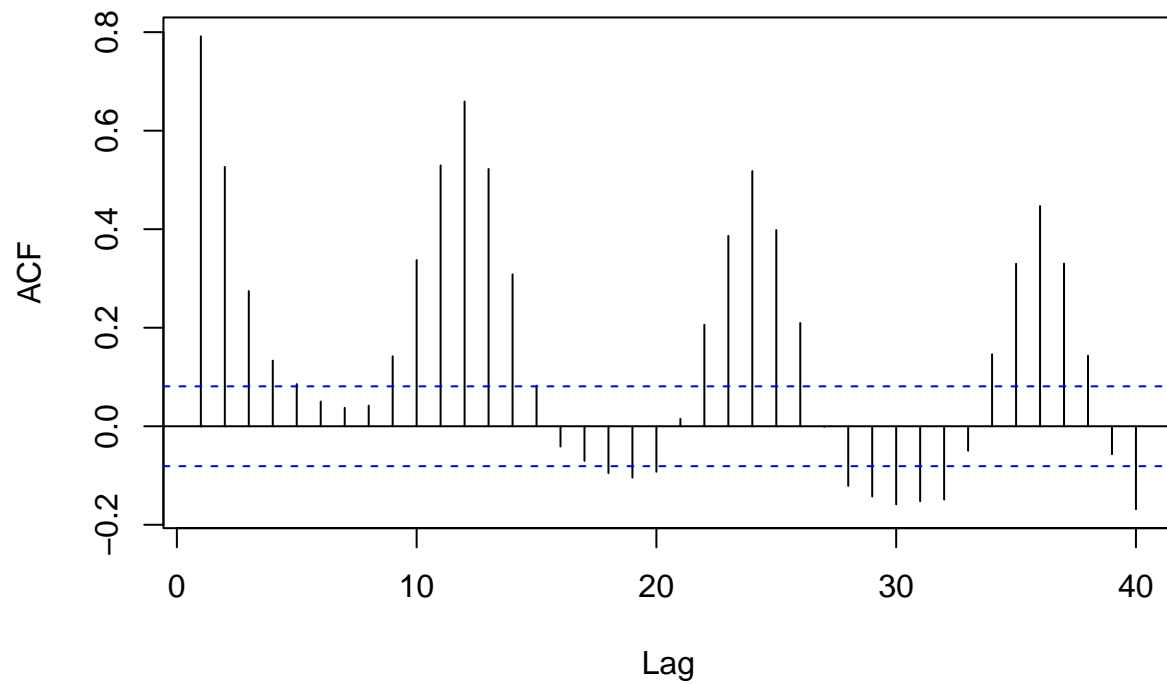
```
TREP_acf=Acf(ts_energy_data[,2],lag.max=40, type="correlation", plot=TRUE)
```

Series ts_energy_data[, 2]



```
HPC_acf=Acf(ts_energy_data[,3],lag.max=40, type="correlation", plot=TRUE)
```

Series ts_energy_data[, 3]

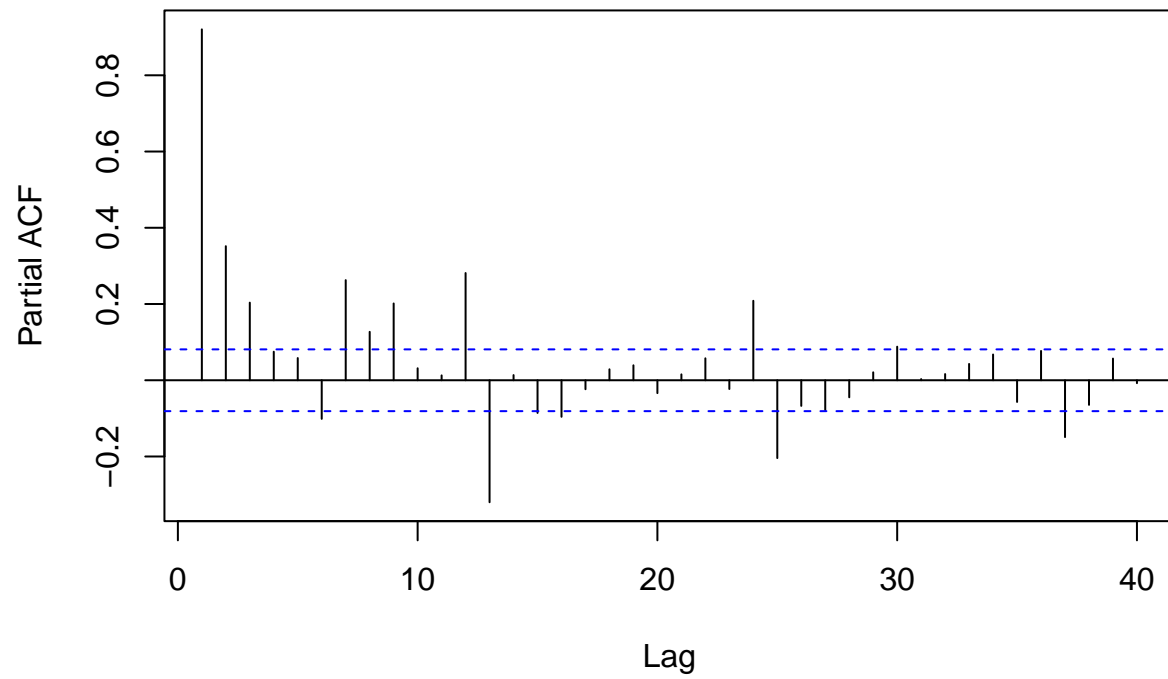


Question 7

Compute the partial autocorrelation function from lag 1 to lag 40 for these three variables. How these plots differ from the ones in Q6? Since the PACF graph looks to remove the seasonality from the graphs in Q6, you can see that there is less of a seasonal distribution in the below graphs across each three variables.

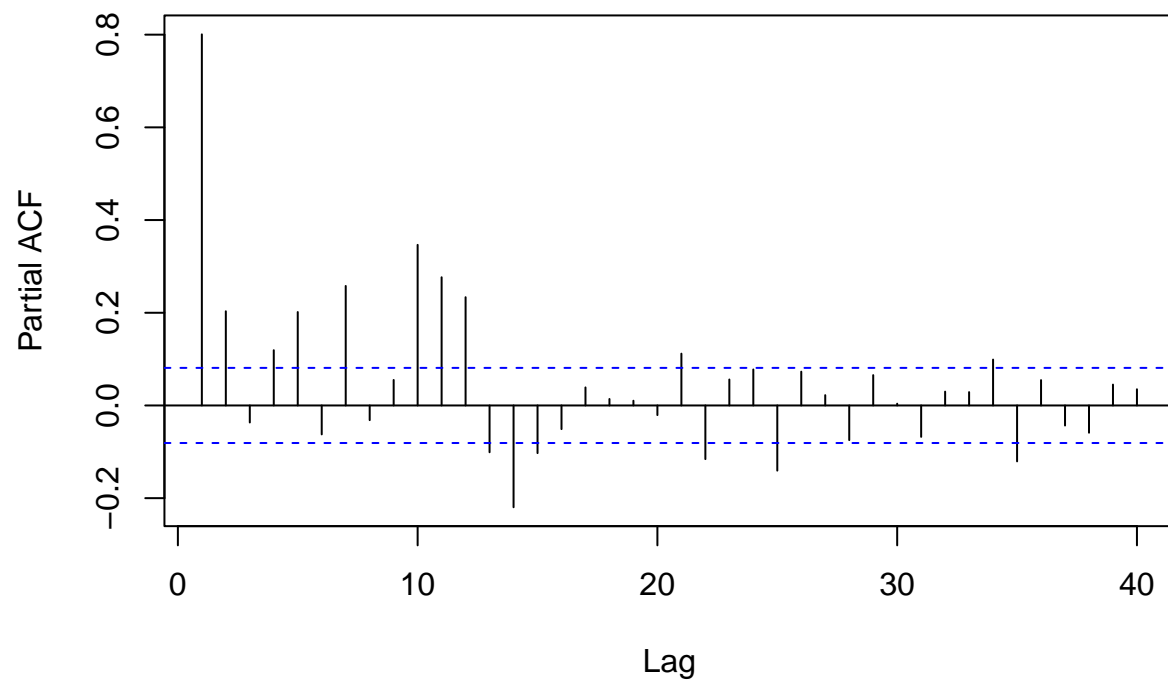
```
TBEP_pacf=Pacf(ts_energy_data[,1],lag.max=40, plot=TRUE)
```

Series ts_energy_data[, 1]



```
TREP_pacf=Pacf(ts_energy_data[,2],lag.max=40, plot=TRUE)
```

Series ts_energy_data[, 2]



```
HPC_pacf=Pacf(ts_energy_data[,3],lag.max=40, plot=TRUE)
```


Series ts_energy_data[, 3]

