

Time series with R

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9721350001

```
> data <- read.csv("C:/Users/BEHINLAPTOP/Desktop/ts.csv")
```

> data

date AQI

- 1 1401/01/01 66
- 2 1401/01/02 69
- 3 1401/01/03 63
- 4 1401/01/04 76
- 5 1401/01/05 69
- 6 1401/01/06 43
- 7 1401/01/07 46
- 8 1401/01/08 50
- 9 1401/01/09 60
- 10 1401/01/10 71
- 11 1401/01/11 78
- 12 1401/01/12 53
- 13 1401/01/13 74
- 14 1401/01/14 83
- 15 1401/01/15 67
- 16 1401/01/16 74
- 17 1401/01/17 94
- 18 1401/01/18 64
- 19 1401/01/19 150
- 20 1401/01/20 174
- 21 1401/01/21 150
- 22 1401/01/22 104
- 23 1401/01/23 79
- 24 1401/01/24 96
- 25 1401/01/25 74

- 26 1401/01/26 78
- 27 1401/01/27 58
- 28 1401/01/28 81
- 29 1401/01/29 62
- 30 1401/01/30 62
- 31 1401/02/01 103
- 32 1401/02/02 95
- 33 1401/02/03 83
- 34 1401/02/04 70
- 35 1401/02/05 68
- 36 1401/02/06 126
- 37 1401/02/07 88
- 38 1401/02/08 123
- 39 1401/02/09 66
- 40 1401/02/10 77
- 41 1401/02/11 90
- 42 1401/02/12 76
- 43 1401/02/13 93
- 44 1401/02/14 63
- 45 1401/02/15 71
- 46 1401/02/16 78
- 47 1401/02/17 98
- 48 1401/02/18 156
- 49 1401/02/19 102
- 50 1401/02/20 69
- 51 1401/02/21 64
- 52 1401/02/22 93
- 53 1401/02/23 83

- 54 1401/02/24 54
- 55 1401/02/25 62
- 56 1401/02/26 103
- 57 1401/02/27 174
- 58 1401/02/28 157
- 59 1401/02/29 86
- 60 1401/02/30 80
- 61 1401/03/01 92
- 62 1401/03/02 102
- 63 1401/03/03 95
- 64 1401/03/04 457
- 65 1401/03/05 126
- 66 1401/03/06 69
- 67 1401/03/07 101
- 68 1401/03/08 75
- 69 1401/03/09 85
- 70 1401/03/10 98
- 71 1401/03/11 84
- 72 1401/03/12 86
- 73 1401/03/13 88
- 74 1401/03/14 122
- 75 1401/03/15 150
- 76 1401/03/16 85
- 77 1401/03/17 57
- 78 1401/03/18 81
- 79 1401/03/19 89
- 80 1401/03/20 66
- 81 1401/03/21 76

- 82 1401/03/22 85
- 83 1401/03/23 95
- 84 1401/03/24 78
- 85 1401/03/25 71
- 86 1401/03/26 65
- 87 1401/03/27 80
- 88 1401/03/28 100
- 89 1401/03/29 106
- 90 1401/03/30 107
- 91 1401/04/01 91
- 92 1401/04/02 81
- 93 1401/04/03 95
- 94 1401/04/04 91
- 95 1401/04/05 87
- 96 1401/04/06 113
- 97 1401/04/07 102
- 98 1401/04/08 88
- 99 1401/04/09 104
- 100 1401/04/10 160
- 101 1401/04/11 102
- 102 1401/04/12 110
- 103 1401/04/13 192
- 104 1401/04/14 104
- 105 1401/04/15 96
- 106 1401/04/16 80
- 107 1401/04/17 82
- 108 1401/04/18 107
- 109 1401/04/19 91

- 110 1401/04/20 110
- 111 1401/04/21 102
- 112 1401/04/22 85
- 113 1401/04/23 100
- 114 1401/04/24 139
- 115 1401/04/25 159
- 116 1401/04/26 140
- 117 1401/04/27 112
- 118 1401/04/28 121
- 119 1401/04/29 113
- 120 1401/04/30 99
- 121 1401/05/01 91
- 122 1401/05/02 102
- 123 1401/05/03 134
- 124 1401/05/04 100
- 125 1401/05/05 123
- 126 1401/05/06 127
- 127 1401/05/07 83
- 128 1401/05/08 67
- 129 1401/05/09 70
- 130 1401/05/10 72
- 131 1401/05/11 71
- 132 1401/05/12 169
- 133 1401/05/13 106
- 134 1401/05/14 87
- 135 1401/05/15 100
- 136 1401/05/16 76
- 137 1401/05/17 122

- 138 1401/05/18 129
- 139 1401/05/19 83
- 140 1401/05/20 74
- 141 1401/05/21 121
- 142 1401/05/22 86
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- 144 1401/05/24 101
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- 148 1401/05/28 101
- 149 1401/05/29 127
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- 151 1401/06/01 100
- 152 1401/06/02 86
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- 154 1401/06/04 75
- 155 1401/06/05 84
- 156 1401/06/06 84
- 157 1401/06/07 99
- 158 1401/06/08 86
- 159 1401/06/09 90
- 160 1401/06/10 97
- 161 1401/06/11 139
- 162 1401/06/12 93
- 163 1401/06/13 96
- 164 1401/06/14 90
- 165 1401/06/15 107

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166 1401/06/16 93
167 1401/06/17 81
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169 1401/06/19 100
170 1401/06/20 77
171 1401/06/21 71
172 1401/06/22 70
173 1401/06/23 94
174 1401/06/24 98
175 1401/06/25 77
176 1401/06/26 71
177 1401/06/27 92
178 1401/06/28 98
179 1401/06/29 93
180 1401/06/30 96
> library(forcats)
> myts <- ts(data$AQI, frequency=365, start=c(1401,01,01),end=c(1401,06,31))
>
> myts2 <- as.ts(ts(myts, start=c(1401,01,01), end=c(1401,06,31)))
>
> arimadata=auto.arima(myts)
Error in auto.arima(myts): could not find function "auto.arima"
> library(forecast)
Registered S3 method overwritten by 'quantmod':
 method
               from
 as.zoo.data.frame zoo
```

```
Warning message:
package 'forecast' was built under R version 4.2.2
> arimadata=auto.arima(myts)
> forecast(arimadata,h=181)
     Point Forecast Lo 80 Hi 80 Lo 95 Hi 95
1401.0164
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0192
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0219
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0247
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0274
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0301
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0329
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0356
1401.0384
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0411
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0438
1401.0466
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0493
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0521
1401.0548
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0575
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0603
1401.0630
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0658
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.0685
1401.0712
             64.33333 49.84179 78.82488 42.17042 86.49624
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1401.0740	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0767	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0795	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0822	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0849	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0877	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0904	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0932	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0959	64.33333 49.84179 78.82488 42.17042 86.49624
1401.0986	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1014	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1041	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1068	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1096	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1123	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1151	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1178	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1205	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1233	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1260	64.33333 49.84179 78.82488 42.17042 86.49624
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1401.1315	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1342	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1370	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1397	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1425	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1452	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1479	64.33333 49.84179 78.82488 42.17042 86.49624

1401.1507	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1534	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1562	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1589	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1616	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1644	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1671	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1699	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1726	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1753	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1781	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1808	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1836	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1863	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1890	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1918	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1945	64.33333 49.84179 78.82488 42.17042 86.49624
1401.1973	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2000	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2027	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2055	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2082	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2110	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2137	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2164	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2192	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2219	64.33333 49.84179 78.82488 42.17042 86.49624
1401.2247	64.33333 49.84179 78.82488 42.17042 86.49624

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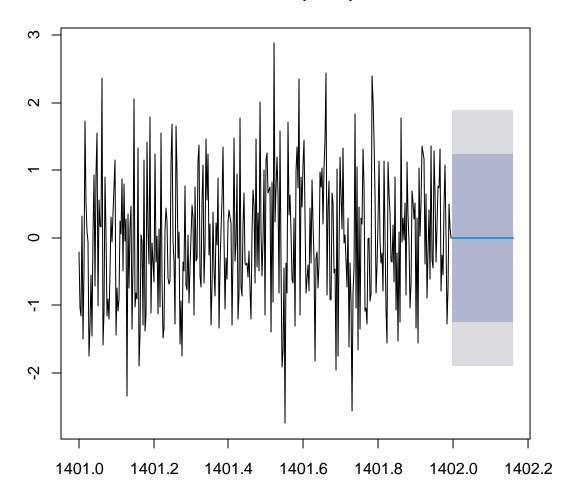
1401.3041	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3068	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3096	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3123	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3151	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3178	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3205	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3233	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3260	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3288	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3315	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3342	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3370	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3397	64.33333 49.84179 78.82488 42.17042 86.49624
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1401.3507	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3534	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3562	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3589	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3616	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3644	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3671	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3699	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3726	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3753	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3781	64.33333 49.84179 78.82488 42.17042 86.49624

1401.3808	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3836	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3863	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3890	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3918	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3945	64.33333 49.84179 78.82488 42.17042 86.49624
1401.3973	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4000	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4027	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4055	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4082	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4110	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4137	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4164	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4192	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4219	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4247	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4274	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4301	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4329	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4356	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4384	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4411	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4438	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4466	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4493	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4521	64.33333 49.84179 78.82488 42.17042 86.49624
1401.4548	64.33333 49.84179 78.82488 42.17042 86.49624

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64.33333 49.84179 78.82488 42.17042 86.49624
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             64.33333 49.84179 78.82488 42.17042 86.49624
1401.4603
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             64.33333 49.84179 78.82488 42.17042 86.49624
1401.4849
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.4877
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.4904
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.4932
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.4959
1401.4986
             64.33333 49.84179 78.82488 42.17042 86.49624
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.5014
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.5041
1401.5068
             64.33333 49.84179 78.82488 42.17042 86.49624
1401.5096
             64.33333 49.84179 78.82488 42.17042 86.49624
> ## Create a daily Date object - helps my work on dates
> inds <- seq(as.Date("1401/01/01"), as.Date("1401/12/30"), by = "day")
> ## Create a time series object
> set.seed(25)
> myts <- ts(rnorm(length(inds)), # random data
       start = c(1401, as.numeric(format(inds[1], "\%i"))),
       frequency = 365)
```

```
>
>
>
> as.numeric(format(inds[1], "%j"))
[1] 1
>
> ## use auto.arima to choose ARIMA terms
> fit <- auto.arima(myts)
> ## forecast for next 60 time points
> fore <- forecast(fit, h = 60)
> ## plot it
> plot(fore)
```

Forecasts from ARIMA(0,0,0) with zero mean



> set.seed(25)

> myzoo <- zoo(rnorm(length(inds)), inds)

Error in zoo(rnorm(length(inds)), inds) : could not find function "zoo"

> library(zoo)

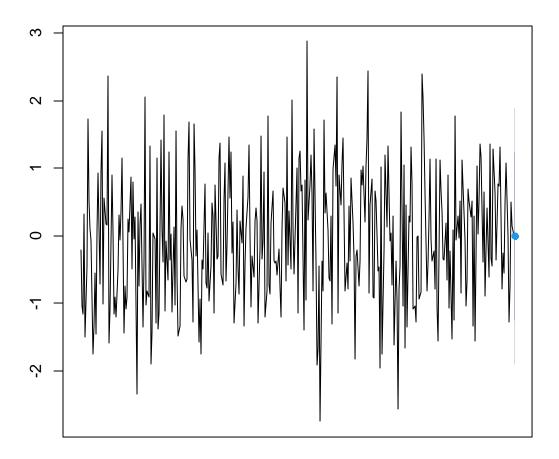
Attaching package: 'zoo'

The following objects are masked from 'package:base':

as.Date, as.Date.numeric

```
Warning message:
package 'zoo' was built under R version 4.2.2
> ## create the zoo object as before
> set.seed(25)
> myzoo <- zoo(rnorm(length(inds)), inds)
>
> ## use auto.arima to choose ARIMA terms
> fit <- auto.arima(myts)
> ## forecast for next 60 time points
> fore <- forecast(fit, h = 1)
> ## plot it
> plot(fore, xaxt = "n") # no x-axis
> Axis(inds, side = 1)
```

Forecasts from ARIMA(0,0,0) with zero mean



plot(fore)

> set.seed(25)

> myzoo <- zoo(rnorm(length(inds)), inds)

Error in zoo(rnorm(length(inds)), inds): could not find function "zoo"

> library(zoo)

Attaching package: 'zoo'

The following objects are masked from 'package:base':

>

```
as.Date, as.Date.numeric
```

```
Warning message:
package 'zoo' was built under R version 4.2.2
> ## create the zoo object as before
> set.seed(25)
> myzoo <- zoo(rnorm(length(inds)), inds)
>
> ## use auto.arima to choose ARIMA terms
> fit <- auto.arima(myts)
> ## forecast for next 60 time points
> fore <- forecast(fit, h = 1)
> ## plot it
> plot(fore, xaxt = "n") # no x-axis
> Axis(inds, side = 1)
> plot(fore, xaxt = "n") # no x-axis
> Axis(inds, side = 1,
     at = seq(inds[1], tail(inds, 1) + 60, by = "3 months"),
     format = "%b %Y")
>
> library(zoo)
> zoo(data\$AQI, seq(from = as.Date("1401/07/01"), to = as.Date("1401/12/30"), by = 1))
```

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1401-07-01 1401-07-02 1401-07-03 1401-07-04 1401-07-05 1401-07-06 1401-07-07
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1401-12-30
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```

```
> library(lubridate)
Attaching package: 'lubridate'
The following objects are masked from 'package:base':
  date, intersect, setdiff, union
> set.seed(42)
> minday = as.Date("1401/07/01")
> maxday = as.Date("1401/12/30")
> dates <- seq(minday, maxday, "days")
> dates <- dates[sample(1:length(dates),length(dates)/4)] # create some holes
> df <- data.frame(date=sort(dates), val=sin(seq(from=0, to=2*pi, length=length(dates))))
> df
     date
               val
1 1401-07-03 0.000000e+00
2 1401-07-04 1.423148e-01
3 1401-07-05 2.817326e-01
4 1401-07-06 4.154150e-01
5 1401-07-20 5.406408e-01
6 1401-07-24 6.548607e-01
7 1401-07-27 7.557496e-01
8 1401-08-05 8.412535e-01
9 1401-08-10 9.096320e-01
10 1401-08-11 9.594930e-01
11 1401-08-12 9.898214e-01
12 1401-08-16 1.000000e+00
```

- 13 1401-08-18 9.898214e-01
- 14 1401-08-27 9.594930e-01
- 15 1401-09-03 9.096320e-01
- 16 1401-09-06 8.412535e-01
- 17 1401-09-09 7.557496e-01
- 18 1401-09-12 6.548607e-01
- 19 1401-09-27 5.406408e-01
- 20 1401-09-30 4.154150e-01
- 21 1401-10-07 2.817326e-01
- 22 1401-10-08 1.423148e-01
- 23 1401-10-12 1.224606e-16
- 24 1401-10-17 -1.423148e-01
- 25 1401-10-18 -2.817326e-01
- 26 1401-10-19 -4.154150e-01
- 27 1401-10-22 -5.406408e-01
- 28 1401-10-30 -6.548607e-01
- 29 1401-11-05 -7.557496e-01
- 30 1401-11-08 -8.412535e-01
- 31 1401-11-11 -9.096320e-01
- 32 1401-11-13 -9.594930e-01
- 33 1401-11-20 -9.898214e-01
- 34 1401-11-23 -1.000000e+00
- 35 1401-11-27 -9.898214e-01
- 36 1401-11-30 -9.594930e-01
- 37 1401-12-01 -9.096320e-01
- 38 1401-12-02 -8.412535e-01
- 39 1401-12-05 -7.557496e-01
- 40 1401-12-07 -6.548607e-01

