

# Accuracy of FEAST

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- 1 Module to make a Real Symmetric Matrix with Rotations
- 2 Testing how the algorithm works
  - General testing of specific eigenvalues
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## Constructing a real symmetric matrix using rotations

```
Clear[SymMatWithEvals]
SymMatWithEvals[evals_List]:= Module[
  {n=Length[evals],Q,A},
  (* Form a random rotation *)
  Q=QRDecomposition[RandomVariate[NormalDistribution[0,1],{n,n}]][[1]]
  (* Similarity transforms the input eigenvalues to be unrecognizable
  *)
  A=Q.DiagonalMatrix[evals].Transpose[Q];
  0.5 (A + Transpose[A]) (*fixes floating point asymmetry*)
]
```

## Sample of making a symmetric matrix

```
evals={1,25,50,400,1000}  
A=SymMatWithEvals[evals];  
MatrixForm[A]  
Eigenvalues[A]
```

{1,25,50,400,1000}

$$\begin{pmatrix} 75.1925 & 132.076 & 19.3242 & 89.9505 & -119.583 \\ 132.076 & 824.58 & 261.923 & 2.72812 & -212.403 \\ 19.3242 & 261.923 & 148.499 & -47.7745 & -15.6489 \\ 89.9505 & 2.72812 & -47.7745 & 227.988 & -159.199 \\ -119.583 & -212.403 & -15.6489 & -159.199 & 199.74 \end{pmatrix}$$

{1000., 400., 50., 25., 1.}

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## Looking for 1 eigenvalue

Eigenvalues	$\lambda_{min}$	$\lambda_{max}$	$M$	Output
1, 25, 50, 400, 1000	0	5	1	{ 1., 0. }
1, 25, 50, 400, 1000	20	30	1	{ 25., 0. }
1, 25, 50, 400, 1000	45	55	1	{ 50., Indeterminate }
1, 25, 50, 400, 1000	350	500	1	{ 400., 123.586 }
1, 25, 50, 400, 1000	900	1200	1	{ 1000., 365.714 }

## Looking for 2 eigenvalues

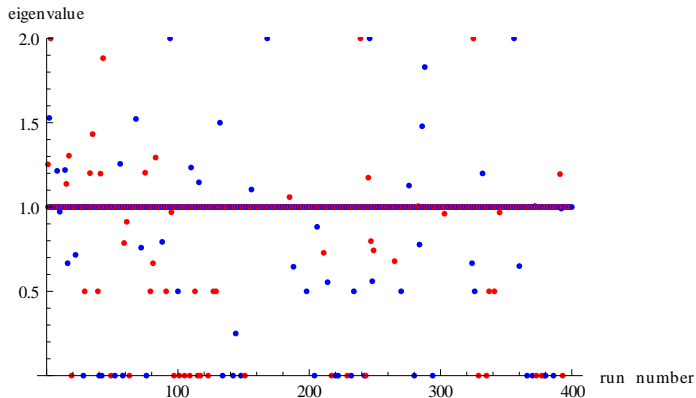
Eigenvalues	$\lambda_{min}$	$\lambda_{max}$	$M$	Output
1,25,50,400,1000	-2	30	2	{50.0013, 25.,1. }
1, 25,50,400,1000	20	75	2	{ 50.,25.,1. }
1,25, 50,400,1000	40	500	2	{ 399.94894163701554 , 49.99974501865308 , 19.06911267847751 }
1,25,50, 400,1000	350	1200	2	{ 1000.,400.,1.81701 }



## Finding multiple eigenvalues

Eigenvalues	$\lambda_{min}$	$\lambda_{max}$	$M$	Output
1,25,50,400,1000	0	60	3	{ 50., 25., 24.6902, 1., 0. }
1, 25,50,400,1000	20	450	3	{ 1006.24, 400., 50., 25., 1. }
1,25, 50,400,1000	40	1500	3	{ 1000., 400., 50., 25., 1. }
1,25,50,400,1000	0	500	4	{ 997.753, 400., 50., 25., 1.00061, 1. }
1, 25,50,400,1000	20	1200	4	{ 1000., 400., 50., 40.0445, 25., 1. }
1,25,50,400,1000	0	1200	5	{ 1000., 400., 50., 49.9727, 25., 22.3177, 1., Indeterminate }

# Finding the same eigenvalue multiple times



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## Looking for eigenvalues near the interval

Eigenvalues	$\lambda_{min}$	$\lambda_{max}$	$M$	Desired $\lambda$	Output
{1, 25, 50, 400, 1000, 20, 45, 500}	0	1	1	1	{1.,0.5}
{1, 25, 50, 400, 1000, 20, 45, 500}	0	.9	1	1	{1.,0.}
{1, 25, 50, 400, 1000, 20, 45, 500}	-1	0	1	1	{23.6169,1.}
{1, 25, 50, 400, 1000, 20, 45, 500}	55	60	1	50	{50.,44.9802}

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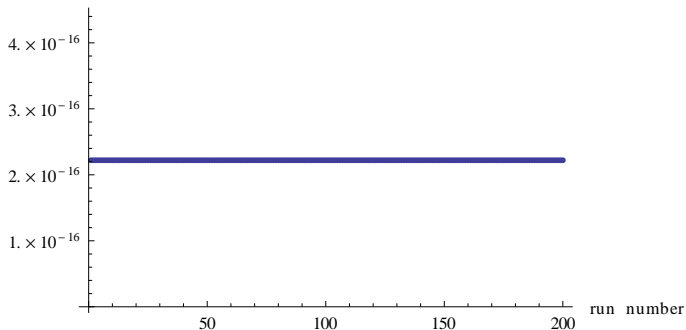
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# Testing accuracy of finding 1 eigenvalue multiple times

Accuracy of eigenvalue



## Testing accuracy with multiple residuals

Correct $\lambda$	Algorithm $\lambda$	$\frac{\ Ax_i - \lambda_i Bx_i\ _1}{\ Ax_i\ _1}$	$\frac{\ \lambda_{actual} - \lambda_{calculated}\ _2}{\ \lambda_{actual}\ _2}$
400	399.94894	0.011915	0.00012765
50	49.99975	0.0021485	$5.09963 \times 10^{-6}$
50	50.	$4.04765 \times 10^{-10}$	$7.10543 \times 10^{-16}$
25	25.	$4.13696 \times 10^{-8}$	$8.5123 \times 10^{-14}$
1	1.	$1.68769 \times 10^{-7}$	$1.9762 \times 10^{-14}$



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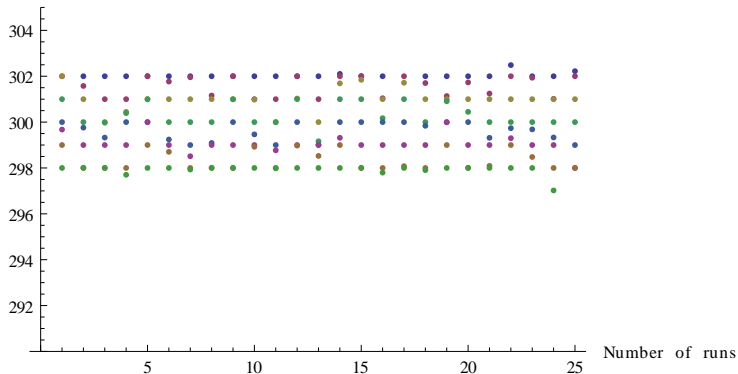
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# Accuracy of clustered eigenvalues

Correct eigenvalues:  $\{1, 298, 299, 300, 301, 302, 600\}$

Range:  $[290, 305]$

Eigen Values

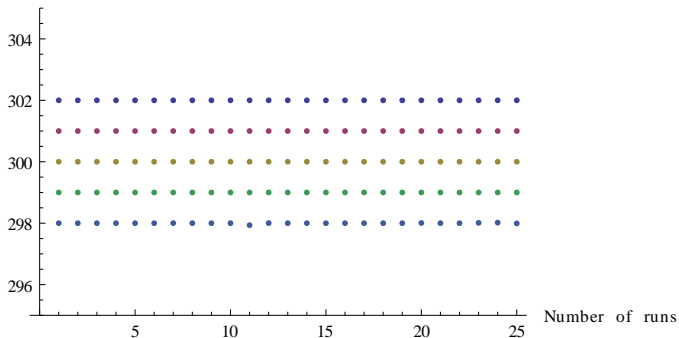


# Accuracy of clustered eigenvalues

Correct eigenvalues:  $\{1, 298, 299, 300, 301, 302, 600\}$

Range:  $[300, 305]$

Eigen Values



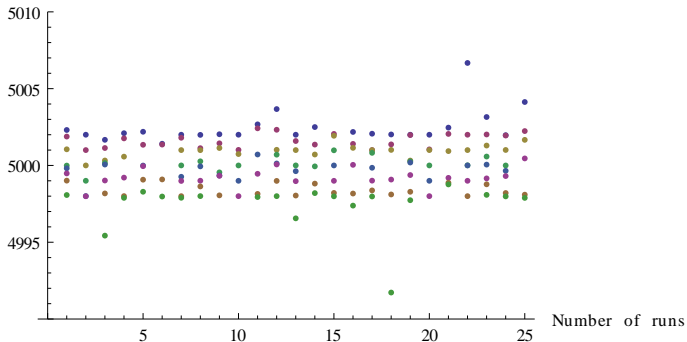
## Algorithm gives complex eigenvalues

30 clustered eigenvalues

$M = 30$

Range: [4900,5050]

Eigen Values



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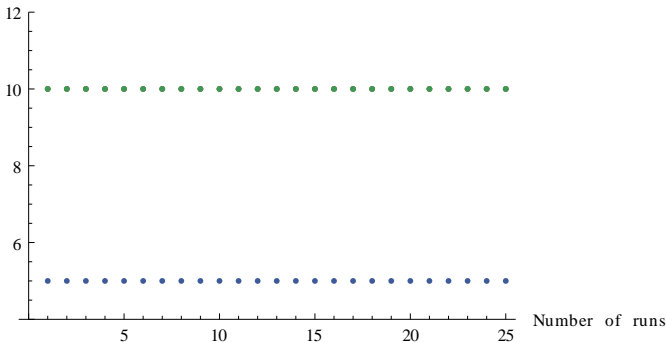
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  - **Accuracy of finding repeated eigenvalues**
  - Accuracy of finding small eigenvalues

## Repeated eigenvalues

Correct eigenvalues:  $\{1, 5, 10, 10, 10, 15, 20, 25\}$

Range:  $[4,12]$

Eigen Values



## Repeated eigenvalues

Correct $\lambda$	Calculated $\lambda$	Difference
5	5.0000000000000304	$3.037570195374428 \times 10^{-13}$
10	10.0000000000000004	$3.55271367880050 \times 10^{-15}$
10	10.0000000000000012	$1.243449787580175 \times 10^{-14}$
10	10.0000000000000357	$3.570477247194503 \times 10^{-13}$

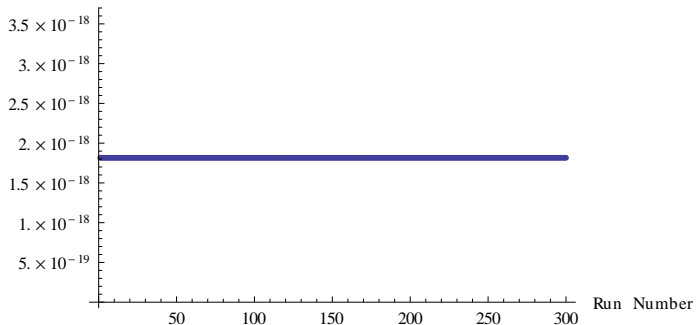
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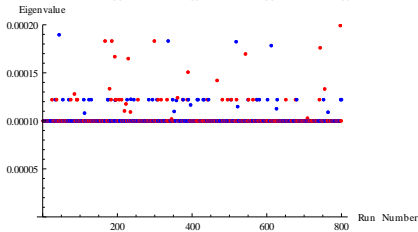
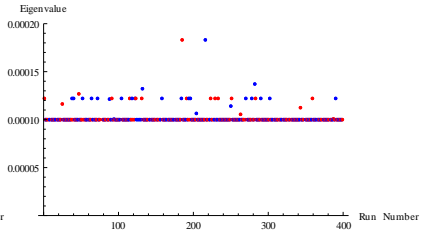
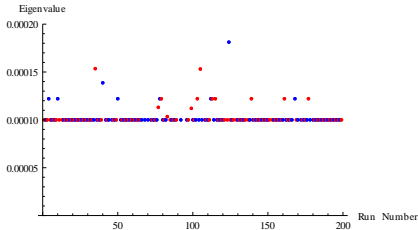


## Accuracy of finding a small eigenvalue

Accuracy of Eigenvalue



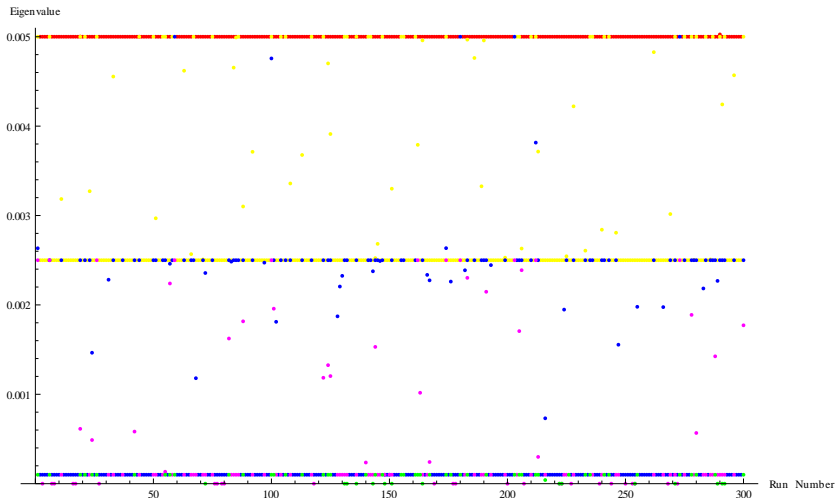
# Ghost eigenvalue



Module to make a Real Symmetric Matrix with Rotations  
Testing how the algorithm works  
Testing how accurate the algorithm is

Accuracy of finding 1 eigenvalue  
Testing accuracy of finding clustered eigenvalues  
Accuracy of finding repeated eigenvalues  
Accuracy of finding small eigenvalues

## Finding 3 eigenvalues



## Accuracy of finding 3 small eigenvalues

Correct $\lambda$	Algorithm $\lambda$	$\frac{\ Ax_i - \lambda_i Bx_i\ _1}{\ Ax_i\ _1}$	$\frac{\ \lambda_{actual} - \lambda_{calculated}\ _2}{\ \lambda_{actual}\ _2}$
0.0050	0.005	$1.97687 \times 10^{-11}$	$1.73472 \times 10^{-16}$
0.0025	0.0025	$1.87104 \times 10^{-9}$	$1.21431 \times 10^{-15}$
0.0001	0.0001	$7.91298 \times 10^{-9}$	$1.07065 \times 10^{-14}$

Module to make a Real Symmetric Matrix with Rotations  
Testing how the algorithm works  
Testing how accurate the algorithm is

Accuracy of finding 1 eigenvalue  
Testing accuracy of finding clustered eigenvalues  
Accuracy of finding repeated eigenvalues  
Accuracy of finding small eigenvalues

Questions?