

# Análisis de Eficiencia de Algoritmos

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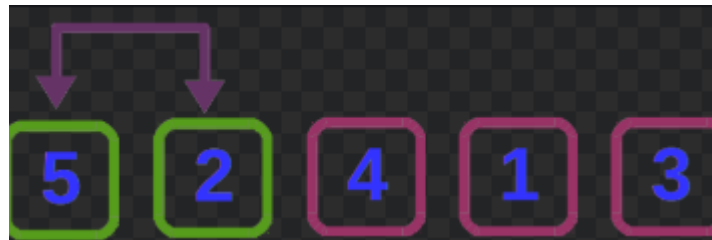
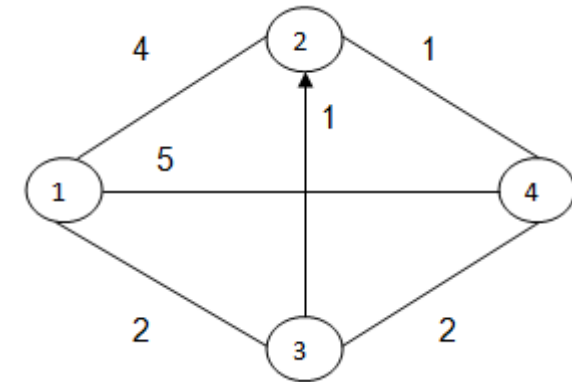
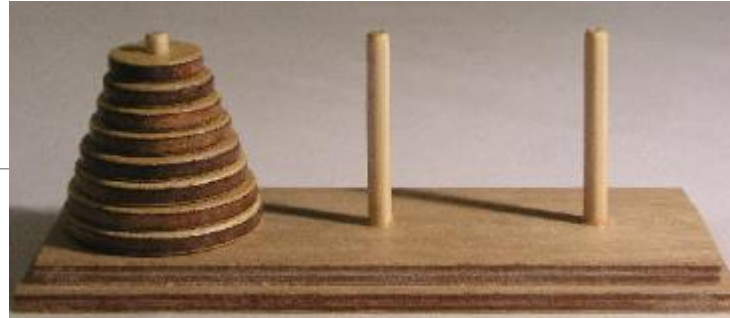
# Descripción

Seleccionados:

- Floyd
- Hanoi
- Inserción
- Quicksort

Cálculos:

- Empírico
- Híbrido
- Constantes ocultas

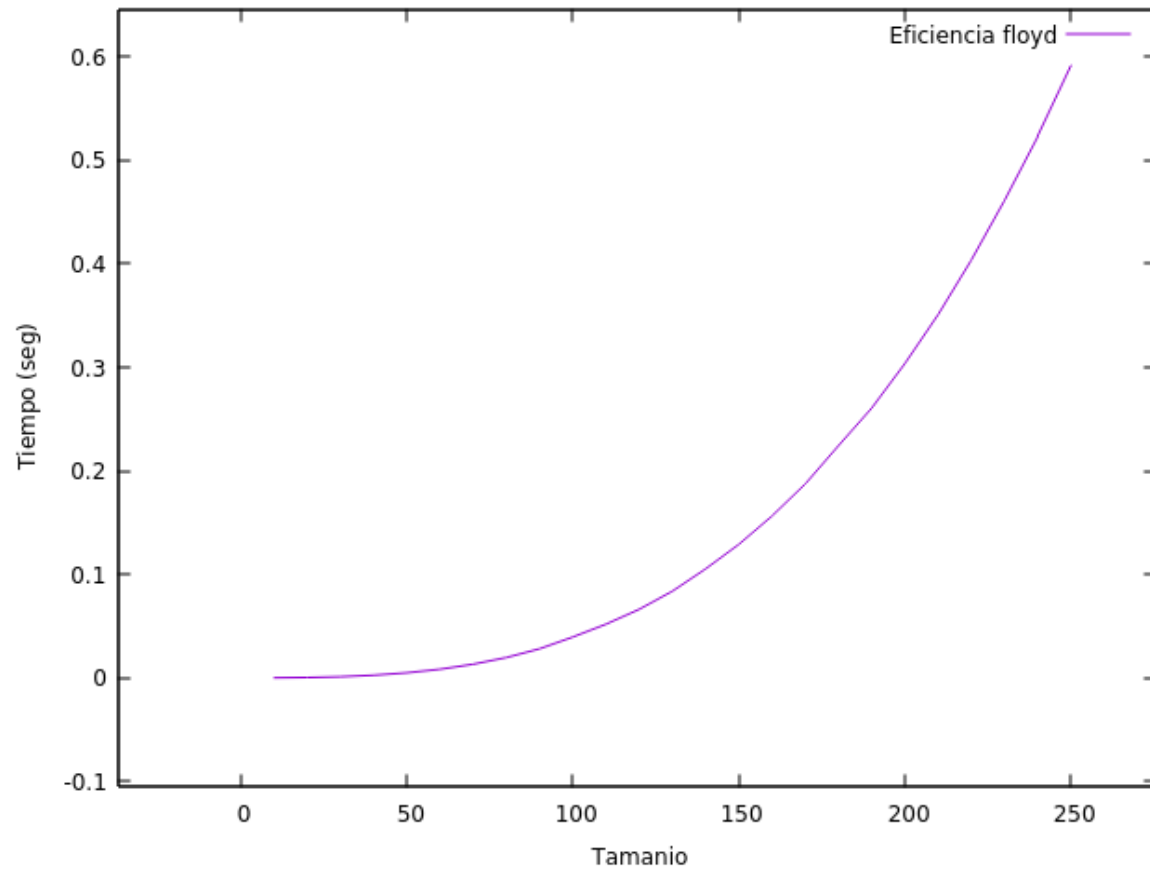


# Cálculo de la eficiencia empírica

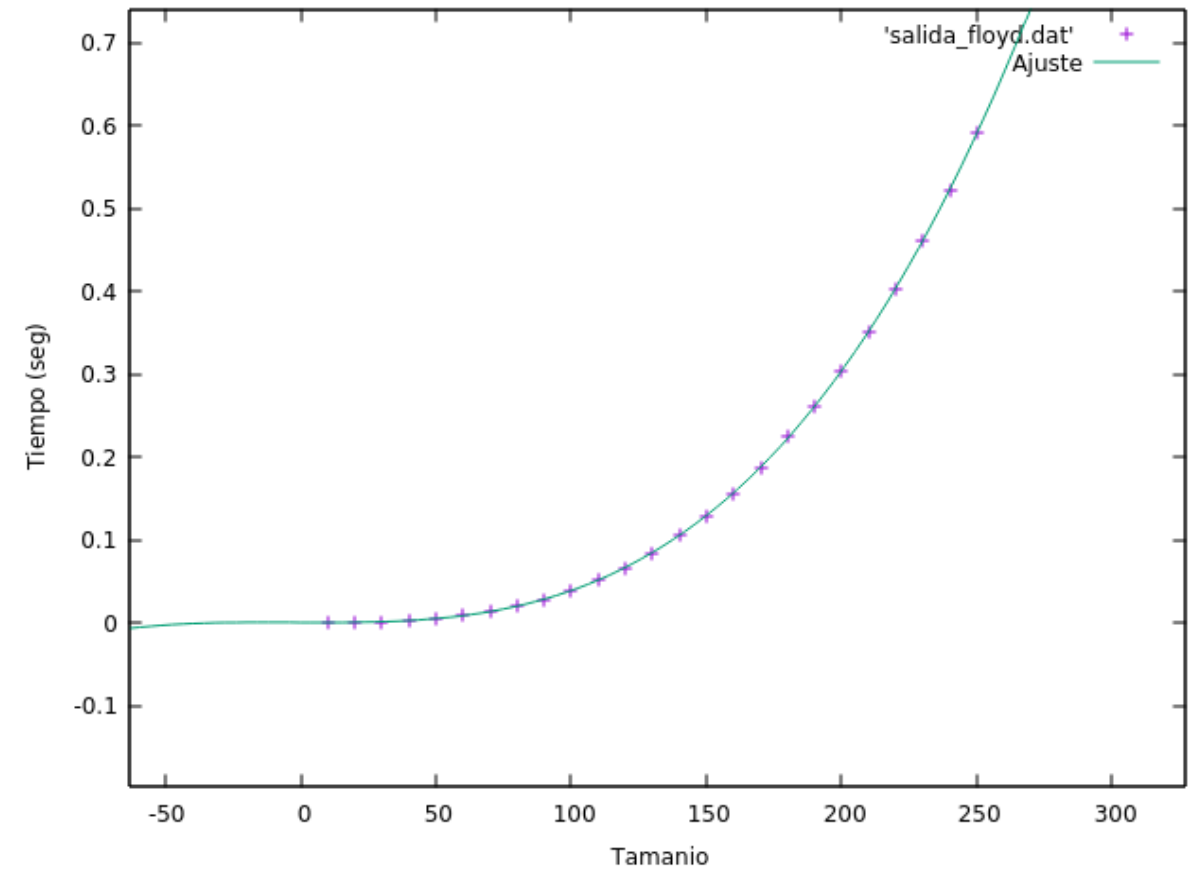
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EJERCICIO 1

# FLOYD

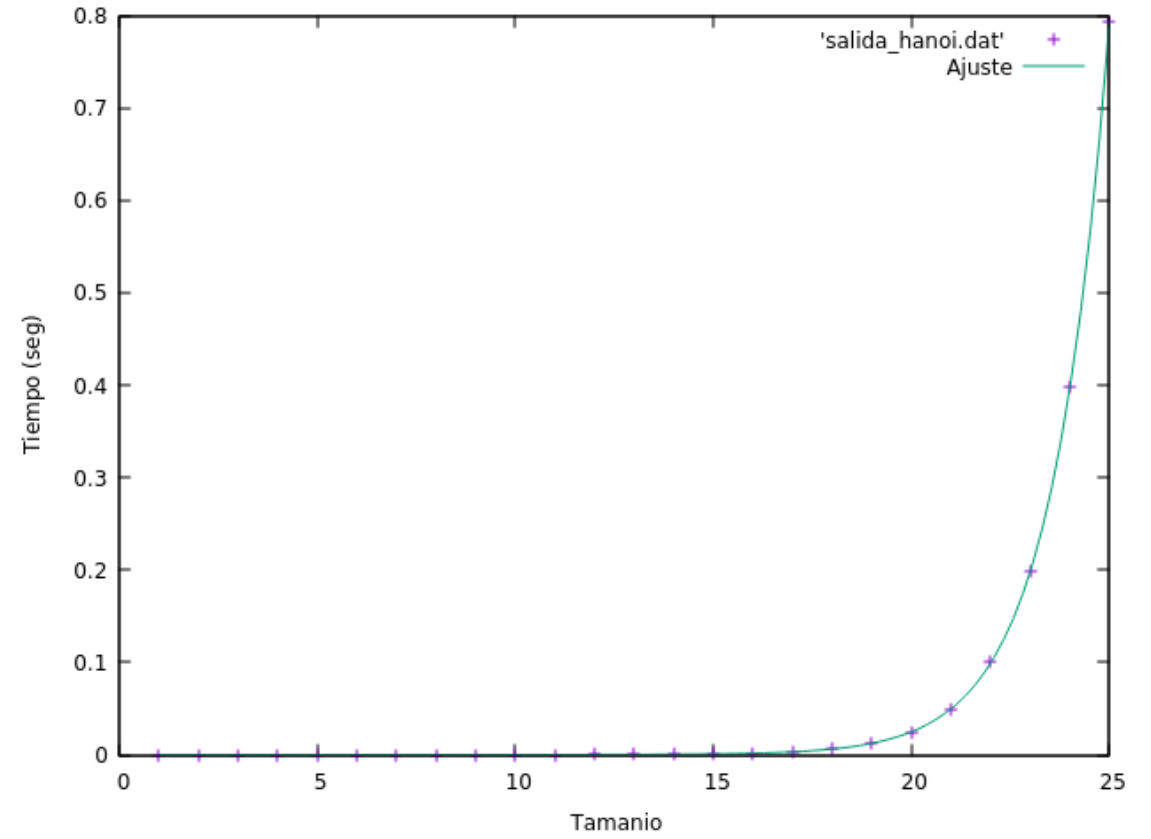
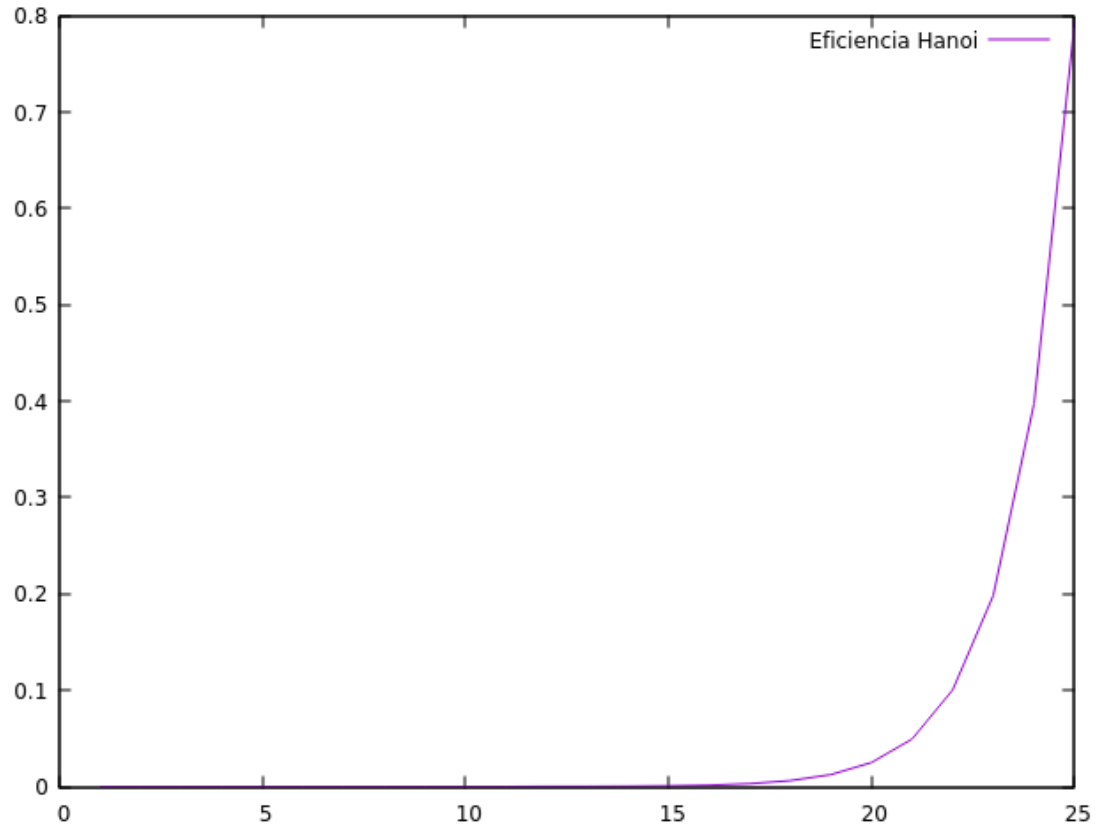


Tamaños -> 10 a 250 (incremento de 10)



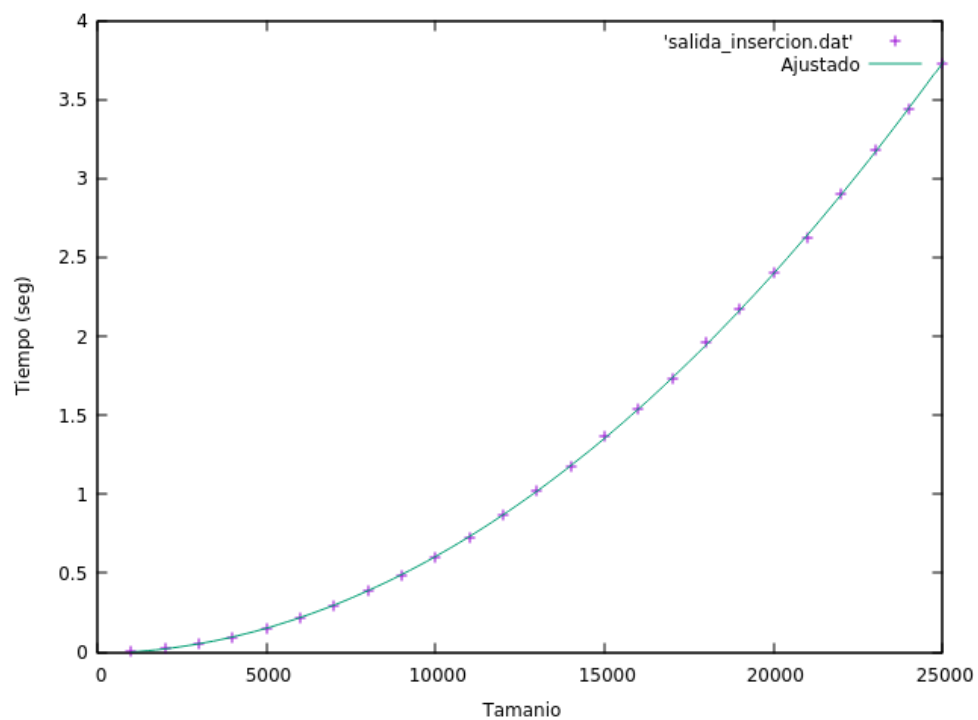
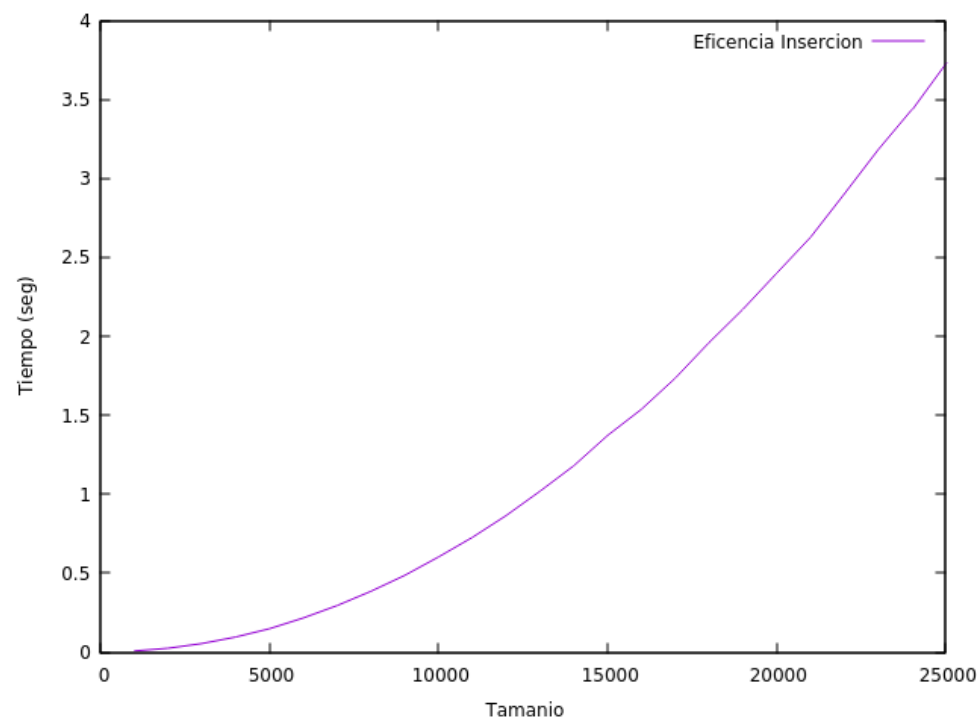
# HANOI

Tamaños -> 0 a 25 (incremento de 1)



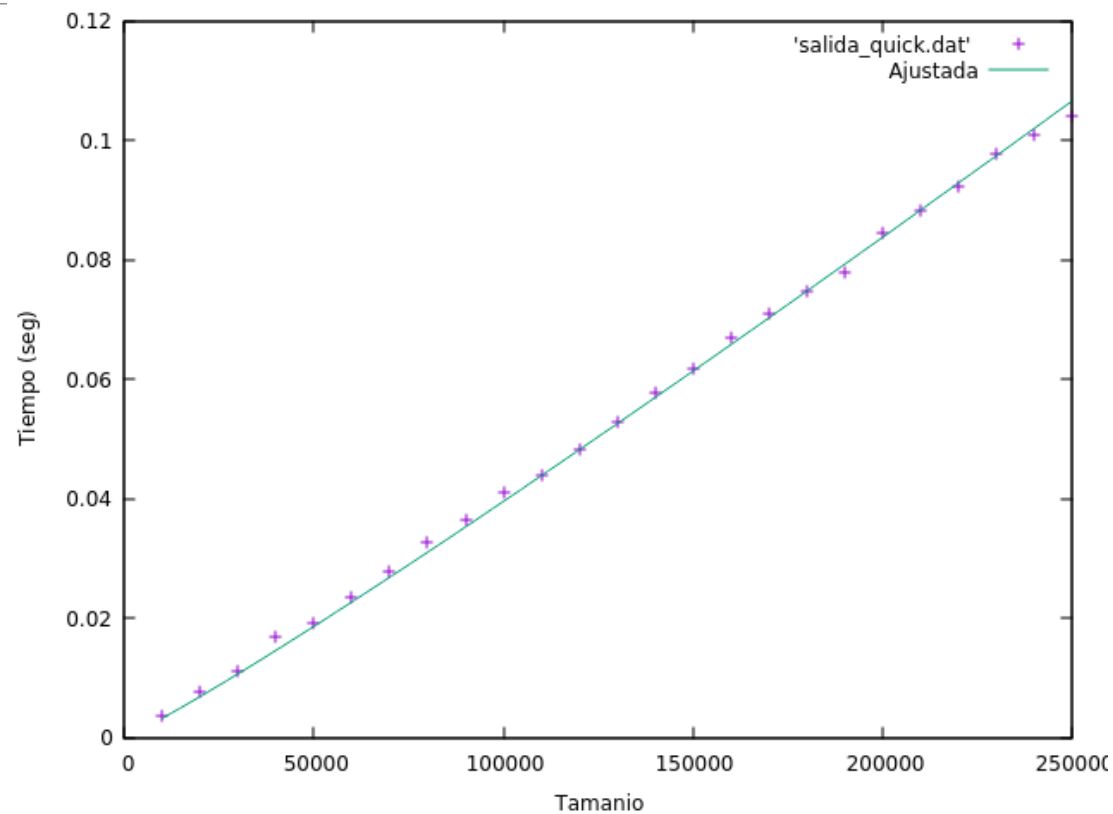
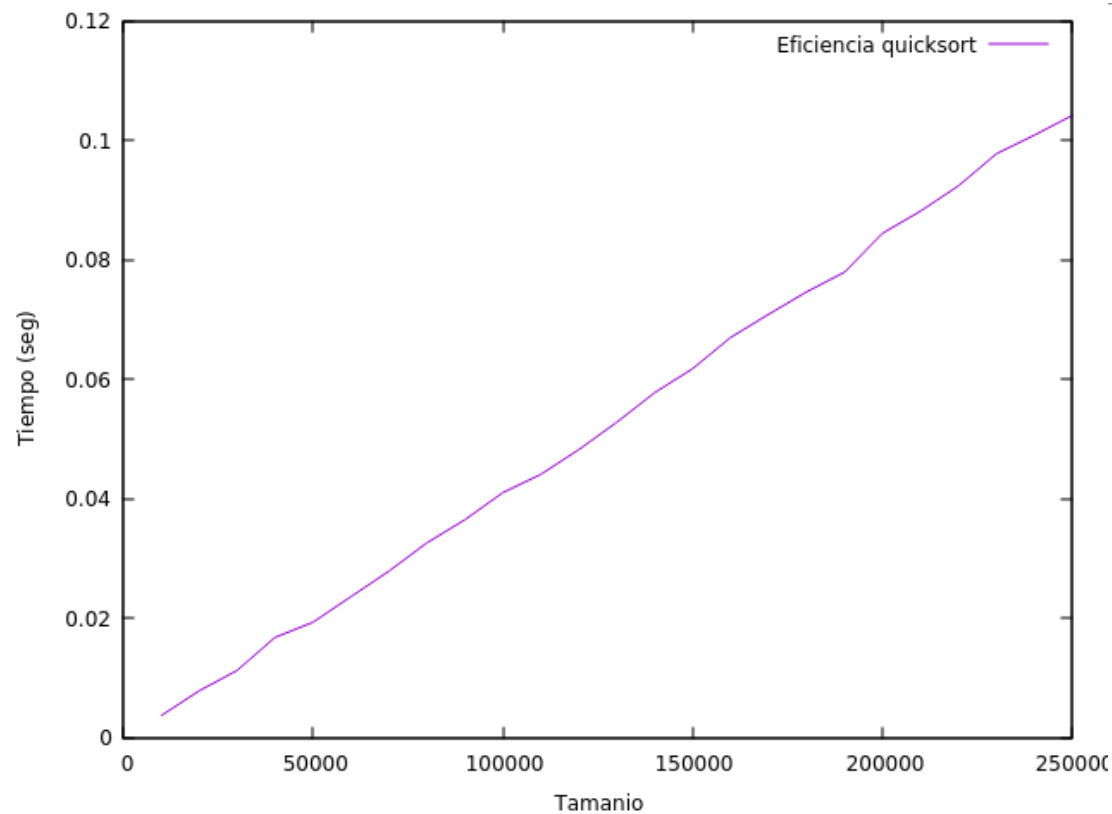
# INSERCIÓN

Tamaños -> 1000 a 25000 (incremento de 1000)



# QUICKSORT

Tamaños -> 10000 a 250000 (incremento de 10000)



# Eficiencia $O(n^2)$

# Eficiencia $O(n \cdot \log(n))$

Tamaño	burbuja	inserción	selección	16000	2,33831	1,53765	1,0198
1000	0,009326	0,006717	0,0039843	17000	2,64727	1,73426	1,15057
2000	0,036214	0,024055	0,0161128	18000	3,00253	1,96032	1,28965
3000	0,081513	0,05369	0,035522	19000	3,29181	2,17137	1,43709
4000	0,143469	0,094589	0,065098	20000	3,70991	2,39982	1,59251
5000	0,22451	0,148125	0,098737	21000	4,0858	2,6275	1,76388
6000	0,322415	0,215842	0,14236	22000	4,46812	2,90237	1,9482
7000	0,448451	0,294876	0,197098	23000	4,81371	3,18144	2,11209
8000	0,584871	0,384413	0,257235	24000	5,17747	3,43809	2,29516
9000	0,743189	0,485826	0,334225	25000	5,62167	3,72998	2,49193
10000	0,907302	0,602935	0,396813				
11000	1,10214	0,726386	0,480536				
12000	1,31375	0,864664	0,573581				
13000	1,54938	1,01861	0,680197				
14000	1,77838	1,17975	0,783223				
15000	2,05705	1,37162	0,896243				

tamaño	quicksort	mergesort	heapsort	130000	0,052775	0,09109	0,068089
10000	0,003625	0,00665079	0,004824	140000	0,057742	0,102959	0,076176
20000	0,007771	0,014437	0,008362	150000	0,061734	0,114649	0,079362
30000	0,011211	0,018691	0,013449	160000	0,066984	0,126993	0,088945
40000	0,016733	0,029801	0,018422	170000	0,070871	0,139966	0,090666
50000	0,01928	0,04314	0,023023	180000	0,074599	0,153146	0,099272
60000	0,023538	0,039113	0,029465	190000	0,077911	0,167807	0,107028
70000	0,027832	0,049835	0,03519	200000	0,084415	0,181705	0,109911
80000	0,032545	0,061842	0,039763	210000	0,088137	0,138456	0,131347
90000	0,036439	0,074306	0,046071	220000	0,092379	0,148041	0,12323
100000	0,040993	0,08895	0,050819	230000	0,097764	0,158239	0,129261
110000	0,044036	0,070985	0,056759	240000	0,100855	0,168314	0,147278
120000	0,048172	0,081647	0,063013	250000	0,104177	0,179208	0,144524



# Eficiencia $O(n^3)$

Tamaño	floyd	130	0,083675
10	4,50E-05	140	0,105342
20	0,000311	150	0,129086
30	0,001085	160	0,156446
40	0,002529	170	0,187267
50	0,004823	180	0,224309
60	0,00831	190	0,260606
70	0,013163	200	0,303713
80	0,019669	210	0,350943
90	0,02811	220	0,403632
100	0,03936	230	0,461212
110	0,051813	240	0,52302
120	0,066292	250	0,590928

# Eficiencia $O(2^n)$

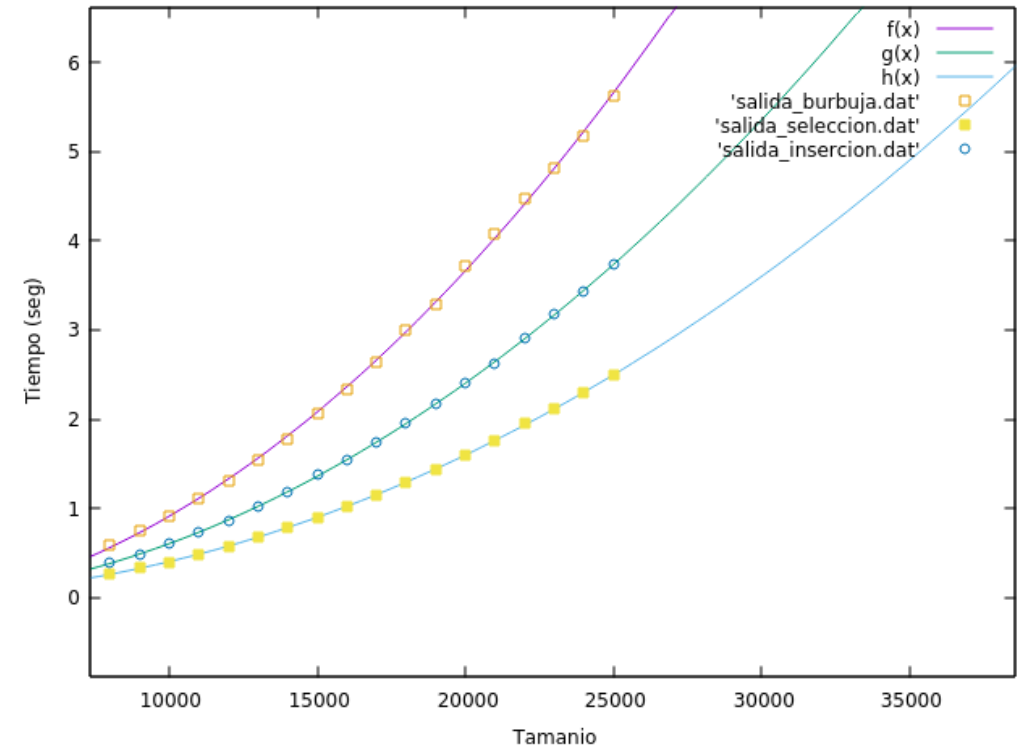
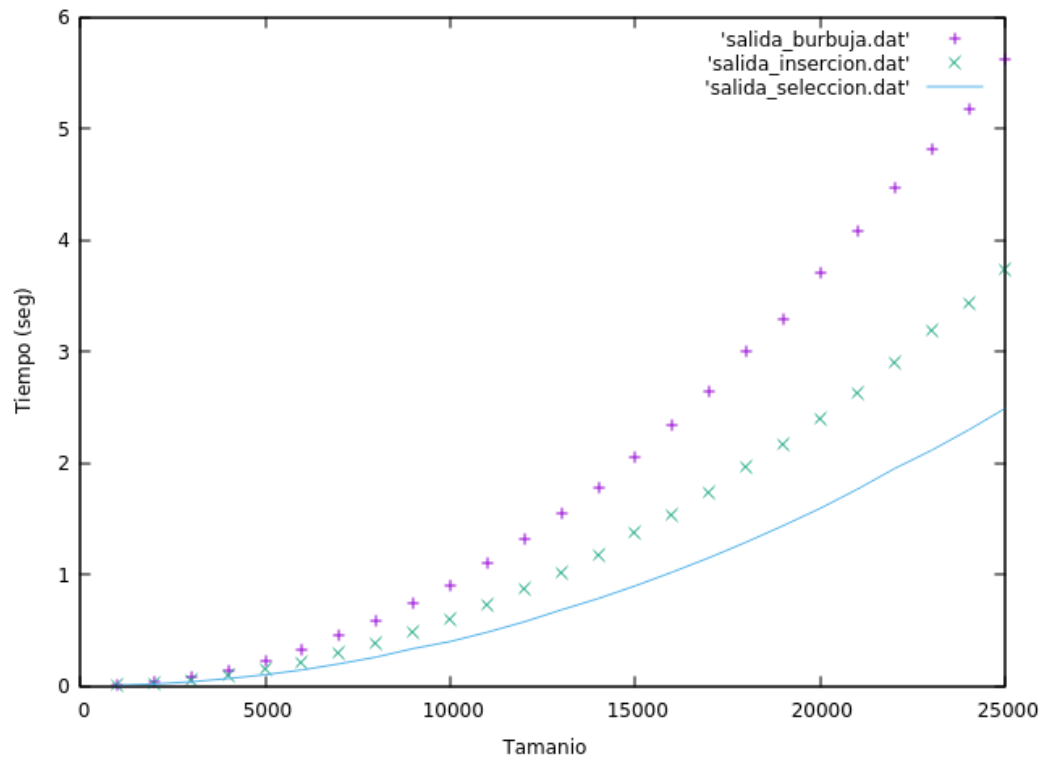
Tamaño	hanoi	13	0,000203
1	7,00E-06	14	0,000382
2	4,00E-06	15	0,000775
3	4,00E-06	16	0,001563
4	6,00E-06	17	0,003168
5	6,00E-06	18	0,006212
6	7,00E-06	19	0,012572
7	8,00E-06	20	0,024988
8	1,00E-05	21	0,049553
9	1,70E-05	22	0,100354
10	2,70E-05	23	0,198337
11	5,80E-05	24	0,397377
12	0,000103	25	0,792694

# Gráficos de las tablas clasificadas por eficiencia

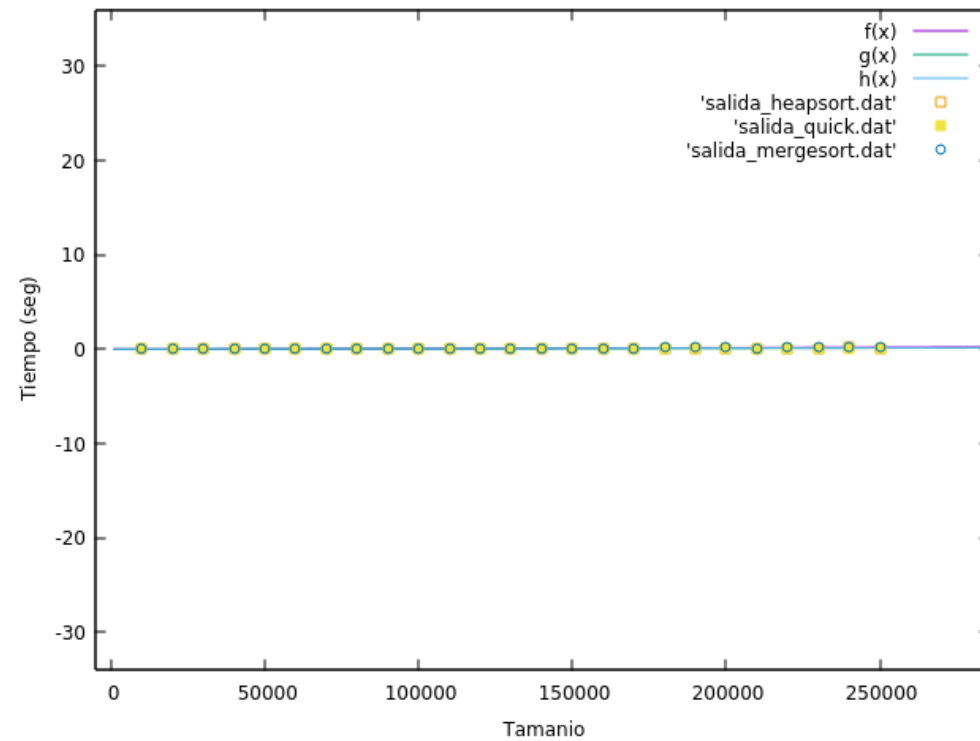
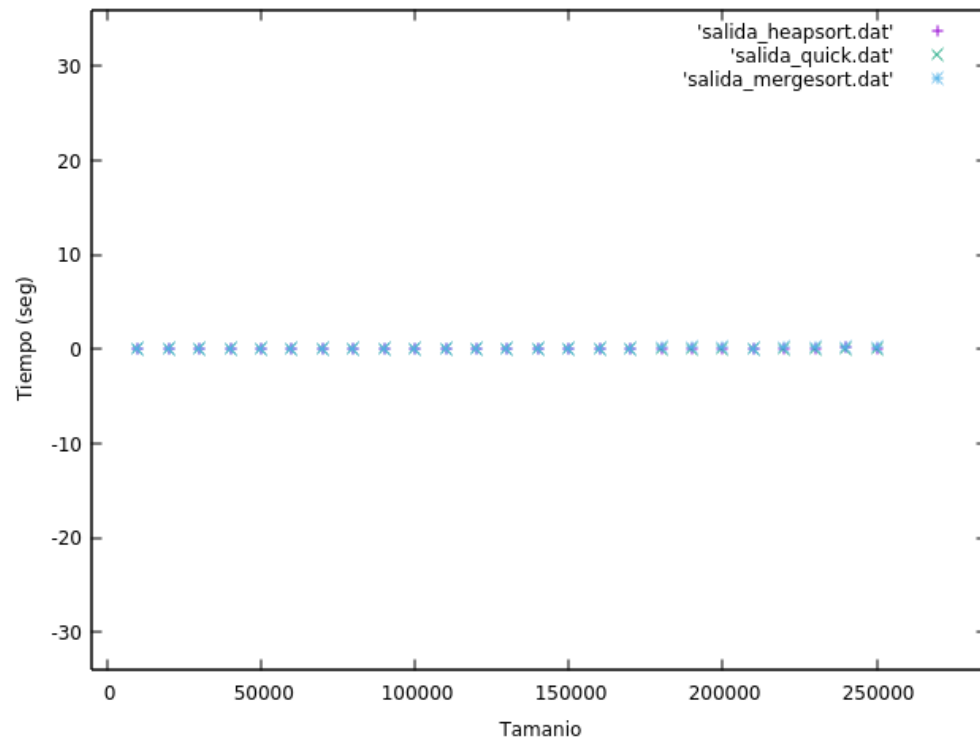
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EJERCICIO 2

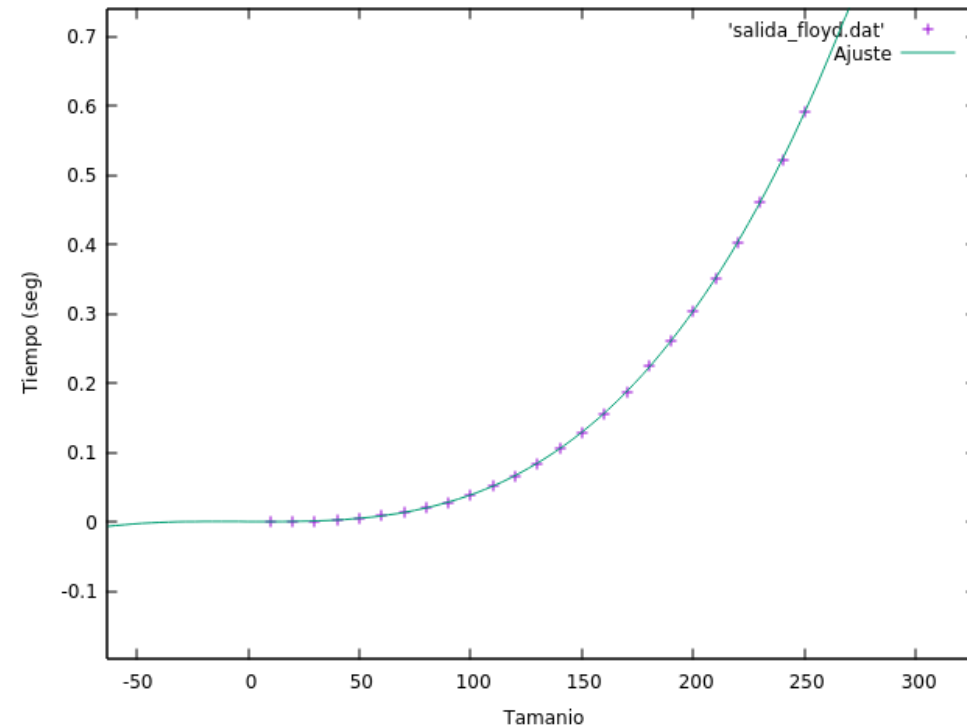
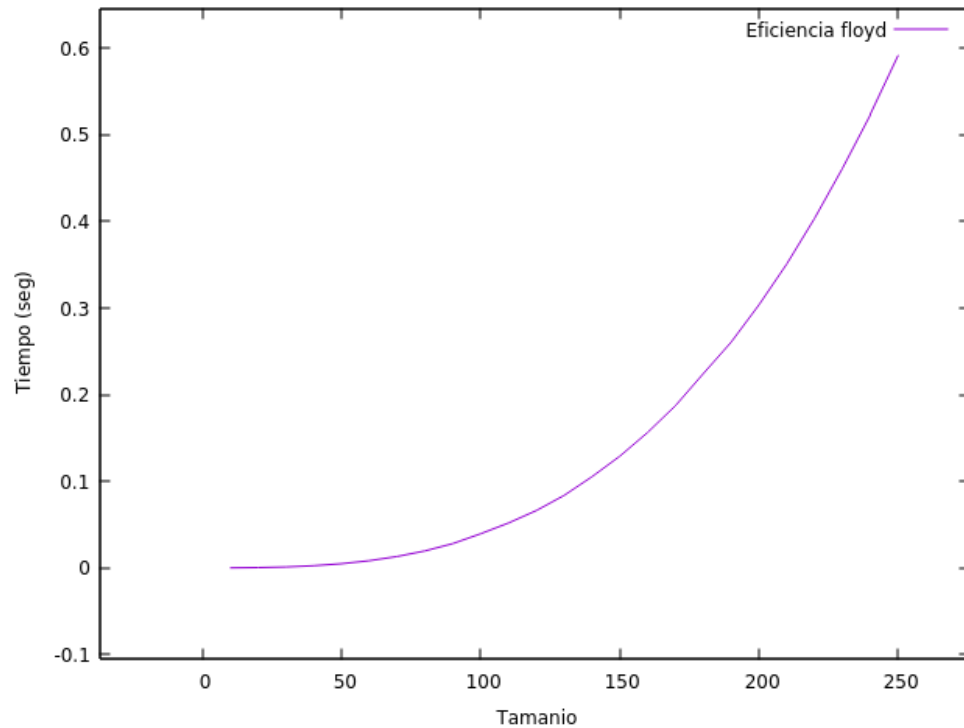
# COMPARACIÓN DE ALGORITMOS CON EFICIENCIA $N^2$



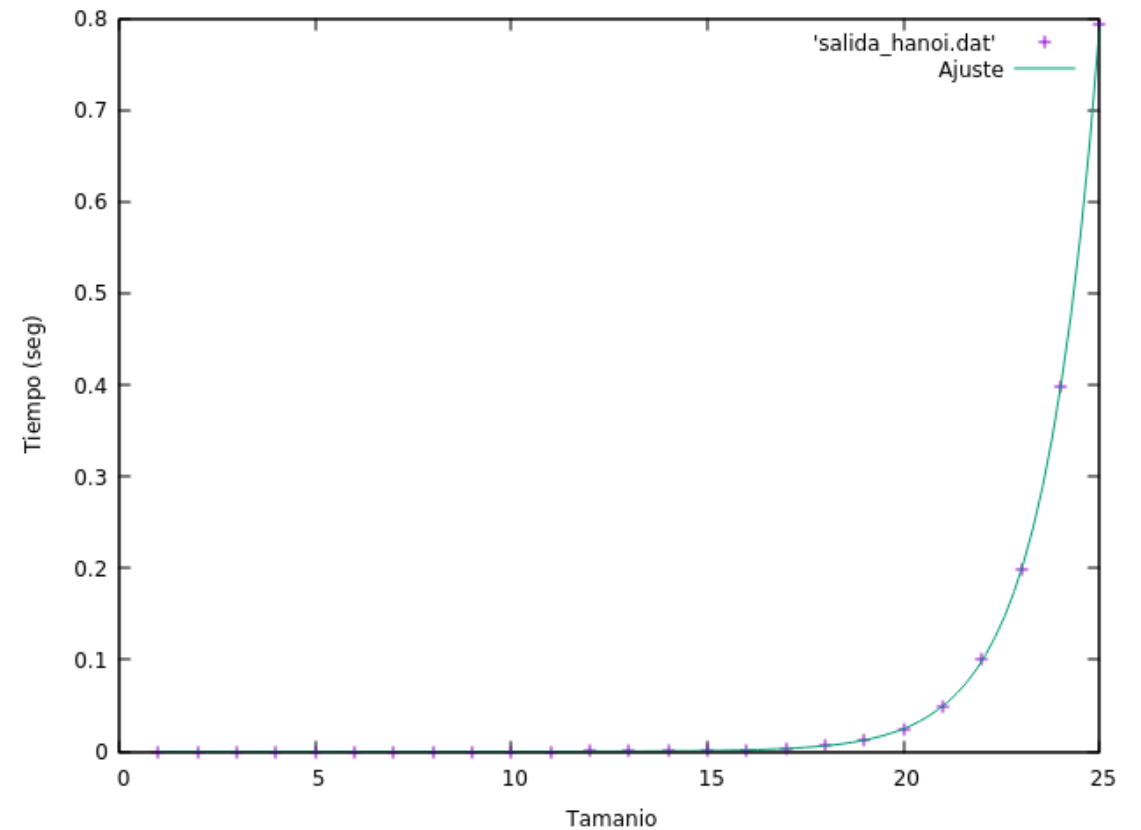
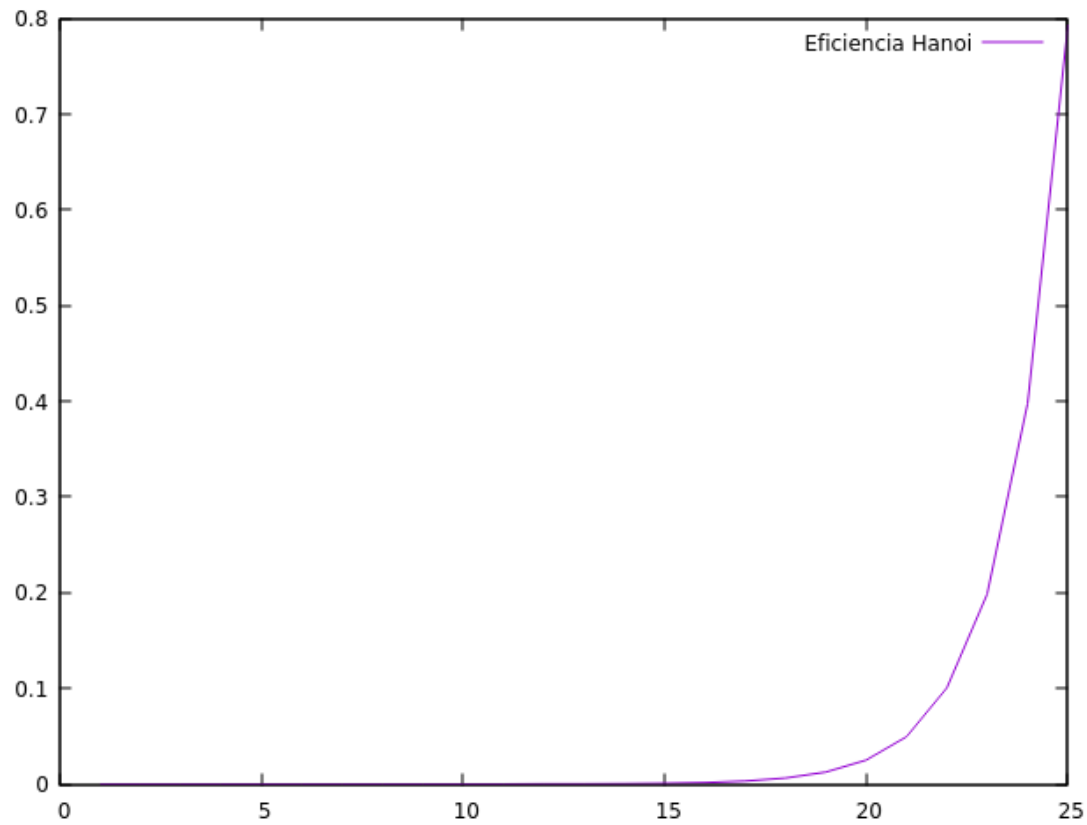
# COMPARACIÓN DE ALGORITMOS CON EFICIENCIA $N \cdot \log(N)$



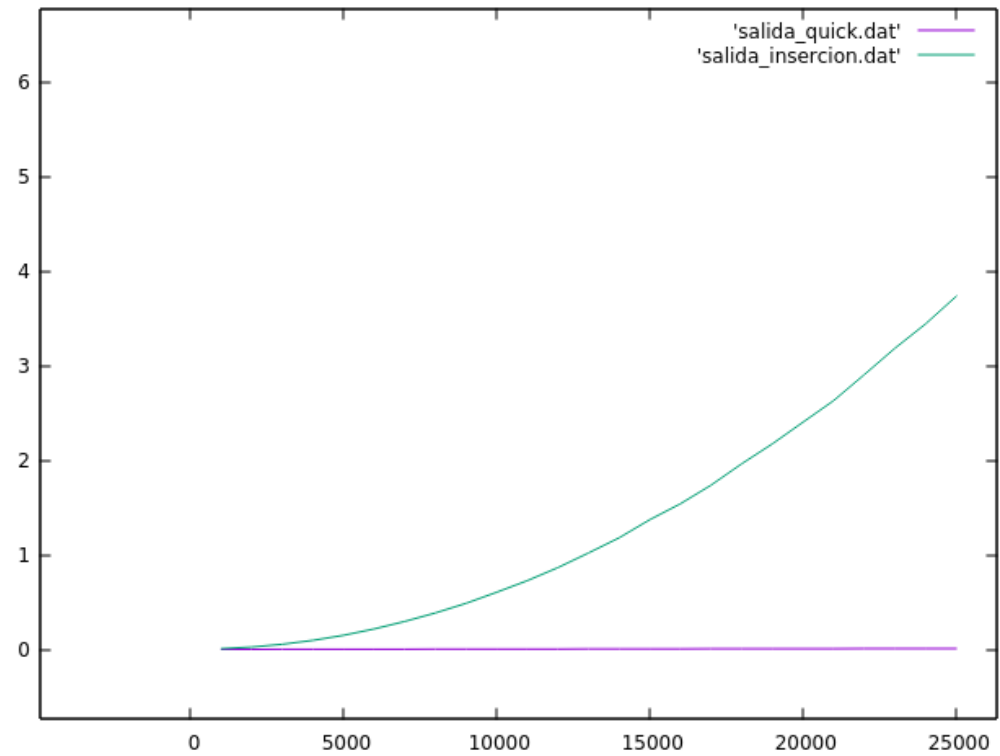
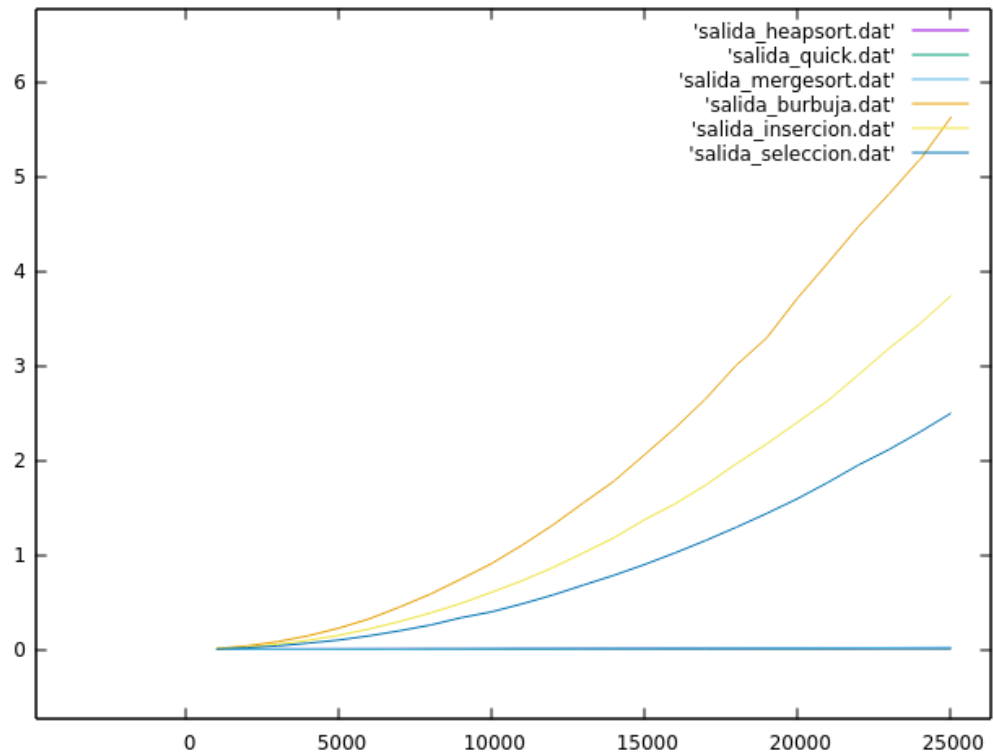
# COMPARACIÓN DE ALGORITMOS CON EFICIENCIA $N^3$



# COMPARACIÓN DE ALGORITMOS CON EFICIENCIA $2^N$



# COMPARACIÓN DE TODOS ALGORITMOS DE ORDENACION



# Cálculo de la eficiencia híbrida

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EJERCICIO 3



# PARAMETROS DEL ALGORITMO AJUSTADO DE FLOYD

a -> 3.67e-8  
b -> 3.2075e-07  
c -> -1.4344e-5  
d -> 0.0001569

```
=====
a = 2.36403e-08 +/- 8.14e-12 (0.03443%)
gnuplot> f(x) = a*x*x*x+b*x*x+c*x+d
gnuplot> fit f(x) 'salida_floyd.dat' via a,b,c,d
iter   chisq      delta/lim  lambda  a          b          c          d
0 2.5383811700e+01 0.00e+00 5.07e-01 2.364033e-08 -1.881329e-09 5.217224e-04 1.000000e+00
1 1.7440143048e-02 -1.45e+08 5.07e-02 2.637578e-08 -1.881291e-09 5.110183e-04 -6.847057e-03
2 6.3358772338e-04 -2.65e+06 5.07e-03 3.497200e-08 -1.881596e-09 1.986577e-04 -1.291242e-02
3 8.0655292247e-06 -7.76e+06 5.07e-04 3.753773e-08 -1.881201e-09 2.206133e-05 -7.957445e-04
4 8.0478941715e-06 -2.19e+02 5.07e-05 3.755092e-08 -1.820553e-09 2.112507e-05 -7.310832e-04
5 7.9959290185e-06 -6.50e+02 5.07e-06 3.753604e-08 4.132429e-09 2.047044e-05 -7.146916e-04
6 6.7919124443e-06 -1.77e+04 5.07e-07 3.701952e-08 2.108208e-07 -2.256533e-06 -1.456907e-04
7 6.6268792256e-06 -2.49e+03 5.07e-08 3.674625e-08 3.201697e-07 -1.428029e-05 1.553403e-04
8 6.6268746062e-06 -6.97e-02 5.07e-09 3.674480e-08 3.207512e-07 -1.434423e-05 1.569413e-04
iter   chisq      delta/lim  lambda  a          b          c          d

After 8 iterations the fit converged.
final sum of squares of residuals : 6.62687e-06
rel. change during last iteration : -6.97062e-07

degrees of freedom (FIT_NDF) : 21
rms of residuals (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.000561752
variance of residuals (reduced chisquare) = WSSR/ndf : 3.15565e-07

Final set of parameters          Asymptotic Standard Error
=====
a = 3.67448e-08 +/- 3.848e-10 (1.047%)
b = 3.20751e-07 +/- 1.52e-07 (47.39%)
c = -1.43442e-05 +/- 1.719e-05 (119.8%)
d = 0.000156941 +/- 0.0005262 (335.3%)

correlation matrix of the fit parameters:
a      b      c      d
a      1.000
b      -0.987 1.000
c      0.926 -0.973 1.000
d      -0.719 0.795 -0.898 1.000
gnuplot> 
```

# PARAMETROS DEL ALGORITMO AJUSTADO DE HANOI

a -> -2.10631e-8

b -> 0.9999999

```
unexpected or unrecognized token ^
gnuplot> plot 'salida_quick.dat' with lines, 'salida_insercion' with lines
warning: Cannot find or open file "salida_insercion"
gnuplot> plot 'salida_quick.dat' with lines, 'salida_insercion' with lines
warning: Cannot find or open file "salida_insercion"
gnuplot> plot 'salida_quick.dat' with lines, 'salida_insercion.dat' with lines
gnuplot> Gtk-Message: 21:02:39.564: GtkDialog mapped without a transient parent. This is discouraged.

gnuplot> f(x) = a*2**x+b
gnuplot> fit f(x) 'salida_hanoi.dat' via a,b
iter      chisq      delta/lim  lambda  a          b
  0 1.5011999390e+15   0.00e+00  5.48e+06  1.000000e+00  1.000000e+00
  1 5.7716260633e+11 -2.60e+08  5.48e+05  1.960782e-02  1.000000e+00
  2 2.3099268487e+04 -2.50e+12  5.48e+04  3.899721e-06  1.000000e+00
  3 2.1996081304e+01 -1.05e+08  5.48e+03 -2.105531e-08  9.999999e-01
  4 2.1996048977e+01 -1.47e-01  5.48e+02 -2.106312e-08  9.999992e-01
iter      chisq      delta/lim  lambda  a          b
After 4 iterations the fit converged.
final sum of squares of residuals : 21.996
rel. change during last iteration : -1.46969e-06

degrees of freedom    (FIT_NDF)                : 23
rms of residuals      (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.977931
variance of residuals (reduced chisquare) = WSSR/ndf : 0.95635

Final set of parameters          Asymptotic Standard Error
=====
a = -2.10631e-08                +/- 2.691e-08    (127.7%)
b = 0.999999                    +/- 0.2085      (20.85%)

correlation matrix of the fit parameters:
          a          b
a         1.000
b        -0.346    1.000
gnuplot> □
```

# PARAMETROS DEL ALGORITMO AJUSTADO DE INSERCIÓN

a -> 5.90207e-09

b -> 2.27367e-06

c -> -0.00771998

```
c = -0.0245526 +/- 0.02069 (84.26%)

correlation matrix of the fit parameters:
      a      b      c
a      1.000
b     -0.971  1.000
c      0.774 -0.884  1.000
gnuplot> f(x) = a*x*x+b*x+c
gnuplot> fit f(x) 'salida_insercion.dat' via a,b,c
iter   chisq      delta/lim  lambda  a          b          c
0  2.1055051969e+01  0.00e+00  1.51e+00  8.879599e-09  6.192590e-06 -2.455260e-02
1  6.1306464696e-03 -3.43e+08  1.51e-01  5.798309e-09  6.112158e-06 -2.461953e-02
2  2.1932204070e-03 -1.80e+05  1.51e-02  5.778663e-09  5.674857e-06 -2.463640e-02
3  1.3516727860e-03 -6.23e+04  1.51e-03  5.882826e-09  2.838234e-06 -1.101074e-02
4  1.3253361609e-03 -1.99e+03  1.51e-04  5.902031e-09  2.274932e-06 -7.727441e-03
5  1.3253360267e-03 -1.01e-02  1.51e-05  5.902073e-09  2.273667e-06 -7.719985e-03
iter   chisq      delta/lim  lambda  a          b          c

After 5 iterations the fit converged.
final sum of squares of residuals : 0.00132534
rel. change during last iteration : -1.01289e-07

degrees of freedom      (FIT_NDF)          : 22
rms of residuals        (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.00776161
variance of residuals (reduced chisquare) = WSSR/ndf  : 6.02425e-05

Final set of parameters          Asymptotic Standard Error
=====
a = 5.90207e-09      +/- 3.346e-11  (0.5669%)
b = 2.27367e-06      +/- 8.961e-07  (39.41%)
c = -0.00771998     +/- 0.005056  (65.49%)

correlation matrix of the fit parameters:
      a      b      c
a      1.000
b     -0.971  1.000
c      0.774 -0.884  1.000
gnuplot> 
```

# PARAMETROS DEL ALGORITMO AJUSTADO DE QUICKSORT

a -> 3.60584e-8

b-> 0.000163264

```
=====
a          = -2.10631e-08      +/- 2.691e-08      (127.7%)
b          = 0.999999          +/- 0.2085        (20.85%)

correlation matrix of the fit parameters:
      a      b
a      1.000
b     -0.346  1.000
gnuplot> f(x) = a*x*log(x)+b
gnuplot> fit f(x) 'salida_quick.dat' via a,b
iter    chisq    delta/lim  lambda  a      b
0 2.4635394649e+01  0.00e+00  7.07e-01 -2.106312e-08  9.999992e-01
1 9.9270680353e-03 -2.48e+08  7.07e-02 -2.111020e-08  2.679740e-02
2 4.4462612503e-04 -2.13e+06  7.07e-03 -2.041287e-08  7.249628e-03
3 8.8972523989e-05 -4.00e+05  7.07e-04  1.081145e-08  3.329670e-03
4 1.3311696191e-07 -6.67e+07  7.07e-05  3.585593e-08  1.886608e-04
5 1.2740123002e-07 -4.49e+03  7.07e-06  3.605842e-08  1.632656e-04
6 1.2740122998e-07 -2.93e-05  7.07e-07  3.605843e-08  1.632636e-04
iter    chisq    delta/lim  lambda  a      b

After 6 iterations the fit converged.
final sum of squares of residuals : 1.27401e-07
rel. change during last iteration : -2.93275e-10

degrees of freedom (FIT_NDF) : 23
rms of residuals (FIT_STDFIT) = sqrt(WSSR/ndf) : 7.44257e-05
variance of residuals (reduced chisquare) = WSSR/ndf : 5.53918e-09

Final set of parameters      Asymptotic Standard Error
=====
a          = 3.60584e-08      +/- 1.993e-10      (0.5529%)
b          = 0.000163264     +/- 2.91e-05       (17.82%)

correlation matrix of the fit parameters:
      a      b
a      1.000
b     -0.859  1.000
gnuplot> □
```

# MAL AJUSTE DE FLOYD

$$f(x) = x * b + a * \log(x)$$

```
Final set of parameters          Asymptotic Standard Error
=====
a          = 0.0296282          +/- 0.008025      (27.09%)
b          = -0.141038          +/- 0.0485        (34.39%)

correlation matrix of the fit parameters:
      a      b
a      1.000
b     -0.974  1.000
gnuplot> f(x) = log(x)*a+b*x
gnuplot> fit f(x) 'salida_floyd.dat' via a,b
iter    chisq    delta/lim  lambda  a          b
  0  1.1084490289e+04    0.00e+00  1.48e+01  2.962825e-02 -1.410375e-01
  1  4.7246838134e+00   -2.35e+08  1.48e+00  2.979024e-02 -2.180641e-03
  2  4.4436122707e-01   -9.63e+05  1.48e-01  2.786723e-02  6.530889e-04
  3  1.1345178248e-01   -2.92e+05  1.48e-02  -2.578218e-02  2.244920e-03
  4  8.5636521013e-02   -3.25e+04  1.48e-03  -4.640728e-02  2.856674e-03
  5  8.5636109909e-02   -4.80e-01  1.48e-04  -4.648688e-02  2.859034e-03
iter    chisq    delta/lim  lambda  a          b

After 5 iterations the fit converged.
final sum of squares of residuals : 0.0856361
rel. change during last iteration : -4.80059e-06

degrees of freedom (FIT_NDF)          : 23
rms of residuals   (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.0610189
variance of residuals (reduced chisquare) = WSSR/ndf : 0.00372331

Final set of parameters          Asymptotic Standard Error
=====
a          = -0.0464869          +/- 0.007575      (16.3%)
b          = 0.00285903          +/- 0.0002392      (8.367%)

correlation matrix of the fit parameters:
      a      b
a      1.000
b     -0.939  1.000
gnuplot> 
```

# MAL AJUSTE DE HANOI (CON $O(N)$ ): $f(x) = x * b + a * \log(x)$

```
After 3 iterations the fit converged.
final sum of squares of residuals : 0.561478
rel. change during last iteration : -6.85233e-11

degrees of freedom (FIT_NDF) : 24
rms of residuals (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.152954
variance of residuals (reduced chisquare) = WSSR/ndf : 0.0233949

Final set of parameters      Asymptotic Standard Error
=====
a = 0.00799194 +/- 0.002058 (25.75%)
gnuplot> fit f(x) 'salida_hanoi.dat' via a,b
iter   chisq      delta/lin  lambda  a          b
0 5.6147799505e-01  0.00e+00  8.48e-02  7.991945e-03 -6.782860e-03
1 5.4870903858e-01 -2.33e+03  8.48e-03  8.979900e-03 -1.303821e-02
2 4.2484162028e-01 -2.92e+04  8.48e-04  2.611962e-02 -1.192879e-01
3 4.2115892127e-01 -8.74e+02  8.48e-05  2.962108e-02 -1.409931e-01
4 4.2115890590e-01 -3.65e-03  8.48e-06  2.962825e-02 -1.410375e-01
iter   chisq      delta/lin  lambda  a          b

After 4 iterations the fit converged.
final sum of squares of residuals : 0.421159
rel. change during last iteration : -3.64916e-08

degrees of freedom (FIT_NDF) : 23
rms of residuals (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.135319
variance of residuals (reduced chisquare) = WSSR/ndf : 0.0183113

Final set of parameters      Asymptotic Standard Error
=====
a = 0.0296282 +/- 0.008025 (27.09%)
b = -0.141038 +/- 0.0485 (34.39%)

correlation matrix of the fit parameters:
      a      b
a    1.000
b   -0.974  1.000
gnuplot> 
```

# MAL AJUSTE DE INSERCIÓN (CON $O(N^3)$ ) $F(x) = a \cdot x^3 + b \cdot x^2 + c \cdot x + d$

```
correlation matrix of the fit parameters:
a      a      b      c      d
a      1.000
b      -0.987  1.000
c      0.926 -0.973  1.000
d      -0.719  0.795 -0.898  1.000
gnuplot> fit f(x) 'salida_insercion.dat' via a,b,c,d
iter    chisq    delta/lim  lambda  a      b      c      d
0  2.1060421490e+01  0.00e+00  1.68e+00 -6.297222e-14  1.133552e-08 -1.985272e-05  3.733650e-02
1  1.0414260280e-02 -2.02e+08  1.68e-01 -6.459575e-14  8.299884e-09 -2.036574e-05  3.724227e-02
2  4.9273731342e-03 -1.11e+05  1.68e-02 -5.352747e-14  7.970669e-09 -1.915183e-05  3.865703e-02
3  1.1340780135e-03 -3.34e+05  1.68e-03 -1.716662e-14  6.588139e-09 -5.318723e-06  1.210510e-02
4  1.0443539961e-03 -8.59e+03  1.68e-04 -1.149599e-14  6.350465e-09 -2.482498e-06  3.586975e-03
5  1.0443534037e-03 -5.67e-02  1.68e-05 -1.148207e-14  6.349874e-09 -2.475319e-06  3.564597e-03
iter    chisq    delta/lim  lambda  a      b      c      d
After 5 iterations the fit converged.
final sum of squares of residuals : 0.00104435
rel. change during last iteration : -5.67238e-07

degrees of freedom (FIT_NDF) : 21
rms of residuals (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.00705203
variance of residuals (reduced chisquare) = WSSR/ndf : 4.97311e-05

Final set of parameters      Asymptotic Standard Error
=====
a      = -1.14821e-14      +/- 4.831e-15 (42.07%)
b      = 6.34987e-09      +/- 1.908e-10 (3.005%)
c      = -2.47532e-06      +/- 2.157e-06 (87.16%)
d      = 0.0035646        +/- 0.006606 (185.3%)

correlation matrix of the fit parameters:
a      a      b      c      d
a      1.000
b      -0.987  1.000
c      0.926 -0.973  1.000
d      -0.719  0.795 -0.898  1.000
gnuplot> 
```

# MAL AJUSTE DE QUICKSORT (CON $O(N)$ )

$$F(x) = a * x + b$$

```
c          = 5.47544e-07      +/- 1.538e-06      (280.9%)
d          = -0.000783826    +/- 0.004709      (600.8%)

correlation matrix of the fit parameters:
      a      b      c      d
a      1.000
b     -0.987  1.000
c      0.926 -0.973  1.000
d     -0.719  0.795 -0.898  1.000
gnuplot> f(x) = a*x+b
gnuplot> fit f(x) 'salida_quick.dat' via a,b
iter   chisq      delta/lim  lambda  a          b
  0  9.5592084681e-02   0.00e+00  2.79e-09  1.328400e-15  3.939036e-09
  1  2.2119123585e-02  -3.32e+05  2.79e-10  1.290967e-08  5.099990e-02
  2  1.4334712915e-03  -1.44e+06  2.79e-11  3.205337e-07  1.203915e-02
  3  1.4145853005e-05  -1.00e+07  2.79e-12  4.246692e-07 -1.506248e-03
  4  1.4129586729e-05  -1.15e+02  2.79e-13  4.250229e-07 -1.552258e-03
  5  1.4129586729e-05  -1.33e-07  2.79e-14  4.250229e-07 -1.552260e-03
iter   chisq      delta/lim  lambda  a          b
After 5 iterations the fit converged.
final sum of squares of residuals : 1.41296e-05
rel. change during last iteration : -1.33143e-12

degrees of freedom (FIT_NDF)          : 23
rms of residuals (FIT_STDFIT) = sqrt(WSSR/ndf) : 0.000783792
variance of residuals (reduced chisquare) = WSSR/ndf : 6.1433e-07

Final set of parameters          Asymptotic Standard Error
=====
a      = 4.25023e-07      +/- 2.174e-09      (0.5115%)
b      = -0.00155226     +/- 0.0003232     (20.82%)

correlation matrix of the fit parameters:
      a      b
a      1.000
b     -0.874  1.000
gnuplot> □
```

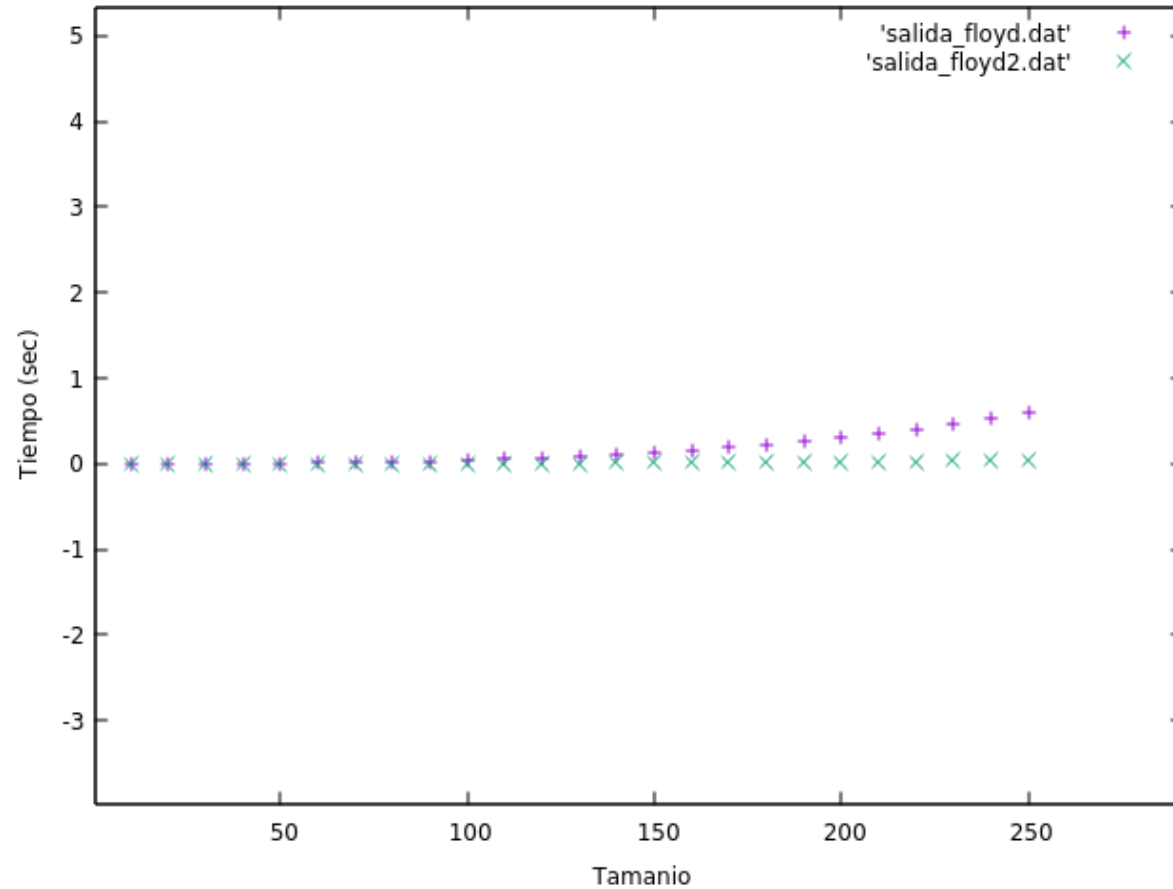


# Compilación con optimización

---

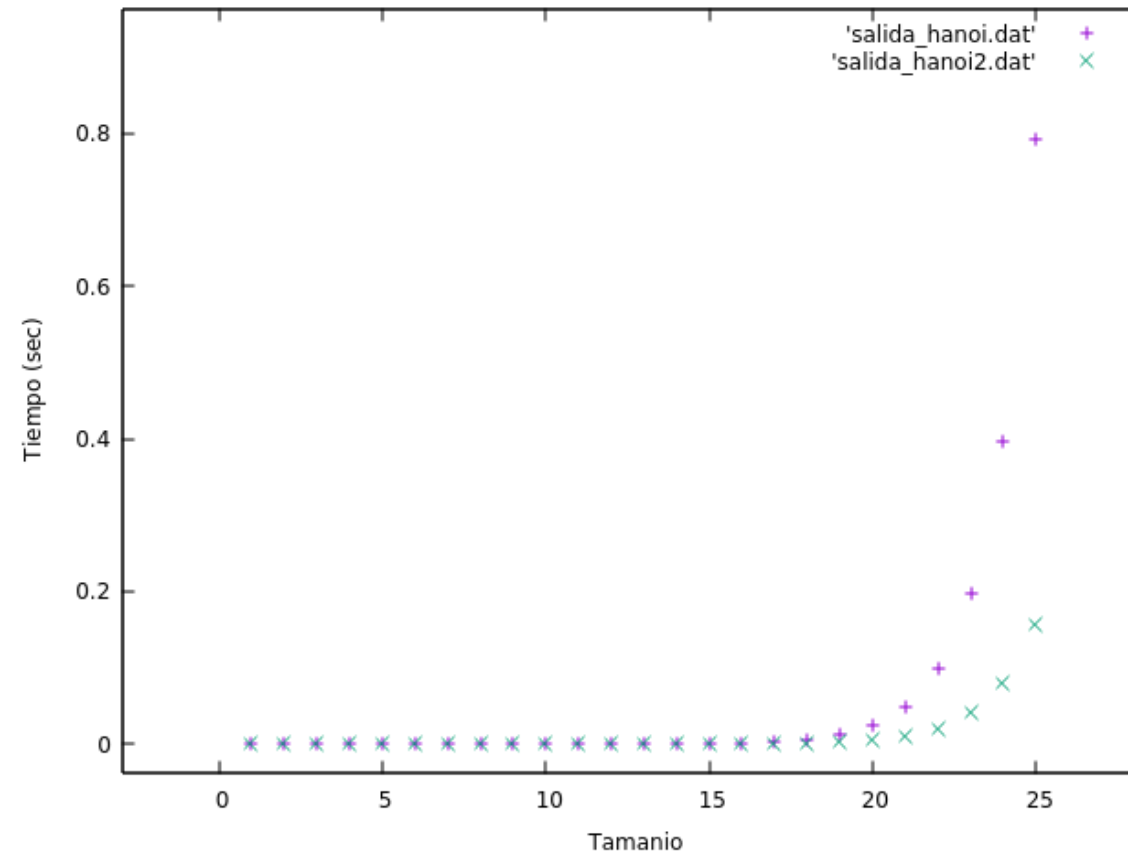
EJERCICIO 4

# Floyd compilado con optimización (-O1)

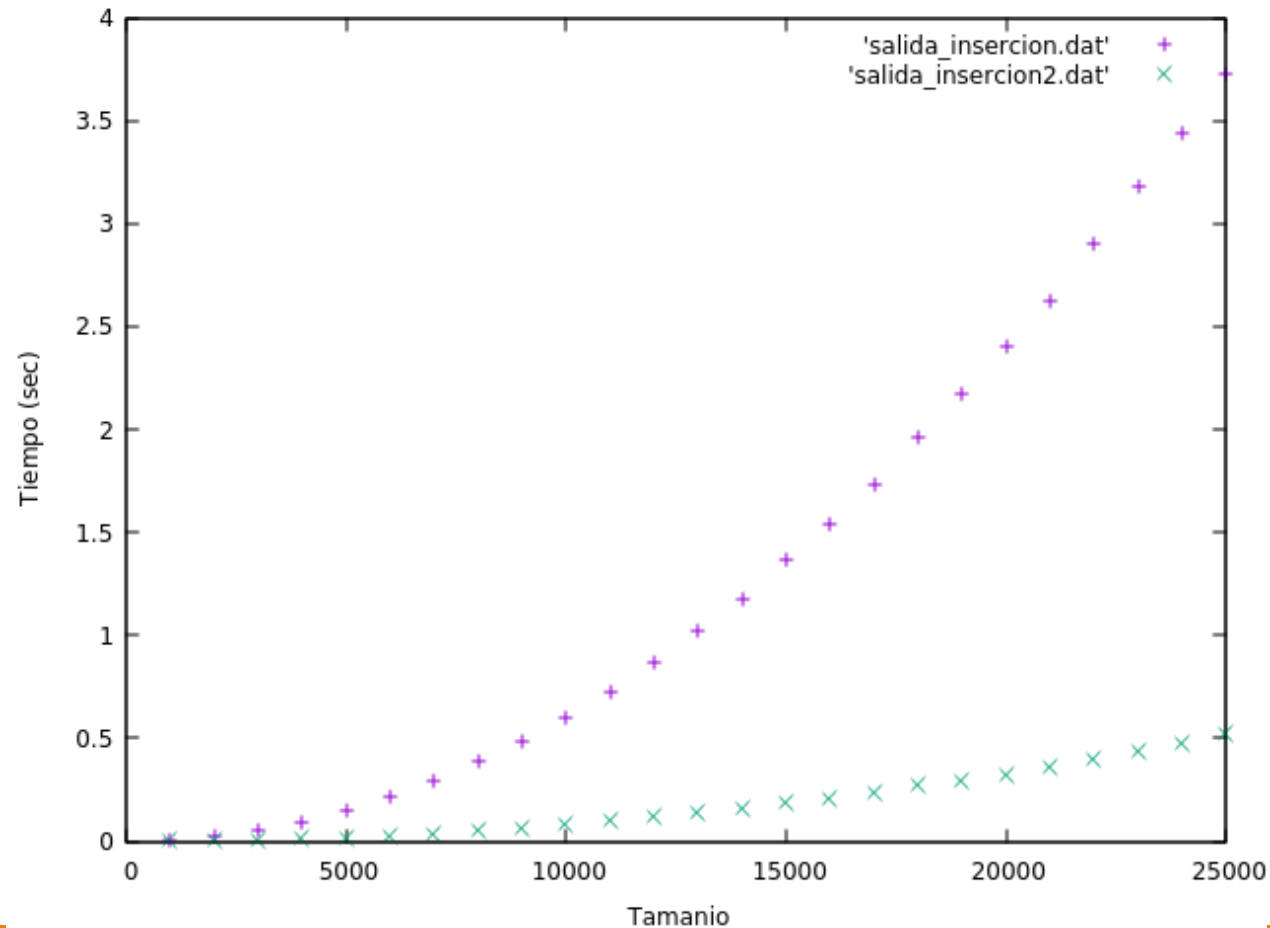


# Hanoi compilado con optimización (-O3)

---

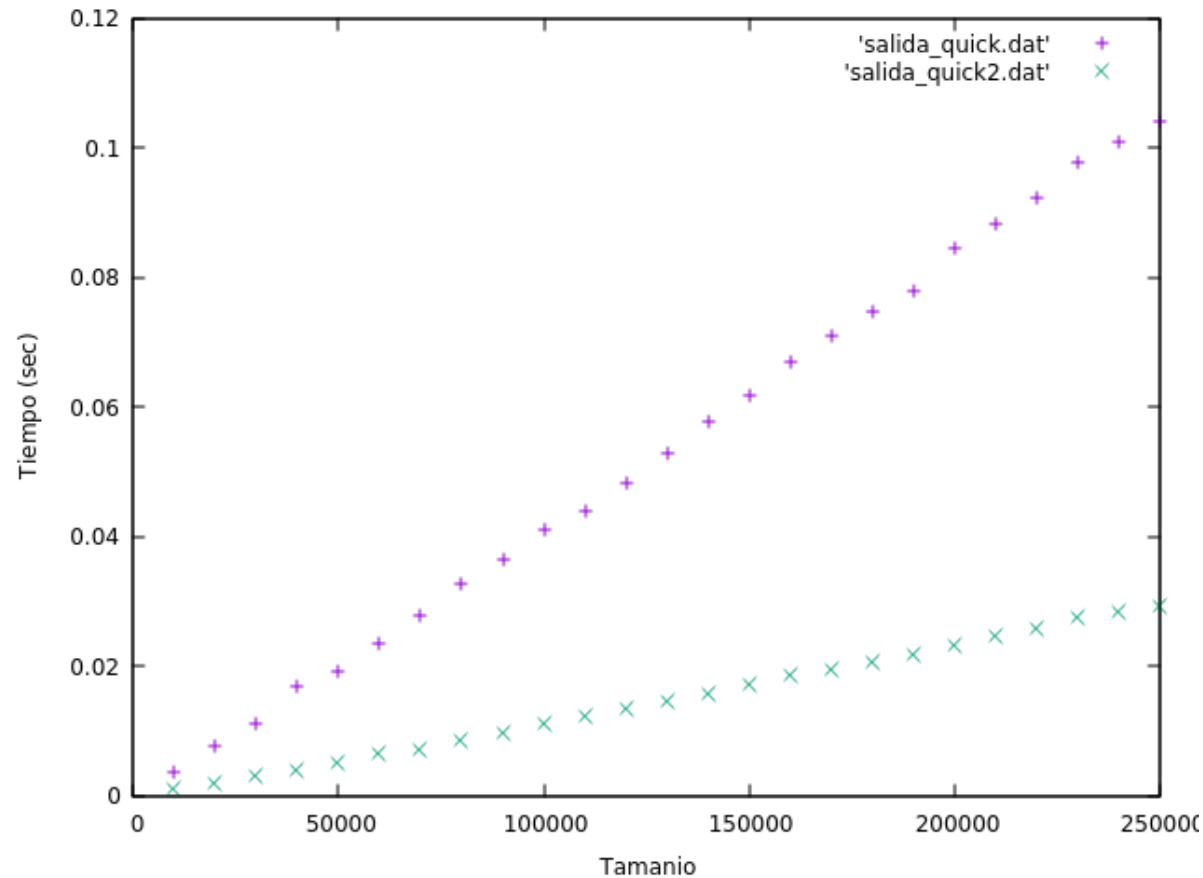


# Inserción compilado con optimización (-O1)



# Quicksort compilado con optimización (-O2)

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# FIN

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MUCHAS GRACIAS