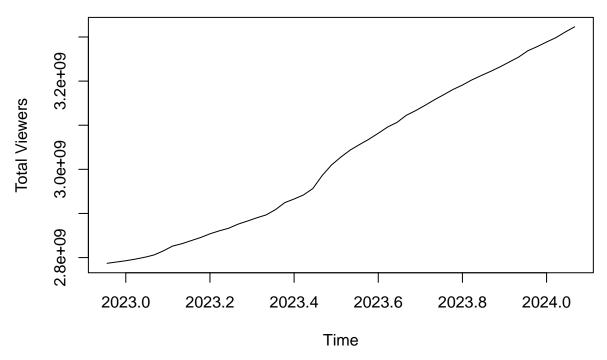
R Notebook

```
#install.packages("dplyr")
#install.packages("tidyverse")
#install.packages("astsa")
#install.packages("forecast")
library(dplyr)
library(tidyverse)
library(astsa)
library(forecast)
smosh <- read.csv(paste(PATH, "smosh_market.csv", sep = ""))</pre>
head(smosh)
##
            Month Year Total. Viewers
     Day
     25 December 2022
                          2787011608
## 2
          January 2023
                          2789909808
       2
## 3
                          2792792592
     10
          January 2023
## 4
     18
                          2796442297
          January 2023
## 5
     26 January 2023
                           2800576231
## 6
       3 February 2023
                           2805812495
                                                                                       Video.1
## 1 Try Not To Laugh Challenge #110 - Gauntlet w/ Our Crew! (Dec. 20 2022; 1699048, 24:05)
                             Eat It Or Yeet It: Cast vs. Crew! (Dec. 27 2022; 896884, 25:49)
## 3
                               Try Not To Laugh 2022 Marathon (Jan. 3 2023; 804787, 8:23:46)
## 4
                         How Much Do We Know About Spongebob? (Jan. 12 2023; 692537, 21:11)
## 5
                                  Short Kings Rank Short Kings (Jan. 19 2023; 684072, 36:59)
## 6
                              Try Not To Laugh Challenge #112 (Jan. 31 2023; 1457075, 19:58)
##
                                                                                               Video.2
## 1
                            These Memes Destroyed Us (Who Meme'd It) (Dec. 22, 2022; 1422918, 28:13)
## 2
                                             Beopardy 2022 Marathon (Dec. 29 2022; 789801, 04:57:38)
## 3
                         Reading Unhinged Reddit Stories w/ MacDoesIt (Jan. 5 2023; 2515511, 45:47)
## 4
                                      Try Not To Laugh Challenge #111 (Jan. 17 2023; 2693844, 26:05)
## 5
                        Filipino Food Taste Test (Eat It or Yeet It) (Jan. 24 2023; 1970618, 25:04)
## 6 We Try The TikTok Candle Challenge... and MORE! | The Challenge Pit (Feb. 2 2023; 818879, 22:07)
##
                                                               Video.3 Video.4
## 1
                                                                  ; 0,
                                                                          : 0.
## 2
                                                                  ; 0,
                                                                          ; 0,
## 3 Eat It Or Yeet It 2022 Marathon (Jan. 10 2023; 548572, 7:10:39)
                                                                          ; 0,
## 4
                                                                          ; 0,
## 5
                Can I Work A Real Job? (Jan. 26 2023; 864940, 30:33)
                                                                          ; 0,
## 6
                                                                  ; 0,
                                                                          ; 0,
     Total.Views.of.Videos.Posted.that.Week X..Videos.Posted
## 1
                                     3121966
## 2
                                     1686685
                                                             2
## 3
                                     3868870
                                                             3
## 4
                                     3386381
```

```
## 5
                                      3519630
## 6
                                      2275954
                                                               2
##
     Avg..Views.of.Videos.Posted.That.Week
## 1
                                     1560983
## 2
                                      843343
## 3
                                     1289623
## 4
                                     1693191
## 5
                                     1173210
## 6
                                     1137977
##
     Total.Duration.of.Videos.Posted.That.Week
## 1
## 2
                                               NA
## 3
                                               NA
## 4
                                               NA
## 5
                                               NA
## 6
                                               NA
smosh <- smosh %>% rename("Total Viewers" = "Total.Viewers")
sm <- ts(smosh["Total Viewers"], start = c(2022, 44), frequency = 45)</pre>
plot(sm, main = "Smosh Pit Total Weekly Total Views")
```

Smosh Pit Total Weekly Total Views



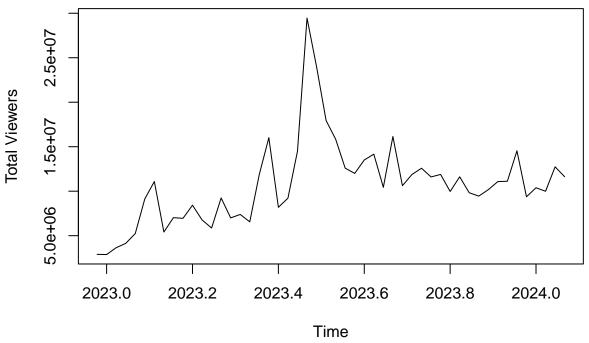
- Non-stationary in mean
- Dataframe only about a year, likely won't track seasonality (if any) and unlikely due to nature of channel
- Mild viewership jump around June 2023 (steeper slope after jump?)

```
growth <- diff(sm)
which.max(growth)</pre>
```

[1] 23

```
growth[23]
## [1] 29457404
which.min(growth)
## [1] 2
growth[2]
## [1] 2882784
# 24 and 25 (now 23 and 24) have most significant increases in viewership
# (Anthony returns - 24th Anthony specific videos (in title))
plot(growth, type = "l", main = "Smosh Pit Viewership Changes in 2023")
```

Smosh Pit Viewership Changes in 2023



```
# 5 noticeable peaks (7, 18/19, 23/24, 32, 45)
# post big peak - different mean, variance pretty constant aside from peaks
```

- $\bullet\,$ Mean more stationary...how significant is difference after massive peak
- Variance changes: some kind of seasonality or caused by outside events (like major peak)?? appear about eqidistant of eachother

```
# roa = return of Anthony

pre_roa <- growth[1:22]

post_roa <- growth[24:50]

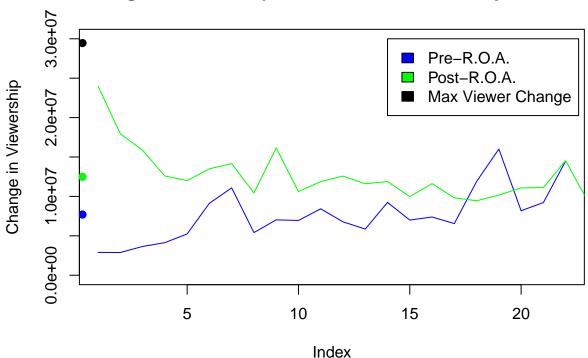
mean(pre_roa)</pre>
```

[1] 7701073

```
mean(post_roa)
## [1] 12483718
```

```
plot(pre_roa, type = "1", col = "blue", ylim = c(0, 30000000), ylab = "Change in Viewership", main = "Clause | clause | clau
```

Change in Viewership Before and After Anthony's Return



Post return of Anthony has a sustained increase in viewership. Jump at end of pre-ROA period and dip at end of post-ROA period - is time series stabilizing around specific mean or residual effect of week 19 peak?

No apparent trend before or after Anthony's return. Potential seasonality? Effect of intervention mimiking autocorrelation?

Finish formatting dataframe

hour_1 minute_1 second_1 hour_2 minute_2 second_2 hour_3 minute_3 second_3

##			24	05		28	13	<na></na>	<na></na>	<na></na>
##			25	49	04:	57	38	<na></na>	<na></na>	<na></na>
##	3	8:	23	46		45	47	7:	10	39
##	4		21	11		26	05	<na></na>	<na></na>	<na></na>
##	5		36	59		25	04		30	33
##	6		19	58		22	07	<na></na>	<na></na>	<na></na>
##	7		21	26		50	40	<na></na>	<na></na>	<na></na>
##	8		18	12		30	07	<na></na>	<na></na>	<na></na>
##			20	10		24	35		0	54
##			26	46		24	25	1:	13	45
##			21	46		21	15		20	53
##			30	20	1:	14	41		18	13
##			17	11		20	08		17	24
##		1:	16	19		24	52		27	44
##			17	10		20	34	1:	05	10
##			24	41		39	04		29	37
##			17	05		20	54	1:	14	29
##			42	30	1:	03	53		20	17
##			30	33	1:	16	59		19	05
##			38	44		14	44		28	45
##		1:	15	45		18	08		18	06
##		τ.	24	18		21	55	1:	09	57
##			18	28		40	10	1:	14	30
##			26	03		39	30	1:	10	16
##			21	31	1:	14	26	1.	19	43
##			24	08	1:	08	15		31	49
##		1:	10	33	1.	18	55		24	23
##		1:	13	10		25	47		26	41
##		1.	25	36		36	22	1:	08	02
##			24	47		23	07	1:	10	43
##			22	10		45	19	1:	17	35
##			28	26	1:	14	05	т.	26	33
##			49	07	1:	09	39		27	36
##		1:	15	59	1.	22	32		28	34
##		1.	26	55 55		30	31	1:	10	32
##			23	28		42	37	1:	16	39
##			23	22		26	34	1:	22	38
##			17 22	27	1.	37	43	1:	08	02
##				28	1:	15	04		22	20
##		1.	48	09	1:	22	43		26	01
## ##		1:	05	11		19	19		36	03
		1:	07	41		30	42		48	29
##			25	01	1.	48	12	~NT A >	55	32
##			27	09	1:	15	57 56	<na></na>	<na></na>	<na></na>
##			19	31	4.	34	56	1:	10	02
##		4.	35	02	1:	80	20		27	19
##		1:	15	24	1:	20	00	4	31	38
##		1:	18	32	8:	34	13	4:	44	32
##		6:	28	27	9:	06	33		33	57
##			14	50		29	31	1:	21	26
##	51	1	51	29		33	31	1:	13	23
##	4		minute_4							
##		<na></na>	<na></na>	<na></na>						
##	2	<na></na>	<na></na>	<na></na>						

```
## 3
                   <NA>
                              <NA>
         <NA>
## 4
         <NA>
                   <NA>
                              <NA>
## 5
                              <NA>
         <NA>
                   <NA>
## 6
         <NA>
                   <NA>
                              <NA>
## 7
         <NA>
                   <NA>
                              <NA>
## 8
         <NA>
                   <NA>
                              <NA>
## 9
         <NA>
                   <NA>
                              <NA>
                                12
## 10
                      21
## 11
         <NA>
                   <NA>
                              <NA>
## 12
                     21
                                37
## 13
         <NA>
                   <NA>
                              <NA>
## 14
                     29
                                15
## 15
         <NA>
                   <NA>
                              <NA>
## 16
                   <NA>
                              <NA>
         <NA>
## 17
                      17
                                47
## 18
         <NA>
                   <NA>
                              <NA>
## 19
                      26
                                48
## 20
         <NA>
                   <NA>
                              <NA>
## 21
                     02
                                45
           1:
## 22
         <NA>
                   <NA>
                              <NA>
## 23
         <NA>
                   <NA>
                              <NA>
## 24
                      18
                                57
## 25
         <NA>
                   <NA>
                              <NA>
## 26
                      44
                                54
## 27
                   <NA>
                              <NA>
         <NA>
## 28
                     55
                                19
## 29
         <NA>
                   <NA>
                              <NA>
## 30
         <NA>
                   <NA>
                              <NA>
## 31
                      26
                                14
## 32
                              <NA>
         <NA>
                   <NA>
## 33
                      23
                                30
## 34
         <NA>
                   <NA>
                              <NA>
## 35
                              <NA>
         <NA>
                   <NA>
## 36
         <NA>
                   <NA>
                              <NA>
## 37
         <NA>
                   <NA>
                              <NA>
## 38
                     28
                                10
## 39
         <NA>
                   <NA>
                              <NA>
## 40
                      43
                                15
## 41
         <NA>
                   <NA>
                              <NA>
## 42
                     58
                                31
## 43
         <NA>
                   <NA>
                              <NA>
## 44
         <NA>
                   <NA>
                              <NA>
## 45
                      26
                                58
## 46
         <NA>
                   <NA>
                              <NA>
## 47
                      39
                                41
## 48
                              <NA>
         <NA>
                   <NA>
## 49
                                26
                      54
## 50
         <NA>
                   <NA>
                              <NA>
## 51
                              <NA>
         <NA>
                   <NA>
video_lengths <-</pre>
  video_lengths %>%
  mutate(hour_1 = str_replace_all(hour_1, ":", ""),
          hour_2 = str_replace_all(hour_2, ":", ""),
```

```
hour_3 = str_replace_all(hour_3, ":", ""),
         hour_4 = str_replace_all(hour_4, ":", ""))
video_lengths <- data.frame(sapply(video_lengths, as.integer))</pre>
h <- c("hour 1", "hour 2", "hour 3", "hour 4")
m <- c("minute_1", "minute_2", "minute_3", "minute_4")</pre>
s <- c("second 1", "second 2", "second 3", "second 4")</pre>
video lengths <-
  video_lengths %>%
 rowwise() %>%
  mutate(hours = sum(c_across(any_of(h)), na.rm = TRUE),
         minutes = sum(c_across(any_of(m)), na.rm = TRUE),
         seconds = sum(c_across(any_of(s)), na.rm = TRUE)) %>%
  ungroup() %>% select("hours", "minutes", "seconds")
channel_growth <- smosh %>% select(!(starts_with(("Video"))))
channel_growth["Total.Duration.of.Videos.Posted.That.Week"] <-</pre>
  video_lengths %>%
  mutate(minutes = floor(hours*60 + minutes + seconds/60)) %>% select(minutes)
channel_growth <- channel_growth[-c(1), ]</pre>
channel_growth["Viewer Growth"] <- as.numeric(growth[, 1])</pre>
channel_growth <- channel_growth %>%
  relocate("Viewer Growth", .after = "Total Viewers") %>% rename(
    "Total Views of Videos Posted that Week" = Total. Views. of. Videos. Posted. that. Week,
    "Number Videos Posted" = X..Videos.Posted,
    "Avg. Views of Videos Posted that Week" = Avg..Views.of.Videos.Posted.That.Week,
    "Total Duration of Videos Posted that Week" = Total.Duration.of.Videos.Posted.That.Week
)
rownames(channel_growth) <- NULL</pre>
channel_growth
##
      Day
              Month Year Total Viewers Viewer Growth
## 1
            January 2023
                             2789909808
                                              2898200
## 2
       10
            January 2023
                             2792792592
                                              2882784
## 3
       18
            January 2023
                             2796442297
                                              3649705
## 4
            January 2023
       26
                             2800576231
                                              4133934
## 5
       3
           February 2023
                             2805812495
                                              5236264
## 6
           February 2023
                             2814945755
                                              9133260
       11
## 7
       19
           February 2023
                             2826026147
                                             11080392
           February 2023
## 8
       27
                             2831436611
                                              5410464
## 9
        7
              March 2023
                             2838461335
                                              7024724
## 10 15
              March 2023
                             2845410880
                                              6949545
## 11 23
              March 2023
                             2853837066
                                              8426186
## 12 31
              March 2023
                             2860609759
                                              6772693
## 13
      8
              April 2023
                             2866469219
                                              5859460
## 14 16
              April 2023
                             2875708845
                                              9239626
              April 2023
## 15 24
                             2882705793
                                              6996948
## 16
                May 2023
                             2890092808
                                              7387015
## 17 10
                May 2023
                             2896647971
                                              6555163
```

```
## 18
       18
                 May 2023
                              2908538438
                                                11890467
## 19
       26
                 May 2023
                              2924547732
                                                16009294
                June 2023
##
  20
        3
                              2932733429
                                                 8185697
##
  21
                June 2023
                                                 9215233
       11
                              2941948662
##
  22
       19
                June 2023
                              2956435224
                                                14486562
##
  23
       27
                June 2023
                              2985892628
                                                29457404
## 24
                July 2023
        5
                              3009881599
                                                23988971
                July 2023
## 25
       13
                              3027823781
                                                17942182
                July 2023
##
  26
       21
                              3043670914
                                                15847133
##
  27
       29
                July 2023
                              3056263820
                                                12592906
##
   28
        6
              August 2023
                              3068262616
                                                11998796
##
  29
              August 2023
       14
                              3081768900
                                                13506284
##
   30
       22
              August 2023
                              3095929026
                                                14160126
   31
##
       30
              August 2023
                              3106367373
                                                10438347
##
  32
        7 September 2023
                              3122512475
                                                16145102
##
   33
       15 September 2023
                              3133129472
                                                10616997
##
   34
       23 September 2023
                              3145011950
                                                11882478
##
   35
             October 2023
                              3157591416
                                                12579466
        1
             October 2023
##
  36
        9
                              3169191993
                                                11600577
##
   37
       17
             October 2023
                              3181076729
                                                11884736
##
  38
       25
             October 2023
                              3191044070
                                                 9967341
##
   39
           November 2023
                              3202661578
                                                11617508
       10
           November 2023
## 40
                              3212486353
                                                 9824775
  41
       18
           November 2023
##
                              3221934010
                                                 9447657
## 42
       26
           November 2023
                              3232103226
                                                10169216
   43
           December 2023
                              3243182015
                                                11078789
##
   44
       12
           December 2023
                              3254301659
                                                11119644
   45
##
       20
           December 2023
                              3268840215
                                                14538556
##
   46
       28
            December 2023
                              3278211346
                                                 9371131
## 47
        5
             January 2024
                              3288597261
                                                10385915
## 48
       13
             January 2024
                              3298588679
                                                 9991418
##
  49
       21
             January 2024
                              3311328516
                                                12739837
##
   50
       29
             January 2024
                              3322953024
                                                11624508
##
      Total Views of Videos Posted that Week Number Videos Posted
## 1
                                        1686685
                                                                      2
## 2
                                        3868870
                                                                      3
## 3
                                        3386381
                                                                      2
## 4
                                        3519630
                                                                      3
## 5
                                        2275954
                                                                      2
                                                                      2
## 6
                                        3436121
## 7
                                                                      2
                                        1441645
## 8
                                                                      3
                                        2620191
## 9
                                                                      4
                                        6481835
## 10
                                                                      3
                                        3035189
## 11
                                        4855481
                                                                      4
## 12
                                                                      3
                                        1994275
## 13
                                        4410841
                                                                      4
## 14
                                                                      3
                                        4880999
## 15
                                        2890042
                                                                      3
## 16
                                        6271837
                                                                      4
## 17
                                        3870685
                                                                      3
## 18
                                        7269584
                                                                      4
## 19
                                        2325618
                                                                      3
## 20
                                        5556022
                                                                      4
```

##	21						4252415		
##	22						5484814	:	
##	23						13882853	}	
##	24						4452081		
##	25						6999184	:	
##							3831462		
##							6313003		
##							4638467		
##							3403611		
##									
##							6380212		
							4726224		
##							7210340		
##							3661877		
##							5134042		
##							3129607		
##	36						4002739)	
##	37						5739373	1	
##	38						2977481		
##	39						3629886	;	
##	40						2590855		
##	41						5377169)	
##	42						2015374	:	
##	43						2186709)	
##	44						3527577	•	
##							3100627		
##							3477939		
##							2102020		
##	48						2291395		
## ##	48 49						2291395 2913832	; !	
## ## ##	48 49	A	Vierg	۰f	Vidoo	Dogtod	2291395 2913832 2194338	; !	
## ## ## ##	48 49 50	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week	; !	
## ## ## ##	48 49 50	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343	; !	
## ## ## ## ##	48 49 50 1 2	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623	; !	
## ## ## ## ## ##	48 49 50 1 2 3	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191	; !	
## ## ## ## ## ##	48 49 50 1 2 3 4	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210	; !	
## ## ## ## ## ##	48 49 50 1 2 3 4 5	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977	; !	
## ## ## ## ## ##	48 49 50 1 2 3 4 5	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061	; !	
## ## ## ## ## ##	48 49 50 1 2 3 4 5 6	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977	; !	
## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061	; !	
## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7 8	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823	; !	
## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7 8 9	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397	; !	
## ## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7 8 9 10	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459	; !	
## ## ## ## ## ## ## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7 8 9 10 11	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730	; !	
## ## ## ## ## ## ## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7 8 9 10 11	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870	; !	
## ## ## ## ## ## ## ## ## ## ## ## ##	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758	; !	
######################################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710	; !	
# # # # # # # # # # # # # # # # # # #	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000	; !	
######################################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959	; !	
#######################################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228	; !	
# # # # # # # # # # # # # # # # # # #	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228 1817396	; !	
#######################################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228 1817396 775206	; !	
##############################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228 1817396 775206 1389006	; !	
##############################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228 1817396 775206 1389006 1417472	; !	
################################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228 1817396 775206 1389006 1417472 1828271	; !	
##############################	48 49 50 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22	Avg.	Views	of	Videos	Posted	2291395 2913832 2194338 that Week 843343 1289623 1693191 1173210 1137977 1718061 720823 873397 1620459 1011730 1213870 664758 1102710 1627000 963347 1567959 1290228 1817396 775206 1389006 1417472	; !	

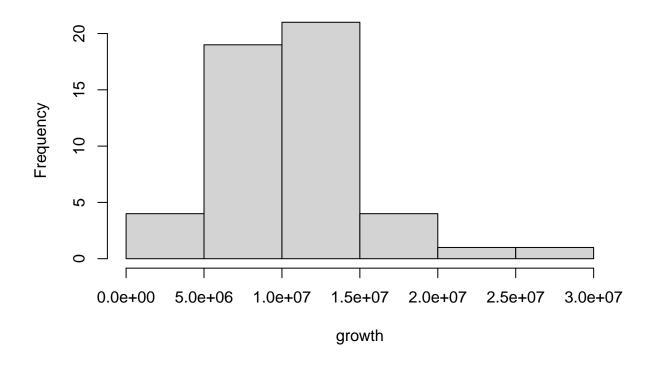
##	24					14	184027	7
##	25					17	749796	3
##	26					12	277154	l.
##	27					15	578251	L
##	28					1.5	546156	3
##							134537	
##							595053	
##							575408	
##							302585	
##	33					12	220626	3
##	34					17	711347	7
##	35					10	043202	2
##	36					13	334246	3
##	37					14	134843	3
	38						992494	
##	39						907472	
##							363618	
##							344292	
##	42						371791	
##	43					10	093355	5
##	44					8	381894	l.
##	45					10	033542	2
##	46					8	369485	5
##	47					7	700673	3
##	48					Ę	572849	9
##	49						971277	
##							731446	
	-							
##		Total	Duration	٥f	Videos	Posted		
##	1	Total	Duration	of	Videos	Posted		Week
##		Total	Duration	of	Videos	Posted		Week 323
## ##	2	Total	Duration	of	Videos	Posted		Week 323 980
## ## ##	2	Total	Duration	of	Videos	Posted		Week 323 980 47
## ##	2	Total	Duration	of	Videos	Posted		Week 323 980
## ## ##	2 3 4	Total	Duration	of	Videos	Posted		Week 323 980 47
## ## ## ##	2 3 4 5	Total	Duration	of	Videos	Posted		Week 323 980 47 92
## ## ## ## ##	2 3 4 5	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42
## ## ## ## ##	2 3 4 5 6	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72
## ## ## ## ##	2 3 4 5 6 7 8	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48
## ## ## ## ## ##	2 3 4 5 6 7 8 9	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146
## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63
## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10 11	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144
## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10 11 12	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54
## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10 11 12 13	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54
## ## ## ## ## ## ## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10 11 12 13 14	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102
## ## ## ## ## ## ## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10 11 12 13 14 15	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102 93
## ## ## ## ## ## ## ## ## ## ## ## ##	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 158 102 93 130
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 158 102 93 130 126
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102 93 130 126 153
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102 93 130 126 153 82
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102 93 130 126 153
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102 93 130 126 153 82
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 54 158 102 93 130 126 153 82 174
######################################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 158 102 93 130 126 153 82 174 116 133
#########################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 158 102 93 130 126 153 82 174 116 133 154
#########################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 158 102 93 130 126 153 82 174 116 133 154 115
##########################	2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23	Total	Duration	of	Videos	Posted		Week 323 980 47 92 42 72 48 45 146 63 144 158 102 93 130 126 153 82 174 116 133 154

##	27	180
##	28	130
##	29	118
##	30	171
##	31	129
##	32	169
##	33	127
##	34	127
##	35	142
##	36	131
##	37	151
##	38	119
##	39	200
##	40	120
##	41	205
##	42	128
##	43	103
##	44	151
##	45	130
##	46	226
##	47	877
##	48	1023
##	49	125
##	50	158

First focus on viewership only

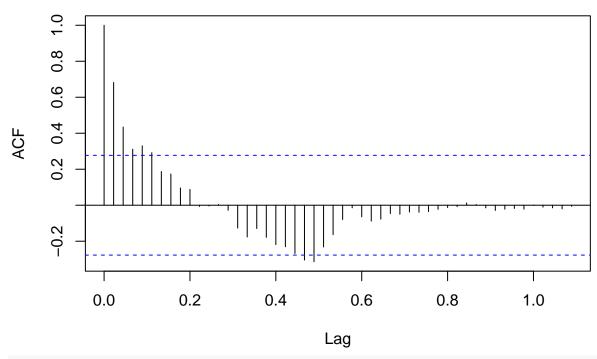
hist(growth)

Histogram of growth



acf(growth, lag.max = 50)

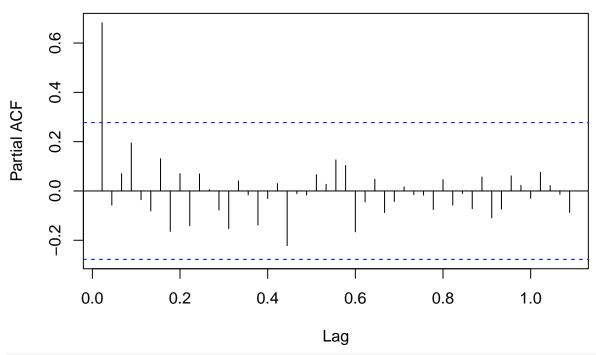
Total Viewers



MA(2)?

pacf(growth, lag.max = 50)

Series growth



```
#only significant at lag 1 (AR(1))
```

Forecasting growth without intervention

```
# train - test split
train_pre <- pre_roa[1:17]
test_pre <- pre_roa[18:22]

# AR(1) model

#t <- 1:length(train_pre)
#noint_model <- lm(formula = pre_roa ~ t)

ar1 <- sarima(train_pre, 1, 0, 0, P = 0, D = 0, Q = 0)

## initial value 14.560831</pre>
```

```
## iter
         2 value 14.454468
## iter
          3 value 14.441005
## iter
          4 value 14.415382
## iter
          5 value 14.414876
## iter
          6 value 14.414655
          6 value 14.414655
## iter
## final value 14.414655
## converged
## initial value 14.496742
## iter
          2 value 14.485651
## iter
          3 value 14.481763
          4 value 14.481496
## iter
        5 value 14.481484
## iter
## iter
         5 value 14.481484
```

```
5 value 14.481484
## iter
## final value 14.481484
## converged
## <><><><><>
## Coefficients:
##
              Estimate
                                 SE t.value p.value
                             0.2171 2.3152 0.0352
                0.5026
## ar1
## xmean 6266169.1357 900995.8430 6.9547 0.0000
##
## sigma^2 estimated as 3.724061e+12 on 15 degrees of freedom
##
## AIC = 32.15379 AICc = 32.20421 BIC = 32.30082
##
     Model: (1,0,0)
                                     Standardized Residuals
  0.0
   _
5
                                                     10
                                                                               15
                                               Time
                 ACF of Residuals
                                                        Normal Q-Q Plot of Std Residuals
                                               Sample Quantiles
                                                  0
                          8
                               10
                                     12
                       LAG
                                                                 Theoretical Quantiles
                                 p values for Ljung-Box statistic
p value
                                            10
                                                                  15
                                                                                         20
                                              LAG (H)
# ARMA(1, 2)
ar1_ma2 \leftarrow sarima(train_pre, 1, 0, 2, P = 0, D = 0, Q = 0)
## initial value 14.560831
          2 value 14.549241
## iter
## iter
          3 value 14.451523
## iter
          4 value 14.419840
## iter
          5 value 14.397602
          6 value 14.280453
## iter
## iter
          7 value 14.270940
          8 value 14.240431
## iter
## iter
          9 value 14.178564
```

```
## iter 10 value 14.164847
## iter 11 value 14.151673
## iter 12 value 14.110410
## iter 13 value 14.104645
## iter
        14 value 14.082963
## iter 15 value 14.073591
## iter 16 value 14.069513
## iter 17 value 14.062022
## iter 18 value 14.057450
## iter
       19 value 14.055355
## iter
        20 value 14.053263
## iter
        21 value 14.035690
## iter
       22 value 14.025868
## iter 22 value 14.025868
## iter 23 value 14.025360
## iter 24 value 14.025280
## iter 25 value 14.025130
## iter
        26 value 14.025016
## iter 27 value 14.024916
## iter 28 value 14.024796
## iter 29 value 14.024704
## iter 30 value 14.024584
## iter 31 value 14.024493
        32 value 14.024374
## iter
## iter 33 value 14.024282
## iter
       34 value 14.024164
## iter
        35 value 14.024072
        36 value 14.023955
## iter
## iter
        37 value 14.023862
## iter
       38 value 14.023746
## iter 39 value 14.023652
## iter
        40 value 14.023538
## iter
        41 value 14.023442
## iter 42 value 14.023330
## iter 43 value 14.023233
## iter 44 value 14.023122
## iter 45 value 14.023025
## iter 46 value 14.022915
## iter 47 value 14.022816
## iter 48 value 14.022708
        49 value 14.022608
## iter
## iter 50 value 14.022501
## iter 51 value 14.022401
## iter 52 value 14.022295
## iter 53 value 14.022193
## iter 54 value 14.022089
## iter 55 value 14.021986
       56 value 14.021883
## iter
## iter 57 value 14.021780
## iter 58 value 14.021678
## iter 59 value 14.021573
## iter 60 value 14.021473
## iter 61 value 14.021368
## iter 62 value 14.021268
```

```
## iter 63 value 14.021162
## iter 64 value 14.021064
## iter 65 value 14.020957
## iter
        66 value 14.020860
## iter
        67 value 14.020752
## iter 68 value 14.020657
## iter 69 value 14.020548
        70 value 14.020453
## iter
## iter
        71 value 14.020343
## iter
        72 value 14.020251
## iter
        73 value 14.020140
        74 value 14.020048
## iter
        75 value 14.019936
## iter
## iter
        76 value 14.019846
## iter 77 value 14.019733
## iter
        78 value 14.019644
## iter 79 value 14.019531
## iter
        80 value 14.019443
## iter 81 value 14.019328
## iter 82 value 14.019242
## iter 83 value 14.019126
## iter 84 value 14.019042
## iter 85 value 14.018925
        86 value 14.018841
## iter
## iter 87 value 14.018724
## iter
        88 value 14.018641
## iter
        89 value 14.018523
        90 value 14.018442
## iter
## iter
        91 value 14.018323
## iter 92 value 14.018243
## iter 93 value 14.018123
## iter 94 value 14.018044
## iter
        95 value 14.017923
## iter 96 value 14.017846
## iter 97 value 14.017724
## iter 98 value 14.017648
## iter 99 value 14.017525
## iter 100 value 14.017450
## final value 14.017450
## stopped after 100 iterations
## initial value 14.612216
## iter
        2 value 14.550963
        3 value 14.487569
## iter
## iter
        4 value 14.485066
## iter
          5 value 14.483358
## iter
          6 value 14.483209
## iter
          7 value 14.483077
          8 value 14.483011
## iter
## iter
         9 value 14.482547
## iter
       10 value 14.482000
        11 value 14.481448
## iter
## iter 12 value 14.481219
## iter 13 value 14.481209
## iter 14 value 14.481167
```

```
## iter 15 value 14.481119
## iter 16 value 14.481089
        17 value 14.481084
        18 value 14.481083
## iter
## iter 18 value 14.481083
## iter 18 value 14.481083
## final value 14.481083
## converged
## <><><><>
##
## Coefficients:
##
              Estimate
                                 SE t.value p.value
## ar1
               0.5352
                            0.7279 0.7353 0.4752
               -0.0235
                            0.7456 -0.0316 0.9753
## ma1
## ma2
               -0.0378
                            0.3833 -0.0985
                                             0.9230
## xmean 6262476.1788 931110.8309 6.7258
                                             0.0000
##
## sigma^2 estimated as 3.720567e+12 on 13 degrees of freedom
## AIC = 32.38828 AICc = 32.58436 BIC = 32.63334
##
     Model: (1,0,2)
                                     Standardized Residuals
  0.
  0.0
   -1.5
                                                     10
                                                                              15
                                               Time
                 ACF of Residuals
                                                        Normal Q-Q Plot of Std Residuals
                                               Sample Quantiles
   9.4
ACF
  0.0
                                                  0
                                                  7
                                     12
                                                    -2
                       LAG
                                                                 Theoretical Quantiles
                                 p values for Ljung-Box statistic
p value
                                      10
                                                               15
                                                                                         20
                                              LAG (H)
# ARMA(1, 1)
ar1_ma1 \leftarrow sarima(train_pre, 1, 0, 1, P = 0, D = 0, Q = 0)
## initial value 14.560831
## iter
        2 value 14.550320
```

```
## iter
         3 value 14.443753
## iter
        4 value 14.419103
         5 value 14.404919
## iter
## iter
         6 value 14.363494
## iter
         7 value 14.353003
## iter
         8 value 14.232056
         9 value 14.220365
## iter
## iter 10 value 14.202507
## iter
        11 value 14.193284
## iter
        12 value 14.184163
## iter
        13 value 14.183098
## iter
        14 value 14.170050
## iter
        15 value 14.163938
## iter
        16 value 14.157764
## iter 17 value 14.147669
## iter
        18 value 14.132436
        19 value 14.117223
## iter
## iter
        20 value 14.117007
        21 value 14.107178
## iter
## iter 22 value 14.060340
## iter 23 value 14.059482
## iter 24 value 14.057704
## iter 25 value 14.056848
        26 value 14.011620
## iter
## iter 26 value 14.011620
## iter
        27 value 14.011006
## iter
        27 value 14.011006
        28 value 14.010965
## iter
## iter
        29 value 14.010965
## iter
       30 value 14.010916
## iter
        31 value 14.010913
## iter
        32 value 14.010866
## iter
        33 value 14.010864
        34 value 14.010817
## iter
## iter
        35 value 14.010815
## iter
        36 value 14.010768
## iter
        37 value 14.010765
## iter 38 value 14.010718
## iter
        39 value 14.010716
## iter 40 value 14.010669
        41 value 14.010667
## iter
## iter
       42 value 14.010620
        43 value 14.010618
## iter
        44 value 14.010571
## iter
        45 value 14.010569
## iter
## iter 46 value 14.010522
## iter
        47 value 14.010520
        48 value 14.010473
## iter
## iter 49 value 14.010471
## iter 50 value 14.010424
## iter 51 value 14.010422
## iter 52 value 14.010375
## iter 53 value 14.010373
## iter 54 value 14.010327
```

```
## iter 55 value 14.010325
## iter 56 value 14.010278
## iter 57 value 14.010276
## iter 58 value 14.010230
## iter
        59 value 14.010228
## iter 60 value 14.010181
## iter 61 value 14.010179
## iter 62 value 14.010133
## iter 63 value 14.010131
        64 value 14.010085
## iter
## iter
        65 value 14.010083
## iter
        66 value 14.010036
## iter
       67 value 14.010034
        68 value 14.009988
## iter
## iter 69 value 14.009986
## iter
        70 value 14.009940
## iter 71 value 14.009938
## iter
        72 value 14.009892
## iter
       73 value 14.009890
## iter
        74 value 14.009844
## iter 75 value 14.009842
## iter 76 value 14.009796
## iter 77 value 14.009795
## iter
        78 value 14.009749
## iter 79 value 14.009747
## iter
       80 value 14.009701
## iter 81 value 14.009699
       82 value 14.009653
## iter
## iter
       83 value 14.009652
## iter 84 value 14.009606
## iter 85 value 14.009604
## iter
       86 value 14.009558
## iter
        87 value 14.009557
## iter 88 value 14.009511
## iter 89 value 14.009509
## iter 90 value 14.009464
## iter 91 value 14.009462
## iter 92 value 14.009416
## iter 93 value 14.009415
## iter 94 value 14.009369
       95 value 14.009368
## iter
## iter 96 value 14.009322
## iter 97 value 14.009321
## iter 98 value 14.009275
## iter 99 value 14.009274
## iter 100 value 14.009228
## final value 14.009228
## stopped after 100 iterations
## initial value 14.612216
        2 value 14.560760
## iter
## iter
        3 value 14.484787
## iter
        4 value 14.484389
## iter
        5 value 14.483217
## iter
        6 value 14.481384
```

```
7 value 14.481354
## iter
          7 value 14.481353
## iter
          7 value 14.481353
## iter
## final value 14.481353
## converged
## <><><><>
## Coefficients:
##
             Estimate
                                 SE t.value p.value
               0.4734
                                    0.9532 0.3567
## ar1
                             0.4967
## ma1
                0.0365
                             0.5478
                                     0.0666
                                              0.9478
## xmean 6277441.4932 898531.8875
                                    6.9863
                                             0.0000
## sigma^2 estimated as 3.723499e+12 on 14 degrees of freedom
##
## AIC = 32.27117 AICc = 32.37977 BIC = 32.46722
##
    Model: (1,0,1)
                                     Standardized Residuals
  0.1
  0.0
  -1.5
                                                     10
                                                                               15
                                               Time
                 ACF of Residuals
                                                        Normal Q-Q Plot of Std Residuals
                                               Sample Quantiles
  0.4
  0.0
                                                  0
                                                  7
                          8
                                10
                                     12
                                           14
                                                    -2
                                                                        0
                       LAG
                                                                 Theoretical Quantiles
                                 p values for Ljung-Box statistic
p value
                           0
                                         10
                 5
                                                                 15
                                                                                         20
                                              LAG (H)
# models virtually indistinguishable from eachother (AR(1) slightly
# lower AIC and BIC and has less parameters)
print(ar1$ICs)
##
        AIC
                 AICc
                           BIC
## 32.15379 32.20421 32.30082
print(ar1_ma2$ICs)
```

AIC

AICc

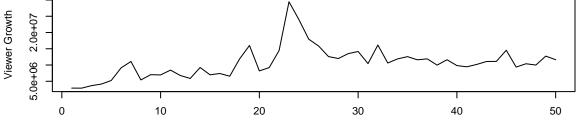
##

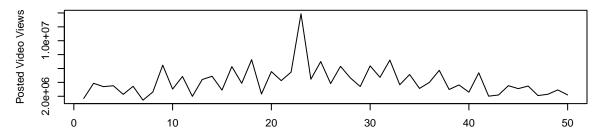
BIC

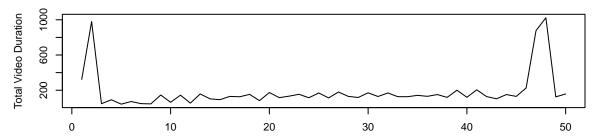
```
## 32.38828 32.58436 32.63334
print(ar1_ma1$ICs)
                 AICc
##
        AIC
                            BIC
## 32.27117 32.37977 32.46722
# no pattern in residuals (no autocorrelation)
# standardized residuals over time still show some
# test model on test data
#ar1_forecast <- forecast(train_pre, h = 5)</pre>
ar1_forecast <- sarima.for(ts(train_pre), n.ahead = 5, 1, 0, 0)</pre>
    1e+07
    8e+06
ts(train_pre)
    90+99
    4e+06
    2e+06
                                            10
                         5
                                                               15
                                                                                  20
                                                Time
ar1_pred <- ar1_forecast$pred</pre>
ar1_pred
## Time Series:
## Start = 18
## End = 22
## Frequency = 1
## [1] 6411432 6339185 6302871 6284617 6275442
#unlist(list(pre_roa, noint_pred))
# predictions for test_pre
mape <- function(actual, prediction){</pre>
  return(mean(abs((actual - prediction)/actual)) * 100)
mape(test_pre, ar1_pred)
```

```
# high mape makes sense - peak right after train set ends
```

Multivariate analysis







Sometimes, peaks in viewership do not coincide with that weeks video views and vice versa. Videos that may have performed well at the time may not have performed well in comparison to other weeks.

Videos posted during Anthony's return have maintained the highest overall views at the time and going foreward.

Video duration consistent aside from December and January when they posted 4-9 hour themed compilations of videos from that year.

Notes:

Viewers instead of subscribers - Smosh channels old and contained many kinds of content and cast members (don't have accurate data for those)

• Viewership based on number of new channel views in 8 day period

• Viewership from the time it was measured, but average video views recorded second week of January, so they include all views from video posted until January 2024.

8 day period instead of 7/1 week - this was based on the way videos were posted on the channel

• 45 8 day blocks (7 days inclusive)

Use viewership changes vs total views - total views don't capture changes in viewership well (ie. 200,000 is a big jump over 8 days, but very small compared to 3mil)

- no way to know who watched what videos (and different series/video types have different audiences) Anthony usually makes appearences on Smosh main channel and Smosh Pit.
 - Pit felt more interesting to follow overtime since all the cast appears there