

predicted=31654.510320, expected=31378.000000
predicted=31150.778334, expected=31009.000000
predicted=30839.619972, expected=30438.000000
predicted=30175.868715, expected=29918.000000
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predicted=29224.925668, expected=28703.000000
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predicted=28128.098854, expected=27584.000000
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predicted=25284.361621, expected=24617.000000
predicted=24347.443767, expected=24591.000000
predicted=24579.056844, expected=24242.000000
predicted=24081.736999, expected=24031.000000
predicted=23934.103499, expected=23845.000000
predicted=23759.581959, expected=23769.000000
predicted=23734.092720, expected=23467.000000
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predicted=23102.188903, expected=23052.000000
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predicted=22973.190496, expected=23010.000000
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predicted=22775.055515, expected=22816.000000
predicted=22800.832750, expected=22314.000000
predicted=22083.465525, expected=22720.000000
predicted=22906.407229, expected=22640.000000
predicted=22603.252945, expected=22438.000000
predicted=22345.234745, expected=22489.000000
predicted=22512.401346, expected=22315.000000
predicted=22235.091185, expected=22068.000000
predicted=21954.571019, expected=22279.000000
predicted=22375.863358, expected=22371.000000
predicted=22413.225399, expected=22117.000000
predicted=22000.360047, expected=22058.000000
predicted=22030.892848, expected=22122.000000
predicted=22151.367645, expected=22164.000000
predicted=22183.266761, expected=22102.000000
predicted=22073.515716, expected=22147.000000
predicted=22167.644054, expected=22143.000000
predicted=22141.146131, expected=22544.000000
predicted=22728.100307, expected=22481.000000
predicted=22452.059294, expected=22456.000000
predicted=22444.506108, expected=22528.000000
predicted=22561.042115, expected=22467.000000
predicted=22438.977537, expected=22947.000000
predicted=23167.367446, expected=23894.000000
predicted=24328.819132, expected=24101.000000
predicted=24196.035064, expected=24506.000000
predicted=24691.949717, expected=24975.000000

predicted=25190.343147, expected=25472.000000
predicted=25700.209153, expected=26122.000000
predicted=26420.480260, expected=27076.000000
predicted=27514.122909, expected=27605.000000
predicted=27847.953950, expected=28389.000000
predicted=28749.089700, expected=28988.000000
predicted=29263.138440, expected=29122.000000
predicted=29183.564576, expected=29209.000000
predicted=29248.978475, expected=29953.000000
predicted=30294.740164, expected=29966.000000
predicted=29971.994862, expected=29891.000000
predicted=29856.578727, expected=30102.000000
predicted=30198.930607, expected=30030.000000
predicted=29996.957678, expected=29954.000000
predicted=29919.120185, expected=30164.000000
predicted=30260.470531, expected=30358.000000
predicted=30447.123793, expected=30508.000000
predicted=30576.917136, expected=30858.000000
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predicted=30652.272782, expected=30845.000000
predicted=30903.813883, expected=31153.000000
predicted=31294.482654, expected=31038.000000
predicted=30985.216133, expected=31165.000000
predicted=31223.355415, expected=31186.000000
predicted=31195.675069, expected=31312.000000
predicted=31369.896898, expected=31239.000000
predicted=31205.506061, expected=31529.000000
predicted=31662.213559, expected=31332.000000
predicted=31241.562343, expected=31321.000000
predicted=31315.979997, expected=31491.000000
predicted=31569.102090, expected=31306.000000
predicted=31221.074195, expected=31339.000000
predicted=31354.186120, expected=31498.000000
predicted=31571.049540, expected=31736.000000
predicted=31845.330340, expected=31661.000000
predicted=31626.591514, expected=31738.000000
predicted=31773.394013, expected=31938.000000
predicted=32029.879887, expected=31948.000000
predicted=31952.627133, expected=32025.000000
predicted=32060.395524, expected=32105.000000
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predicted=31040.896829, expected=31042.000000
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predicted=30776.448890, expected=30800.000000
predicted=30772.474884, expected=30879.000000
predicted=30915.308443, expected=30629.000000
predicted=30514.220730, expected=30545.000000
predicted=30506.452301, expected=30337.000000
predicted=30241.506629, expected=30492.000000
predicted=30563.206781, expected=30163.000000
predicted=30011.942952, expected=30231.000000
predicted=30262.252020, expected=30307.000000
predicted=30341.926128, expected=30210.000000

```
predicted=30165.482347, expected=30176.000000
predicted=30160.412362, expected=30161.000000
predicted=30154.137246, expected=30333.000000
predicted=30412.010199, expected=30465.000000
predicted=30525.642662, expected=30467.000000
predicted=30467.945427, expected=30498.000000
predicted=30512.262646, expected=30560.000000
predicted=30588.498435, expected=30602.000000
predicted=30621.314514, expected=30591.000000
predicted=30585.976371, expected=30537.000000
predicted=30512.230100, expected=30432.000000
predicted=30383.809833, expected=30524.000000
predicted=30566.274451, expected=30282.000000
predicted=30170.898403, expected=30008.000000
predicted=29882.201276, expected=29986.000000
predicted=29975.921911, expected=29745.000000
predicted=29634.354278, expected=29723.000000
predicted=29712.920547, expected=29818.000000
predicted=29861.647964, expected=29986.000000
predicted=30063.170979, expected=30014.000000
predicted=30026.882325, expected=29912.000000
predicted=29865.185198, expected=30302.000000
predicted=30481.113997, expected=30693.000000
predicted=30872.578631, expected=31333.000000
predicted=31626.936944, expected=31856.000000
predicted=32096.218197, expected=32543.000000
predicted=32858.554345, expected=32930.000000
predicted=33107.778390, expected=33005.000000
predicted=33039.485584, expected=32819.000000
predicted=32733.616003, expected=32884.000000
predicted=32913.891953, expected=32698.000000
predicted=32612.616186, expected=32619.000000
predicted=32582.756782, expected=32430.000000
```

Traceback (most recent call last):

```
File "D:\Documentos\Faculdade\Eletivas\Modelagem Analítica\modelo_arima_previsao.py",
line 60, in <module>
    model_fit = model.fit(dis=0)
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arima_model.py", line
1197, in fit
    mlefit = super(ARIMA, self).fit(start_params, trend,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arima_model.py", line
996, in fit
    mlefit = super(ARMA, self).fit(start_params, method=solver,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\model.py", line 518,
in fit
    xopt, retvals, optim_settings = optimizer._fit(f, score, start_params,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\optimizer.py", line
215, in _fit
    xopt, retvals = func(objective, gradient, start_params, fargs, kwargs,
```

```

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\optimizer.py", line
437, in _fit_lbfgs
    retvals = optimize.fmin_l_bfgs_b(func, start_params, maxiter=maxiter,

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\lbfgsb.py", line 197, in
fmin_l_bfgs_b
    res = _minimize_lbfgsb(fun, x0, args=args, jac=jac, bounds=bounds,

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\lbfgsb.py", line 360, in
_minimize_lbfgsb
    f, g = func_and_grad(x)

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\differentiable_functions.py", line 201, in func_and_grad
    self._update_grad()

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\differentiable_functions.py", line 171, in _update_grad
    self._update_grad_impl()

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\differentiable_functions.py", line 91, in update_grad
    self.g = approx_derivative(fun_wrapped, self.x, f0=self.f,

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\_numdiff.py", line 426,
in approx_derivative
    return _dense_difference(fun_wrapped, x0, f0, h,

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\_numdiff.py", line 497,
in _dense_difference
    df = fun(x) - f0

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\_numdiff.py", line 377,
in fun_wrapped
    f = np.atleast_1d(fun(x, *args, **kwargs))

File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\differentiable_functions.py", line 70, in fun_wrapped
    return fun(x, *args)

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\model.py", line 500,
in f
    return -self.loglike(params, *args) / nobs

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arma_model.py", line
810, in loglike
    return self.loglike_kalman(params, set_sigma2)

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arma_model.py", line
820, in loglike_kalman
    return KalmanFilter.loglike(params, self, set_sigma2)

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\kalmanf
\kalmanfilter.py", line 218, in loglike
    loglike, sigma2 = kalman_loglike.kalman_loglike_double(

```

```
File "statsmodels\tsa\kalmanf\kalman_loglike.pyx", line 333, in
statsmodels.tsa.kalmanf.kalman_loglike.kalman_loglike_double
```

```
File "<__array_function__ internals>", line 2, in sum
```

KeyboardInterrupt

```
In [2]:          'D:/Documentos/Faculdade/Eletivas/Modelagem Analítica/
modelo_arima_previsao.py'          = 'D:/Documentos/Faculdade/Eletivas/Modelagem Analítica'
C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\base\tsa_model.py:159:
ValueWarning: No frequency information was provided, so inferred frequency 10T will be
used.
```

```
warnings.warn('No frequency information was'
```

ARMA Model Results

```
=====
Dep. Variable:          value    No. Observations:          61343
Model:                  ARMA(1, 0)  Log Likelihood          -437795.128
Method:                  css-mle    S.D. of innovations          304.252
Date:                   Tue, 03 Nov 2020    AIC          875596.257
Time:                   21:12:57    BIC          875623.330
Sample:                 09-01-2018    HQIC         875604.657
                   - 11-01-2019
=====
```

```
=====
              coef      std err          z      P>|z|      [0.025      0.975]
-----
const          2.853e+04    525.554     54.291     0.000     2.75e+04     2.96e+04
ar.L1.value      0.9977       0.000    3641.880     0.000         0.997         0.998
=====
```

Roots

```
=====
              Real          Imaginary          Modulus          Frequency
-----
AR.1          1.0023           +0.0000j           1.0023           0.0000
=====
```

```
0
count  61343.000000
mean    -0.084197
std     304.517596
min     -3140.887713
25%     -194.800756
50%     -13.147789
75%      173.210728
max     1874.508920
predicted=23368.017577, expected=24256.000000
predicted=24265.944156, expected=24260.000000
predicted=24269.934337, expected=23689.000000
predicted=23700.252743, expected=23349.000000
predicted=23361.035188, expected=22896.000000
predicted=22909.075788, expected=22454.000000
predicted=22468.088503, expected=22050.000000
predicted=22065.010234, expected=21672.000000
predicted=21687.872284, expected=21353.000000
predicted=21369.595937, expected=21047.000000
predicted=21064.288166, expected=20873.000000
```

predicted=20890.681456, expected=20613.000000
predicted=20631.267081, expected=20065.000000
predicted=20084.501159, expected=19678.000000
predicted=19698.368125, expected=19483.000000
predicted=19503.804098, expected=19439.000000
predicted=19459.898906, expected=19112.000000
predicted=19133.625734, expected=19179.000000
predicted=19200.473540, expected=18931.000000
predicted=18953.024404, expected=18955.000000
predicted=18976.969722, expected=18881.000000
predicted=18903.131187, expected=18622.000000
predicted=18644.704288, expected=18571.000000
predicted=18593.814247, expected=18416.000000
predicted=18439.153938, expected=18563.000000
predicted=18585.825661, expected=18585.000000
predicted=18607.776221, expected=18559.000000
predicted=18581.832846, expected=18451.000000
predicted=18474.068202, expected=18418.000000
predicted=18441.139008, expected=18637.000000
predicted=18659.653540, expected=18695.000000
predicted=18717.523027, expected=19042.000000
predicted=19063.752713, expected=19297.000000
predicted=19318.184084, expected=19197.000000
predicted=19218.403767, expected=19536.000000
predicted=19556.646405, expected=19615.000000
predicted=19635.470331, expected=20244.000000
predicted=20263.062210, expected=21131.000000
predicted=21148.062734, expected=21630.000000
predicted=21645.932066, expected=22017.000000
predicted=22032.050924, expected=22269.000000
predicted=22283.476358, expected=22895.000000
predicted=22908.045984, expected=23342.000000
predicted=23354.020235, expected=24480.000000
predicted=24489.401038, expected=24902.000000
predicted=24910.424808, expected=25373.000000
predicted=25380.335102, expected=25713.000000
predicted=25719.547380, expected=25976.000000
predicted=25981.936079, expected=26230.000000
predicted=26235.345923, expected=27533.000000
predicted=27535.315696, expected=27932.000000
predicted=27933.386223, expected=28214.000000
predicted=28214.729093, expected=28501.000000
predicted=28501.060295, expected=28656.000000
predicted=28655.699085, expected=29138.000000
predicted=29136.575830, expected=29913.000000
predicted=29909.770308, expected=30283.000000
predicted=30278.908974, expected=30883.000000
predicted=30877.513289, expected=31109.000000
predicted=31102.988608, expected=31531.000000
predicted=31524.008470, expected=31761.000000
predicted=31753.475334, expected=32092.000000
predicted=32083.708369, expected=32260.000000
predicted=32251.319440, expected=32433.000000
predicted=32423.919378, expected=32616.000000
predicted=32606.496376, expected=32821.000000

```
predicted=32811.023430, expected=32814.000000
predicted=32804.040626, expected=32974.000000
predicted=32963.671349, expected=32986.000000
predicted=32975.644253, expected=33061.000000
Traceback (most recent call last):
```

```
File "D:\Documentos\Faculdade\Eletivas\Modelagem Analítica\modelo_arima_previsao.py",
line 60, in <module>
    model_fit = model.fit(dispatch=0)
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arima_model.py", line
996, in fit
    mlefit = super(ARMA, self).fit(start_params, method=solver,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\model.py", line 518,
in fit
    xopt, retvals, optim_settings = optimizer._fit(f, score, start_params,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\optimizer.py", line
215, in _fit
    xopt, retvals = func(objective, gradient, start_params, fargs, kwargs,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\optimizer.py", line
437, in _fit_lbfgs
    retvals = optimize.fmin_l_bfgs_b(func, start_params, maxiter=maxiter,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\lbfgsb.py", line 197, in
fmin_l_bfgs_b
    res = _minimize_lbfgsb(fun, x0, args=args, jac=jac, bounds=bounds,
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize\lbfgsb.py", line 360, in
_minimize_lbfgsb
    f, g = func_and_grad(x)
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\_differentiable_functions.py", line 200, in func_and_grad
    self.update_fun()
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\_differentiable_functions.py", line 166, in _update_fun
    self.update_fun_impl()
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\_differentiable_functions.py", line 73, in update_fun
    self.f = fun_wrapped(self.x)
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\scipy\optimize
\_differentiable_functions.py", line 70, in fun_wrapped
    return fun(x, *args)
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\base\model.py", line 500,
in f
    return -self.loglike(params, *args) / nobs
```

```
File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arima_model.py", line
```

```

810, in loglike
    return self.loglike_kalman(params, set_sigma2)

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\arma_model.py", line
820, in loglike_kalman
    return KalmanFilter.loglike(params, self, set_sigma2)

File "C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\kalmanf
\kalmanfilter.py", line 218, in loglike
    loglike, sigma2 = kalman_loglike.kalman_loglike_double(

File "statsmodels\tsa\kalmanf\kalman_loglike.pyx", line 333, in
statsmodels.tsa.kalmanf.kalman_loglike.kalman_loglike_double

File "<__array_function__ internals>", line 2, in sum

```

KeyboardInterrupt

```

In [3]:          'D:/Documentos/Faculdade/Eletivas/Modelagem Analítica/
modelo_arma_previsao.py'          = 'D:/Documentos/Faculdade/Eletivas/Modelagem Analítica'
C:\Users\kelly\anaconda3\lib\site-packages\statsmodels\tsa\base\tsa_model.py:159:
ValueWarning: No frequency information was provided, so inferred frequency 10T will be
used.

```

```

warnings.warn('No frequency information was'
              ARMA Model Results

```

```

=====
Dep. Variable:          value    No. Observations:          61343
Model:                  ARMA(1, 0)    Log Likelihood          -437795.128
Method:                  css-mle    S.D. of innovations          304.252
Date:                   Tue, 03 Nov 2020    AIC          875596.257
Time:                   21:14:09    BIC          875623.330
Sample:                 09-01-2018    HQIC          875604.657
                  - 11-01-2019

```

```

=====
              coef      std err          z      P>|z|      [0.025      0.975]
-----
const          2.853e+04    525.554     54.291     0.000     2.75e+04     2.96e+04
ar.L1.value      0.9977         0.000    3641.880     0.000         0.997         0.998

```

Roots

```

=====
              Real          Imaginary          Modulus          Frequency
-----
AR.1          1.0023          +0.0000j          1.0023          0.0000
-----

```

```

0
count  61343.000000
mean    -0.084197
std      304.517596
min     -3140.887713
25%     -194.800756
50%      -13.147789
75%      173.210728
max      1874.508920
predicted=23368.017577, expected=24256.000000

```


predicted=24265.944156, expected=24260.000000
predicted=24269.934337, expected=23689.000000
predicted=23700.252743, expected=23349.000000
predicted=23361.035188, expected=22896.000000
predicted=22909.075788, expected=22454.000000
predicted=22468.088503, expected=22050.000000
predicted=22065.010234, expected=21672.000000
predicted=21687.872284, expected=21353.000000
predicted=21369.595937, expected=21047.000000
predicted=21064.288166, expected=20873.000000
predicted=20890.681456, expected=20613.000000
predicted=20631.267081, expected=20065.000000
predicted=20084.501159, expected=19678.000000
predicted=19698.368125, expected=19483.000000
predicted=19503.804098, expected=19439.000000
predicted=19459.898906, expected=19112.000000
predicted=19133.625734, expected=19179.000000
predicted=19200.473540, expected=18931.000000
predicted=18953.024404, expected=18955.000000
predicted=18976.969722, expected=18881.000000
predicted=18903.131187, expected=18622.000000
predicted=18644.704288, expected=18571.000000
predicted=18593.814247, expected=18416.000000
predicted=18439.153938, expected=18563.000000
predicted=18585.825661, expected=18585.000000
predicted=18607.776221, expected=18559.000000
predicted=18581.832846, expected=18451.000000
predicted=18474.068202, expected=18418.000000
predicted=18441.139008, expected=18637.000000
predicted=18659.653540, expected=18695.000000
predicted=18717.523027, expected=19042.000000
predicted=19063.752713, expected=19297.000000
predicted=19318.184084, expected=19197.000000
predicted=19218.403767, expected=19536.000000
predicted=19556.646405, expected=19615.000000
predicted=19635.470331, expected=20244.000000
predicted=20263.062210, expected=21131.000000
predicted=21148.062734, expected=21630.000000
predicted=21645.932066, expected=22017.000000
predicted=22032.050924, expected=22269.000000
predicted=22283.476358, expected=22895.000000
predicted=22908.045984, expected=23342.000000
predicted=23354.020235, expected=24480.000000
predicted=24489.401038, expected=24902.000000
predicted=24910.424808, expected=25373.000000
predicted=25380.335102, expected=25713.000000
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predicted=25981.936079, expected=26230.000000
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