# **Matrix Depot Documentation**

Release 0.1.0

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Matrix Depot is an extensible test matrix collection for Julia. It provides a diverse collection of test matrices, including parametrized matrices and real-life matrices.

- Source at Github
- Release Notes

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### CHAPTER 1

Installation

To install the release version, type:

```
julia> ]
pkg> add MatrixDepot
```

### 1.1 Usage

Every matrix in the collection is represented by a string "matrix\_name", for example, the Cauchy matrix is represented by "cauchy" and the Hilbert matrix is represented by "hilb".

The matrix groups are noted as symbols. For example, the class of the symmetric matrices is symbolized by :symmetric.

#### mdinfo()

Return a list of all the matrices in the collection:

```
julia> matrixdepot()
 Matrices:

1) baart 2) binomial 3) blur 4) cauchy
5) chebspec 6) chow 7) circul 8) clement
9) companion 10) deriv2 11) dingdong 12) fiedler
13) forsythe 14) foxgood 15) frank 16) golub
17) gravity 18) grcar 19) hadamard 20) hankel
21) heat 22) hilb 23) invhilb 24) invol
25) kahan 26) kms 27) lehmer 28) lotkin
29) magic 30) minij 31) moler 32) neumann
33) oscillate 34) parter 35) pascal 36) pei
37) phillips 38) poisson 39) prolate 40) randcor
41) rando 42) randsvd 43) rohess 44) rosser
45) sampling 46) shaw 47) spikes 48) toeplit
49) tridiag 50) triw 51) ursell 52) vand
Matrices:
                                                                                                                                                                                                                                                                              32) neumann
                                                                                                                                                                                                                                                                           40) randcorr
                                                                                                                                                                                                                                                                            48) toeplitz
```

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```
53) wathen 54) wilkinson 55) wing
Groups:
all data eigen illcond
inverse posdef random regprob
sparse symmetric
```

#### matrixdepot (matrix\_name, p1, p2, ...)

Return a matrix specified by the query string matrix\_name. p1, p2, ... are input parameters depending on matrix\_name. For example:

```
julia> matrixdepot("hilb", 5, 4)
5x4 Array{Float64,2}:
1.0      0.5      0.333333      0.25
0.5      0.333333      0.25      0.2
0.333333      0.25      0.2      0.166667
0.25      0.2      0.166667      0.142857
0.2      0.166667      0.142857      0.125
```

#### mdinfo(matrix name)

Return the documentation of matrix\_name, including input options, groups and reference. For example:

#### listnames (group\_name)

Return a list of matrices which belong to group group\_name. For example:

```
julia> matrixdepot(:posdef)
11-element Array{ASCIIString,1}:
    "hilb"
    "cauchy"
    "circul"
    "invhilb"
    "moler"
    "pascal"
    "pei"
    "minij"
```

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```
"tridiag"
"lehmer"
"poisson"
```

#### listnames (group1 & group2 & ...)

Return a list of matrices which belong to group1 and group2, etc. For example:

```
julia> mdlist(:symmetric & :inverse, :illcond & :posdef)
7-element Array{ASCIIString,1}:
"hilb"
"cauchy"
"invhilb"
"moler"
"pascal"
"pei"
"tridiag"
```

#### mdlist ({builtinuserspmm}(num))

Access matrix by number. For example:

```
julia> mdlist(builtin(3))
"chebspec"
```

#### mdlist (builtin(num1:num2, ...))

**Access matrix by range and combinations. For example::** julia> mdlist(builtin(1:4, 6, 10:15)) 11-element Array{String,1}:

```
"baart" "binomial" "blur" "cauchy" "chow" "deriv2" "dingdong" "erdrey" "fiedler" "forsythe" "foxgood"
```

#### mdinfo(name)

Output matrix information, where name is a matrix data name or pattern.

#### matrixdepot (name, arg...)

Generate the matrix data given by name.

We can define our own groups using the macro @addgroup and remove a defined group using @rmgroup.

```
@addgroup group_name = ["matrix1", "matrix2", "matrix3"]
```

Create a new group "group\_name" such that it has members "matrix1", "matrix2" and "matrix3".

#### @rmgroup group\_name

Delete a created group group\_name.

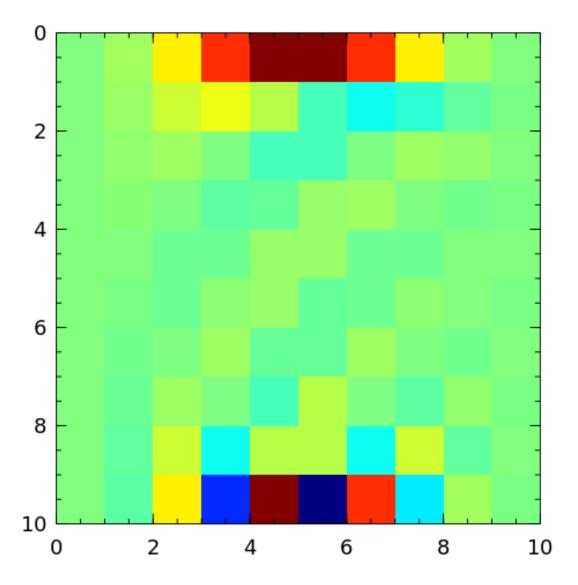
#### 1.2 Matrices

- binomial
- cauchy
- chebspec
- chow
- circul
- clement

- companion
- dingdong
- fiedler
- forsythe
- frank
- golub
- grcar
- hadamard
- hankel
- hilb
- invhilb
- invol
- kahan
- kms
- lehmer
- lotkin
- magic
- minij
- moler
- neumann
- oscillate
- parter
- pascal
- pei
- poisson
- prolate
- randcorr
- rando
- randsvd
- rohess
- rosser
- sampling
- toeplitz
- tridiag
- triw
- vand

- wathen
- wilkinson

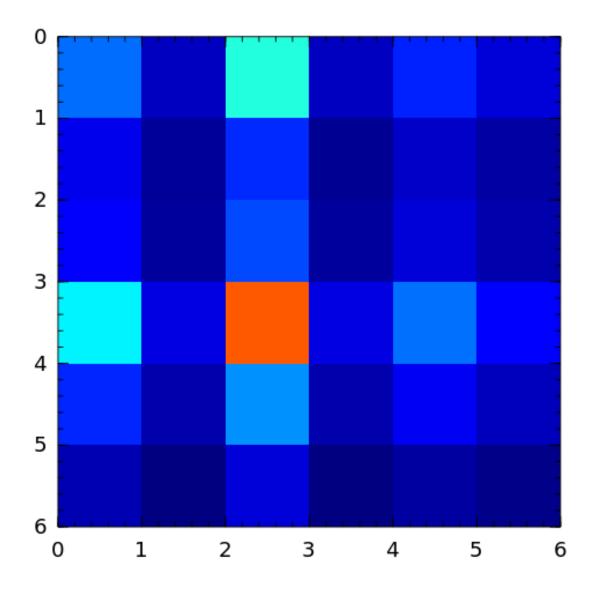
**binomial** A binomial matrix that arose from the example in [bmsz01]. The matrix is a multiple of involutory matrix.



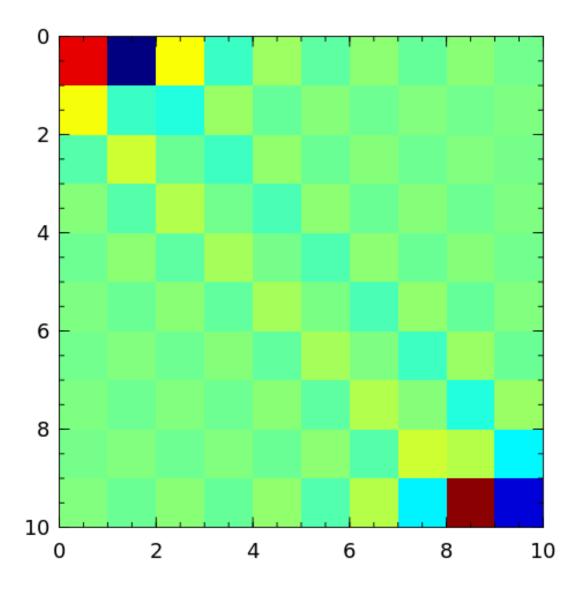
 ${\bf cauchy}\;$  The Cauchy matrix is an m-by-n matrix with (i,j) element

$$\frac{1}{x_i - y_i}, \quad x_i - y_i \neq 0,$$

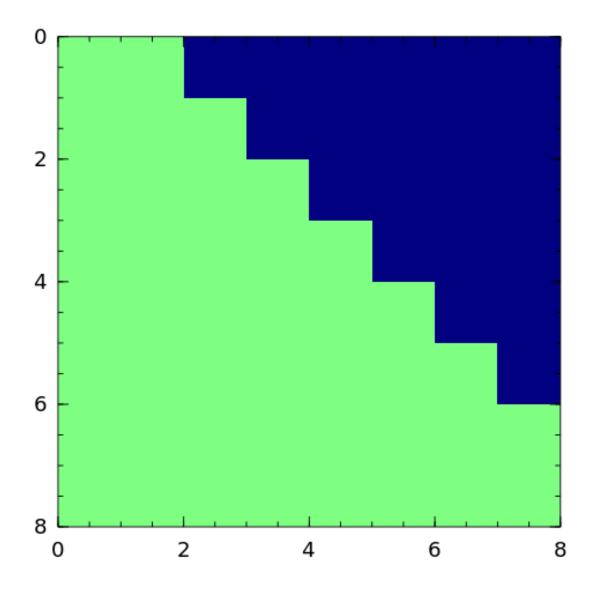
where  $x_i$  and  $y_i$  are elements of vectors x and y.



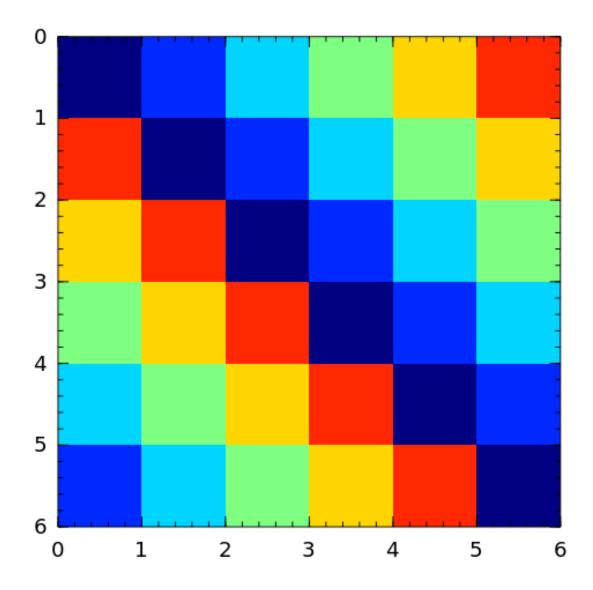
**chebspec** Chebyshev spectral differentiation matrix. If k = 0, the generated matrix is nilpotent and a vector with all one entries is a null vector. If k = 1, the generated matrix is nonsingular and well-conditioned. Its eigenvalues have negative real parts.



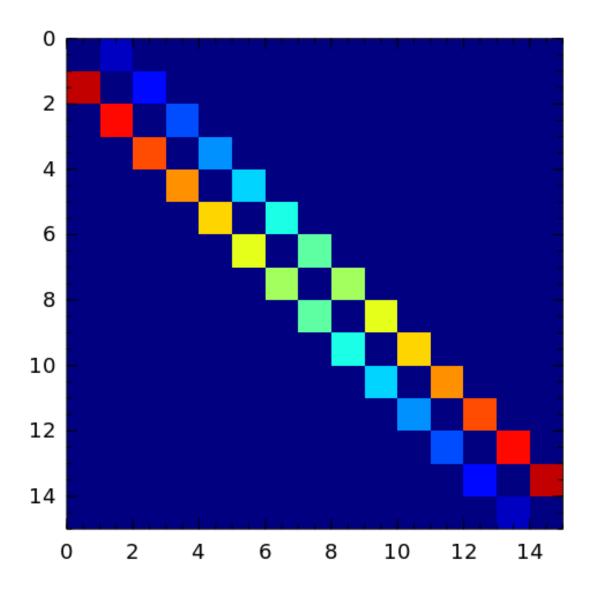
**chow** The Chow matrix is a singular Toeplitz lower Hessenberg matrix. The eigenvalues are known explicitly [chow69].



**circul** A circulant matrix has the property that each row is obtained by cyclically permuting the entries of the previous row one step forward.



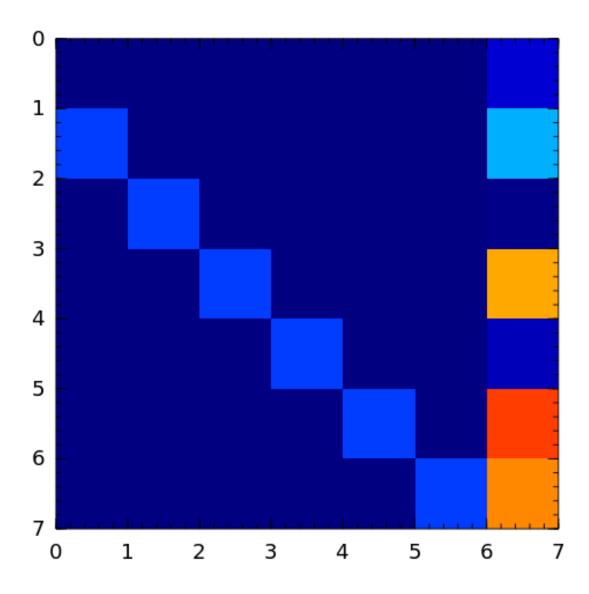
**clement** The Clement matrix [clem59] is a Tridiagonal matrix with zero diagonal entries. If k = 1, the matrix is symmetric.



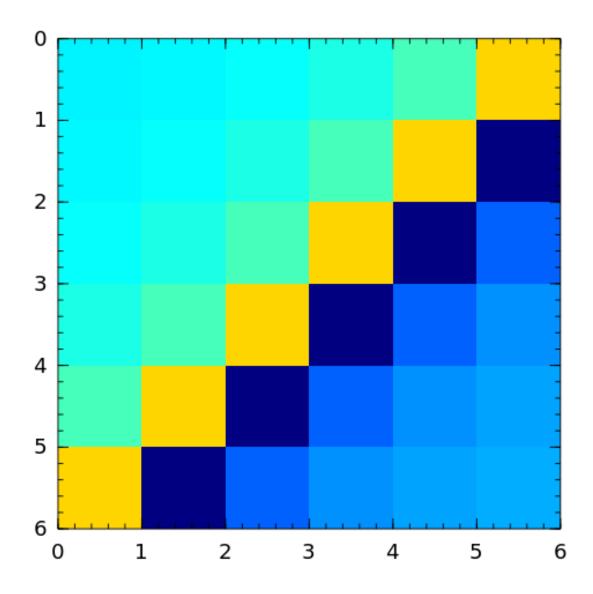
companion The companion matrix to a monic polynomial

$$a(x) = a_0 + a_1 x + \dots + a_{n-1} x^{n-1} + x^n$$

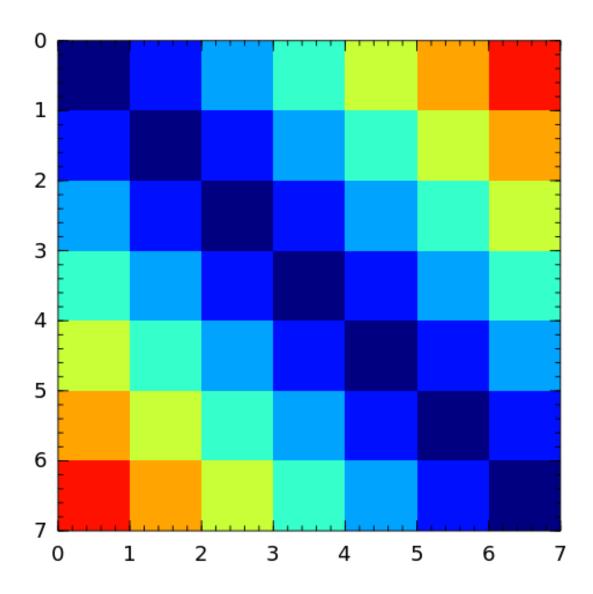
is the n-by-n matrix with ones on the subdiagonal and the last column given by the coefficients of a(x).



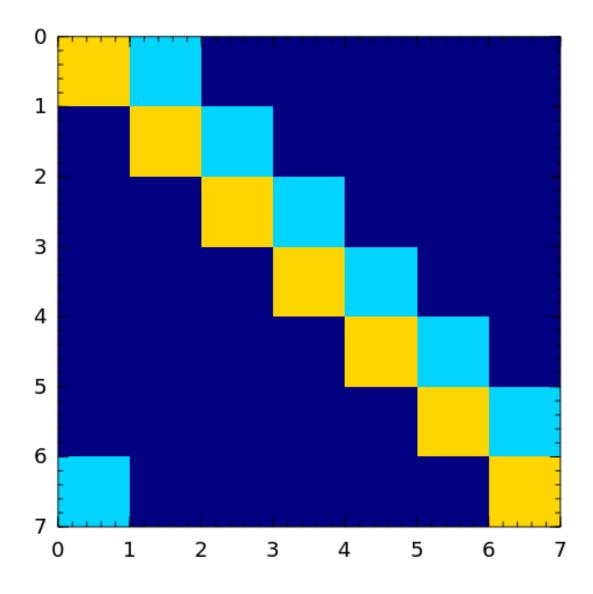
**dingdong** The Dingdong matrix is symmetric Hankel matrix invented by Dr. F. N. Ris of IBM, Thomas J Watson Research Centre. The eigenvalues cluster around  $\pi/2$  and  $-\pi/2$  [nash90].



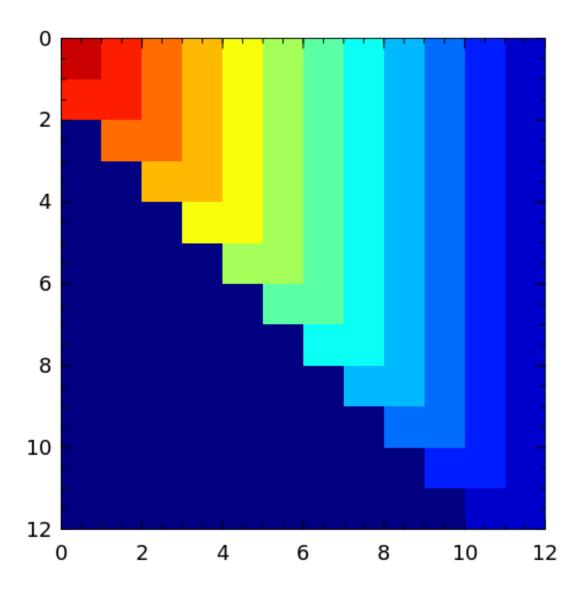
**fiedler** The Fiedler matrix is symmetric matrix with a dominant positive eigenvalue and all the other eigenvalues are negative. For explicit formulas for the inverse and determinant, see [todd77].



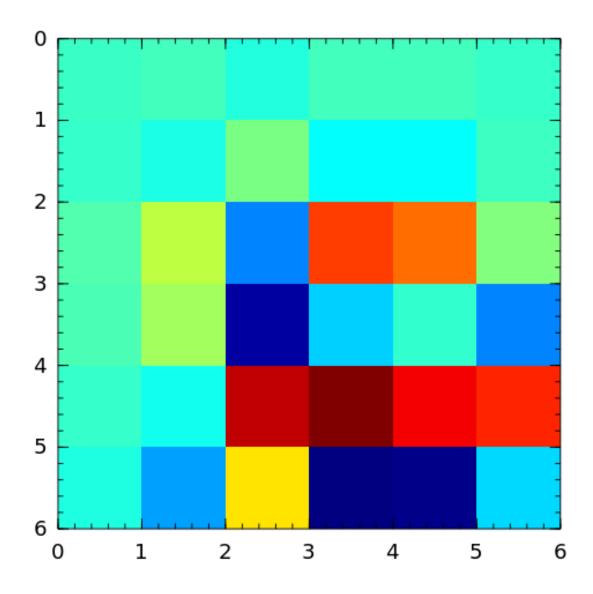
**forsythe** The Forsythe matrix is a n-by-n perturbed Jordan block.



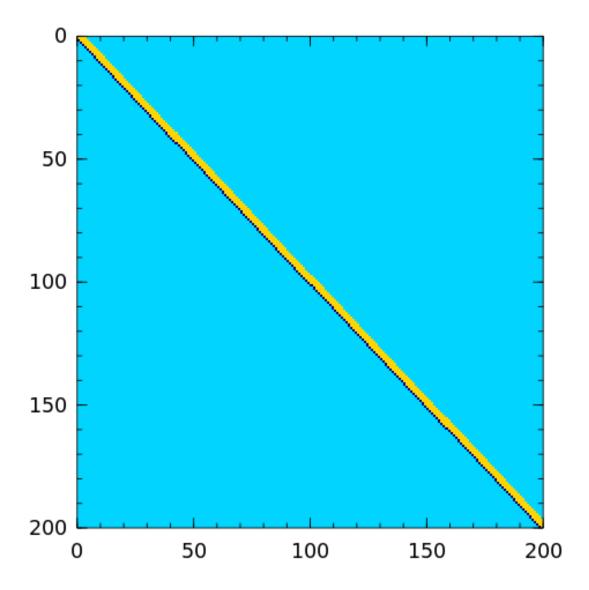
**frank** The Frank matrix is an upper Hessenberg matrix with determinant 1. The eigenvalues are real, positive and very ill conditioned *[vara86]*.



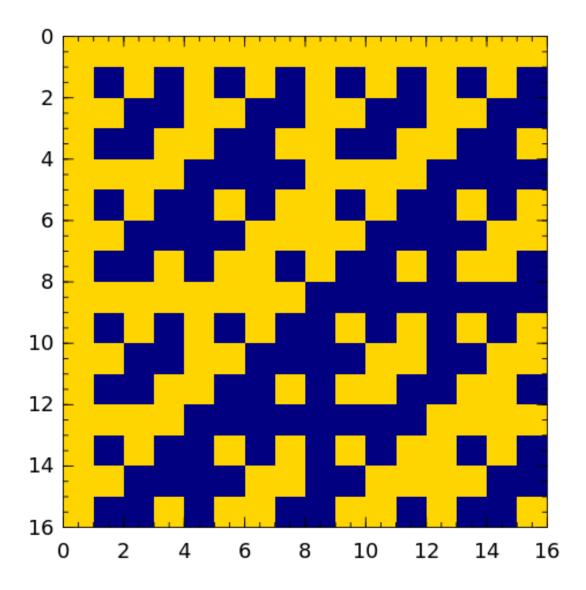
**golub** Golub matrix is the product of two random unit lower and upper triangular matrices respectively. LU factorization without pivoting fails to reveal that such matrices are badly conditioned [vistre98].



**grear** The Grear matrix is a Toeplitz matrix with sensitive eigenvalues. The image below is a 200-by-200 Grear matrix used in *[nrt92]*.



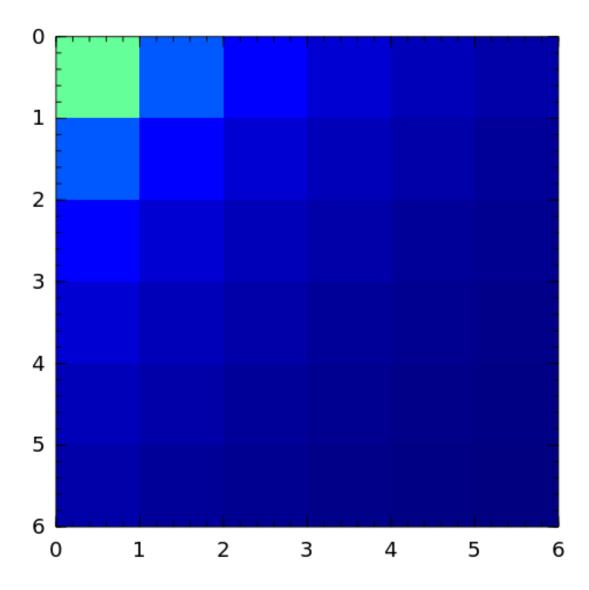
**hadamard** The Hadamard matrix is a square matrix whose entries are 1 or -1. It was named after Jacques Hadamard. The rows of a Hadamard matrix are orthogonal.



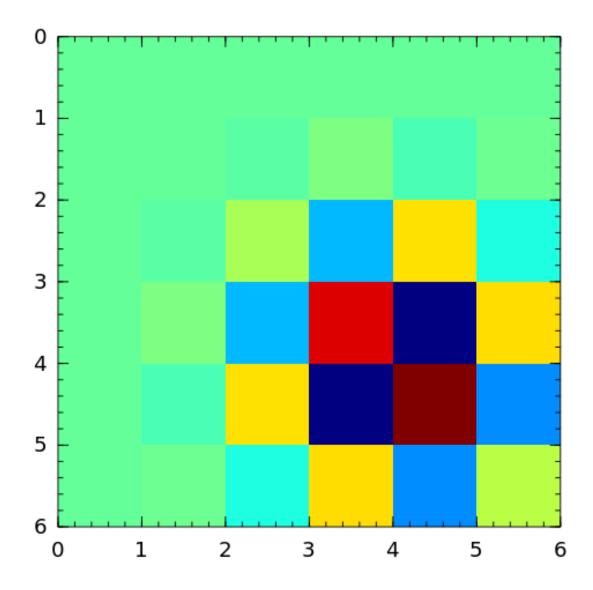
hankel Hankel matrix is a a matrix that is symmetric and constant across the anti-diagonals. For example:

```
julia> matrixdepot("hankel", [1,2,3,4], [7,8,9,10])
4x4 Array{Float64,2}:
1.0  2.0  3.0  4.0
2.0  3.0  4.0  8.0
3.0  4.0  8.0  9.0
4.0  8.0  9.0  10.0
```

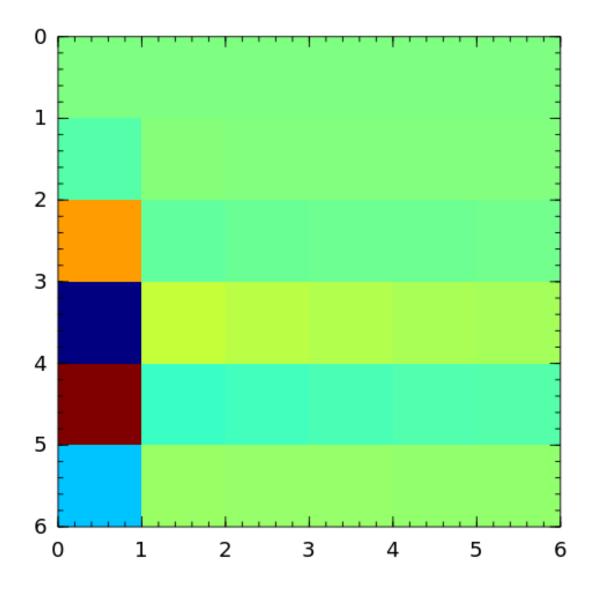
**hilb** The Hilbert matrix is a very ill conditioned matrix. But it is symmetric positive definite and totally positive so it is not a good test matrix for Gaussian elimination [high02] (Sec. 28.1).



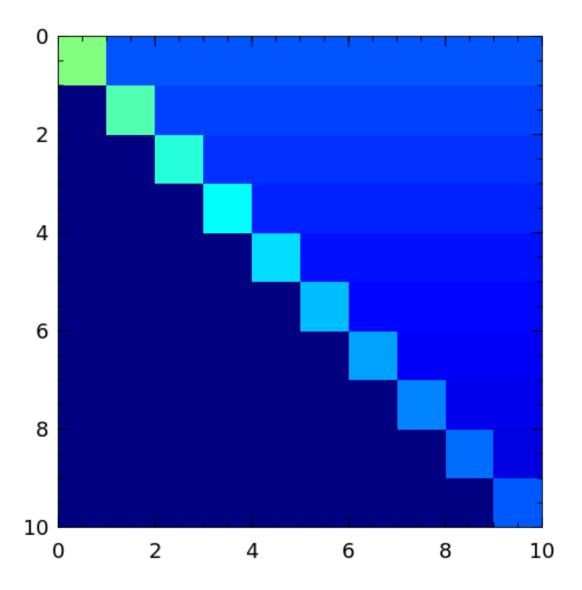
invhilb Inverse of the Hilbert Matrix.



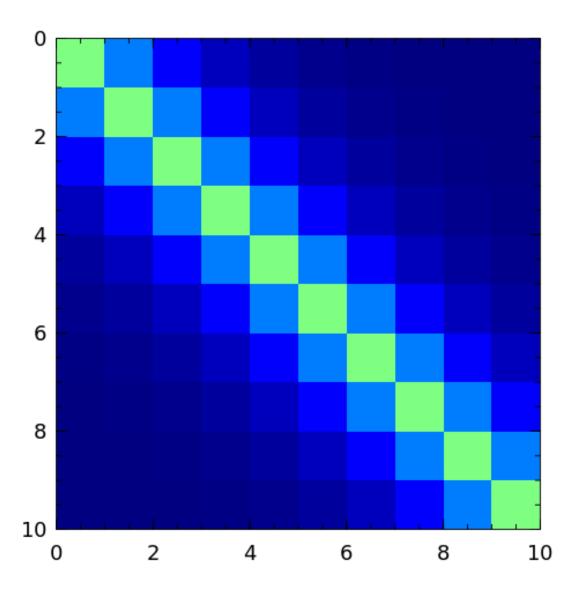
**invol** An involutory matrix, i.e., a matrix that is its own inverse. See [hoca63].



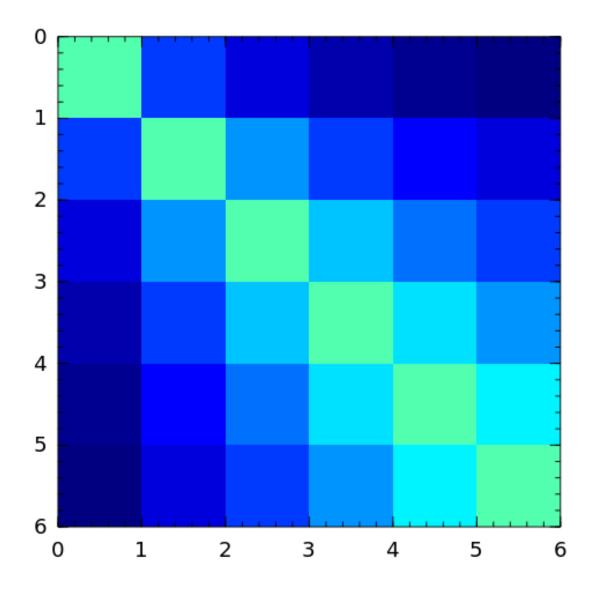
**kahan** The Kahan matrix is a upper trapezoidal matrix, i.e., the (i,j) element is equal to 0 if i>j. The useful range of theta is  $0< theta < \pi$ . The diagonal is perturbed by pert\*eps()\*diagm([n:-1:1]).



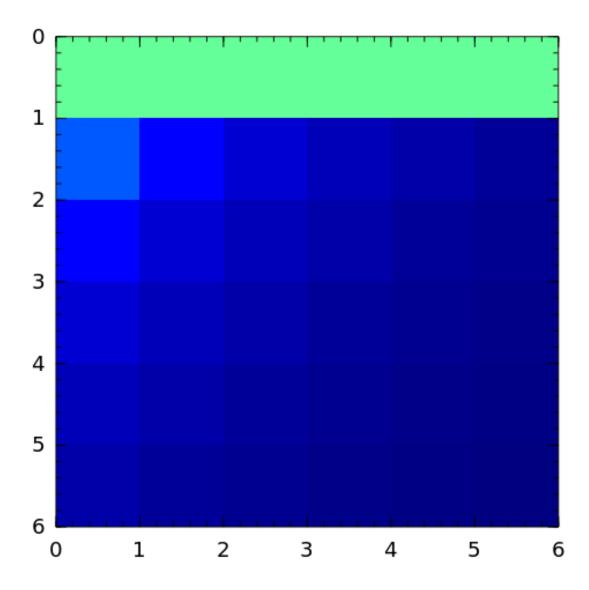
kms Kac-Murdock-Szego Toeplitz matrix [tren89].



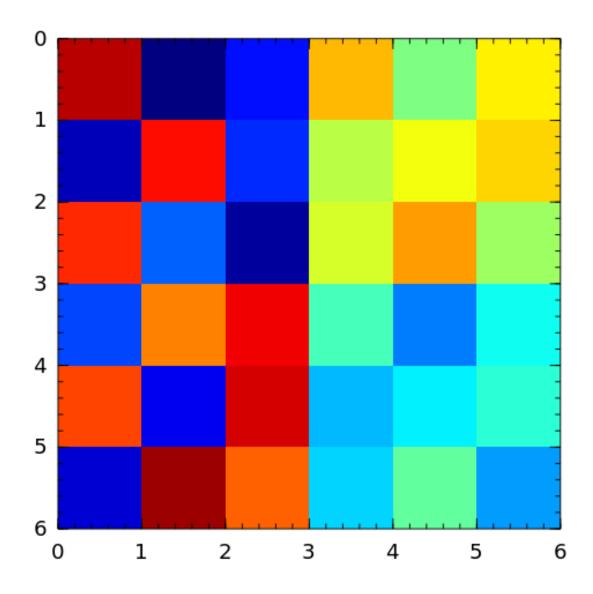
**lehmer** The Lehmer matrix is a symmetric positive definite matrix. It is totally nonnegative. The inverse is tridiagonal and explicitly known [neto58].



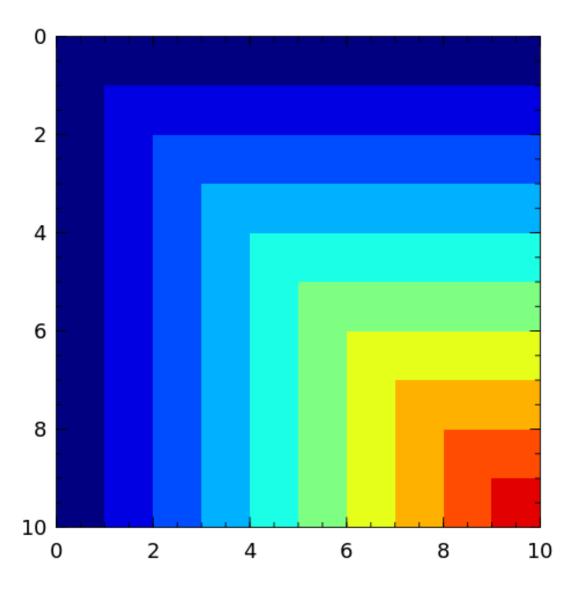
**lotkin** The Lotkin matrix is the Hilbert matrix with its first row altered to all ones. It is unsymmetric, ill-conditioned and has many negative eigenvalues of small magnitude [lotk55].



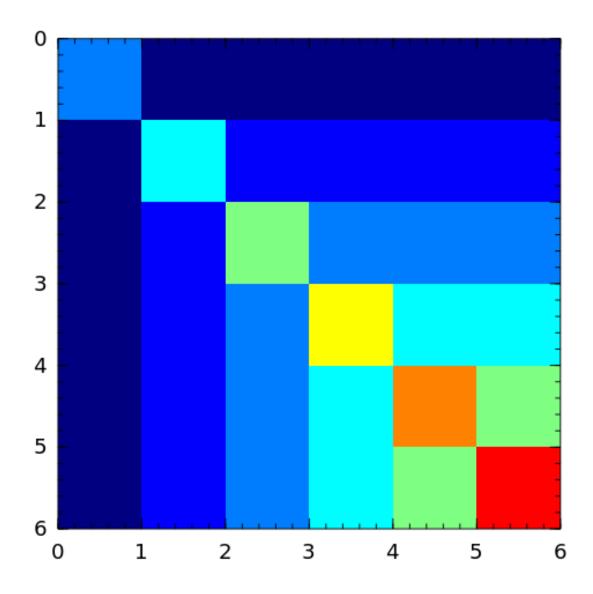
**magic** The magic matrix is a matrix with integer entries such that the row elements, column elements, diagonal elements and anti-diagonal elements all add up to the same number.



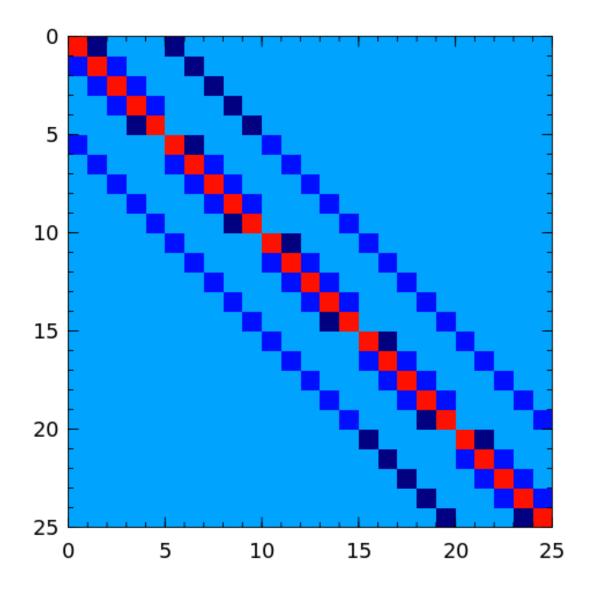
**minij** A matrix with (i, j) entry  $\min(i, j)$ . It is a symmetric positive definite matrix. The eigenvalues and eigenvectors are known explicitly. Its inverse is tridiagonal.



**moler** The Moler matrix is a symmetric positive definite matrix. It has one small eigenvalue.



**neumann** A singular matrix from the discrete Neumann problem. This matrix is sparse and the null space is formed by a vector of ones [plem76].



**oscillate** A matrix A is called oscillating if A is totally nonnegative and if there exists an integer q > 0 such that  $A^q$  is totally positive. An  $n \times n$  oscillating matrix A satisfies:

- 1. A has n distinct and positive eigenvalues  $\lambda_1 > \lambda_2 > \cdots > \lambda_n > 0$ .
- 2. The i th eigenvector, corresponding to  $\lambda_i$  in the above ordering, has exactly i-1 sign changes.

This function generates a symmetric oscillating matrix, which is useful for testing numerical regularization methods [hansen95]. For example:

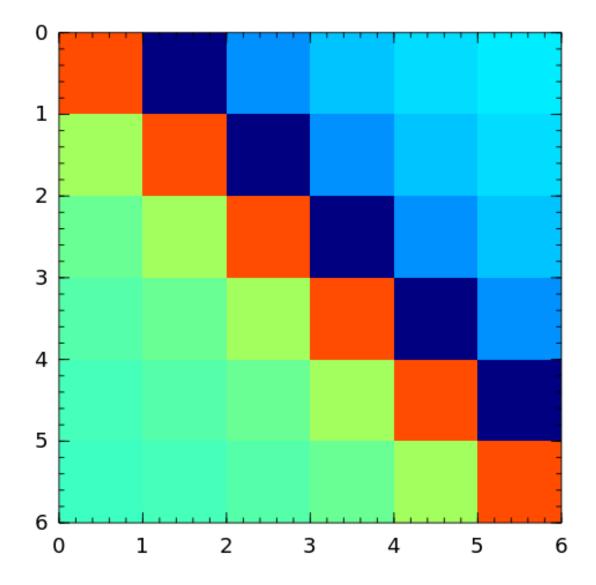
```
julia> A = matrixdepot("oscillate", 3)
3x3 Array{Float64,2}:
0.98694    0.112794    0.0128399
0.112794    0.0130088    0.0014935
0.0128399    0.0014935    0.00017282

julia> eig(A)
([1.4901161192617526e-8,0.00012207031249997533,0.999999999999999],
```

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**parter** The Parter matrix is a Toeplitz and Cauchy matrix with singular values near  $\pi$  [part86].



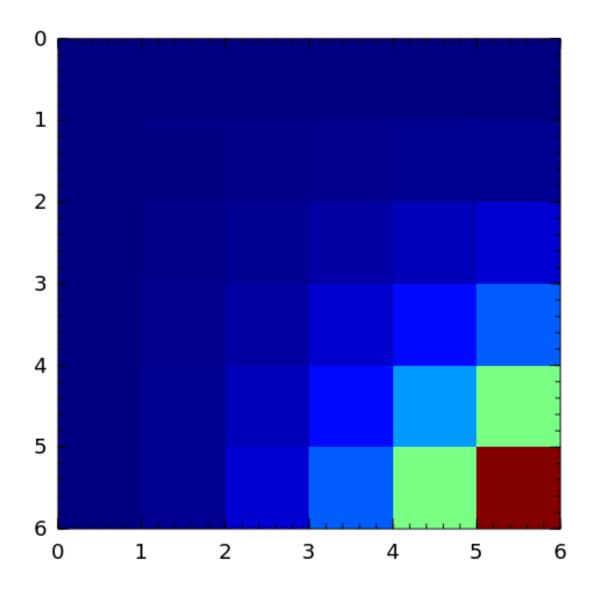
pascal The Pascal matrix's anti-diagonals form the Pascal's triangle:

```
julia> matrixdepot("pascal", 6)
6x6 Array{Int64,2}:
1 1 1 1
            1
                 1
     3
            5
1 2
        4
                6
1 3
     6 10
            15
               21
 4 10 20
            35
               56
1 5 15 35
            70 126
```

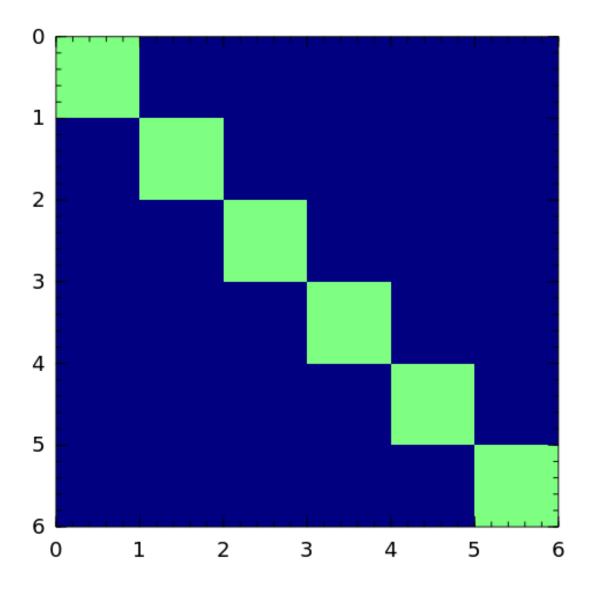
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1 6 21 56 126 252

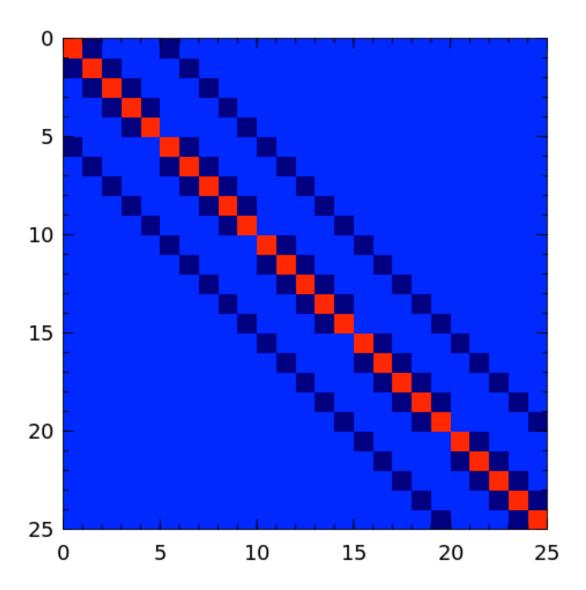
See [high02] (28.4).



**pei** The Pei matrix is a symmetric matrix with known inverse [pei62].



**poisson** A block tridiagonal matrix from Poisson's equation. This matrix is sparse, symmetric positive definite and has known eigenvalues.

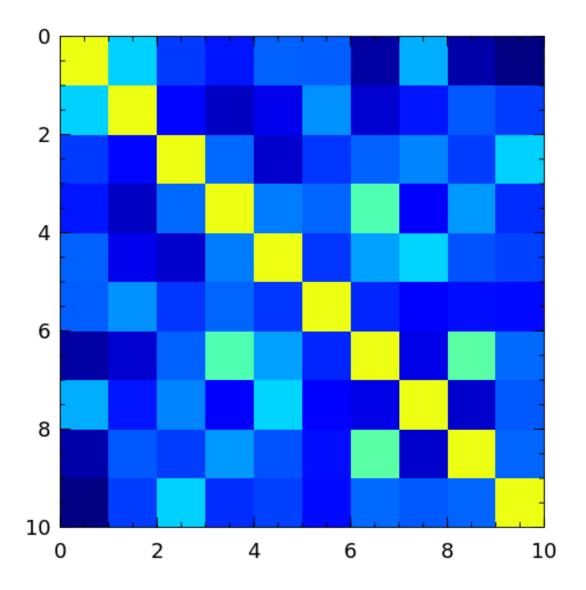


prolate A prolate matrix is a symmetric ill-conditioned Toeplitz matrix

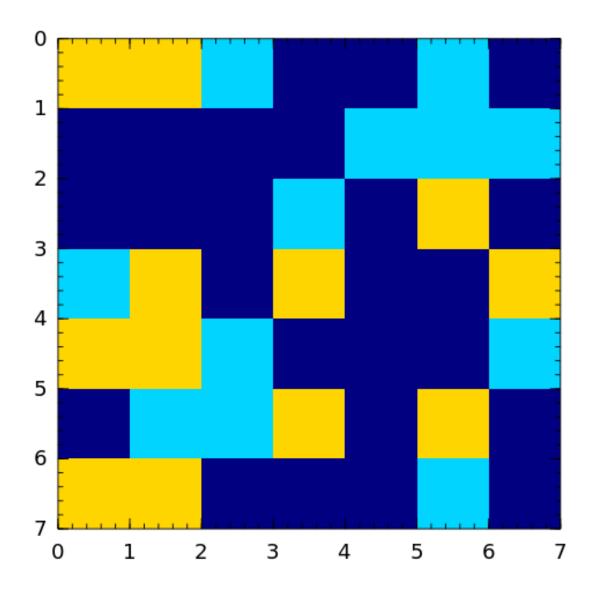
$$A = \begin{bmatrix} a_0 & a_1 & \cdots \\ a_1 & a_0 & \cdots \\ \vdots & \vdots & \ddots \end{bmatrix}$$

such that  $a_0 = 2w$  and  $a_k = (\sin 2\pi w k)/\pi k$  for  $k = 1, 2, \ldots$  and 0 < w < 1/2 [varah93].

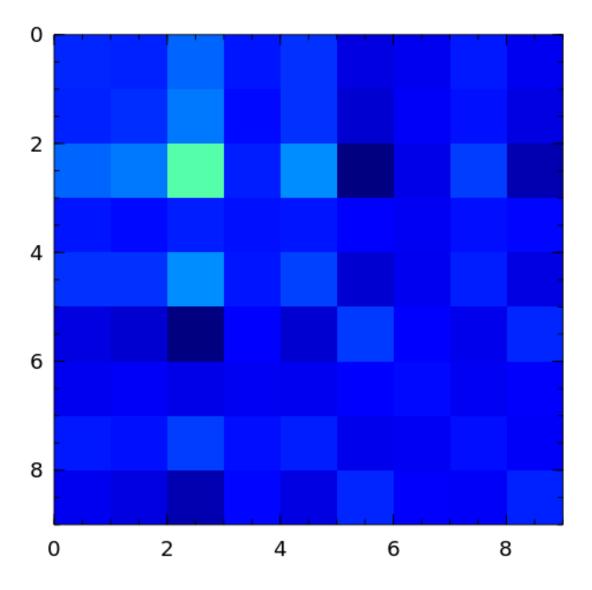
randcorr A random correlation matrix is a symmetric positive semidefinite matrix with 1s on the diagonal.



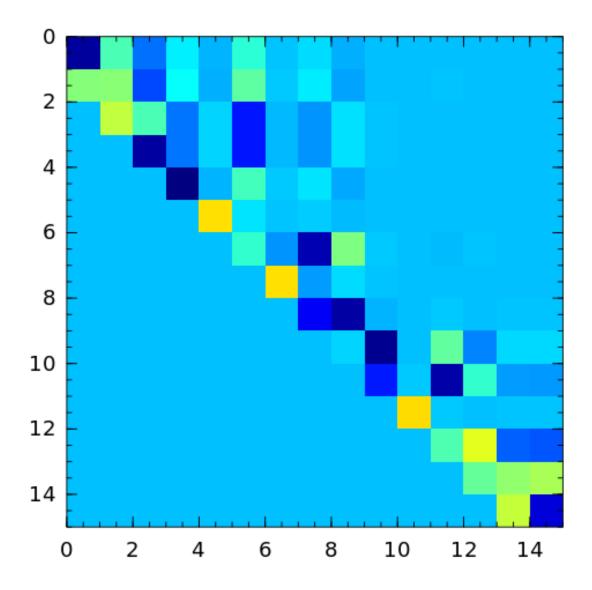
rando A random matrix with entries -1, 0 or 1.



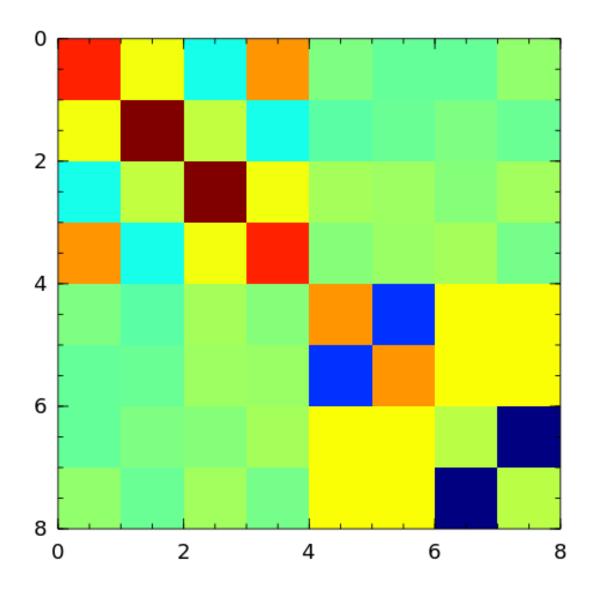
randsvd Random matrix with pre-assigned singular values. See [high02] (Sec. 28.3).



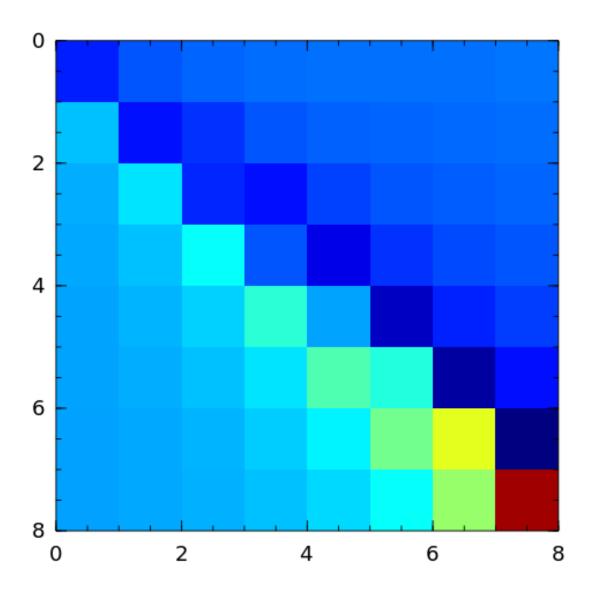
rohess A random orthogonal upper Hessenberg matrix. The matrix is constructed via a product of Givens rotations.



rosser The Rosser matrix's eigenvalues are very close together so it is a challenging matrix for many eigenvalue algorithms. matrixdepot("rosser", 8, 2, 1) generates the test matrix used in the paper [rlhk51]. matrixdepot("rosser") are more general test matrices with similar property.



**sampling** Matrices with application in sampling theory. A n-by-n nonsymmetric matrix with eigenvalues  $0,1,2,\ldots,n-1$  [botr07].



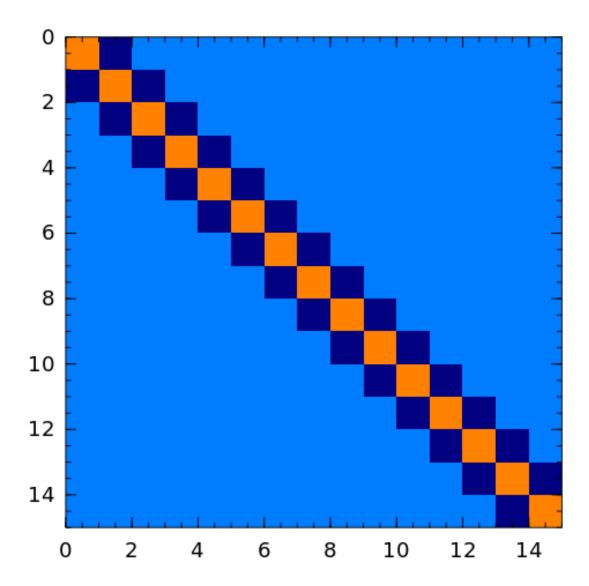
toeplitz Toeplitz matrix is a matrix in which each descending diagonal from left to right is constant. For example:

```
julia> matrixdepot("toeplitz", [1,2,3,4], [1,4,5,6])
4x4 Array{Int64,2}:
1  4  5  6
2  1  4  5
3  2  1  4
4  3  2  1

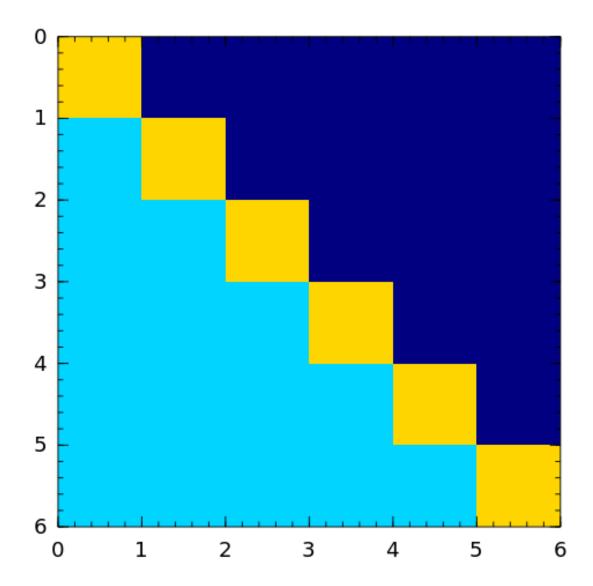
julia> matrixdepot("toeplitz", [1,2,3,4])
4x4 Array{Int64,2}:
1  2  3  4
2  1  2  3
3  2  1  2
4  3  2  1
```

tridiag A group of tridiagonal matrices. matrixdepot("tridiagonal", n) generate a tridiagonal matrix

with 1 on the diagonal and -2 on the upper- lower- diagonal, which is a symmetric positive definite M-matrix. This matrix is also known as Strang's matrix, named after Gilbert Strang.



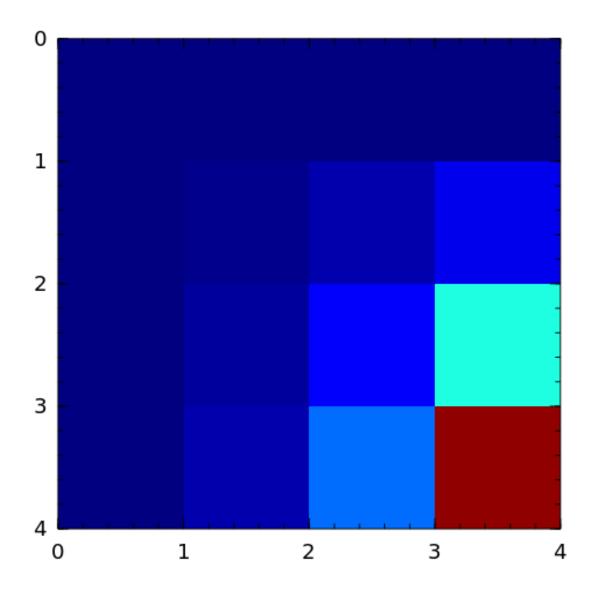
**triw** Upper triangular matrices discussed by Wilkinson and others [gowi76].



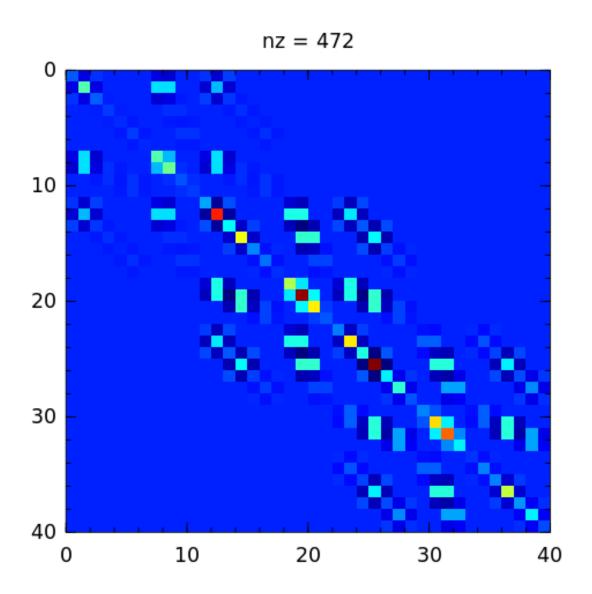
**vand** The Vandermonde matrix is defined in terms of scalars  $\alpha_0, \alpha_1, \dots, \alpha_n$  by

$$V(\alpha_0, \dots, \alpha_n) = \begin{bmatrix} 1 & 1 & \cdots & 1 \\ \alpha_0 & \alpha_1 & \cdots & \alpha_n \\ \vdots & \vdots & & \vdots \\ \alpha_0^n & \alpha_1^n & \cdots & \alpha_n^n \end{bmatrix}.$$

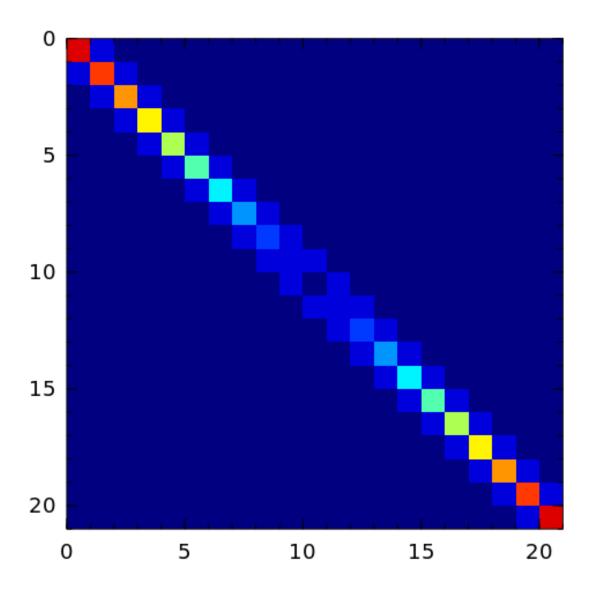
The inverse and determinant are known explicitly [high02].



wathen The Wathen matrix is a sparse, symmetric positive, random matrix arising from the finite element method [wath87]. It is the consistent mass matrix for a regular nx-by-ny grid of 8-node elements.



wilkinson The Wilkinson matrix is a symmetric tridiagonal matrix with pairs of nearly equal eigenvalues. The most frequently used case is matrixdepot ("wilkinson", 21).



**Note:** The images are generated using Winston.jl 's imagesc function.

# 1.3 Random Graphs

- erdrey
- gilbert
- smallworld

**erdrey** An adjacency matrix of an Erdős–Rényi random graph: an undirected graph is chosen uniformly at random from the set of all symmetric graphs with a fixed number of nodes and edges. For example:

```
julia> using Random; Random.seed!(0);

julia> matrixdepot("erdrey", Int8, 5, 3)

5×5 SparseMatrixCSC{Int8,Int64} with 6 stored entries:
  [2, 1] = 1
  [4, 1] = 1
  [1, 2] = 1
  [1, 4] = 1
  [5, 4] = 1
  [4, 5] = 1
```

**gilbert** An adjacency matrix of a Gilbert random graph: each possible edge occurs independently with a given probability.

**smallworld** Motivated by the small world model proposed by Watts and Strogatz [wast98], we proposed a random graph model by adding shortcuts to a kth nearest neighbor ring (node i and j are connected iff  $|i-j| \le k$  or  $|n-|i-j|| \le k$ ).

```
julia> mdinfo("smallworld")
    Small World Network (smallworld)

Generate an adjacency matrix for a small world network. We model it by adding_
    ⇒shortcuts to a
    kth nearest neighbour ring network (nodes i and j are connected iff |i -j| <= k or_
    ⇒|n - |i
    -j| <= k.) with n nodes.

Input options:

• [type,] n, k, p: the dimension of the matrix is n. The number of nearest—
    neighbours
    to connect is k. The probability of adding a shortcut in a given row is p.

• [type,] n: k = 2 and p = 0.1.

References:

.. [wast98] D.J. Watts and S. H. Strogatz. Collective Dynamics of Small World
    Networks, Nature 393 (1998), pp. 440-442.</pre>
```

# 1.4 Test Problems for Regularization Methods

A Fredholm integral equation of the first kind (in 1-dimensional) can be written as

$$\int_0^1 K(s,t)f(t)dt = g(s), \quad 0 \le s \le 1,$$

where g and K (called kernel) are known functions and f is the unknown solution. This is a classical example of a linear ill-posed problem, i.e., an arbitrary small perturbation of the data can cause an arbitrarily large perturbation of the solution. For example, in computerized tomography, K is an X-ray source, f is the object being scanned, and g is the measured damping of the X-rays. The goal here is to reconstruct the scanned object from information about the locations of the X-ray sources and measurements of their damping.

After discretizations (by the quadrature method or the Galerkin method), we obtain a linear system of equations Ax = b. All the regularization test problems are derived from discretizations of a Fredholm integral equation of the first kind. Each generated test problem has type RegProb, which is defined as:

```
immutable RegProb{T}
A::AbstractMatrix{T}  # matrix of interest
b::AbstractVector{T}  # right-hand side
x::AbstractVector{T}  # the solution to Ax = b
end
```

#### Here is an example:

```
julia> mdinfo("deriv2")
Computation of the Second Derivative:
A classical test problem for regularization algorithms.
Input options:
1. [type,] n, [matrixonly]: the dimension of the matrix is n.
           If matrixonly = false, the linear system A, b, x will be generated.
           (matrixonly = true by default.)
Reference: P.C. Hansen, Regularization tools: A MATLAB package for
           analysis and solution of discrete ill-posed problems.
          Numerical Algorithms, 6(1994), pp.1-35
julia> A = matrixdepot("deriv2", 4) # generate the test matrix
4x4 Array{Float64,2}:
-0.0169271 -0.0195313 -0.0117188 -0.00390625
-0.0195313 -0.0481771 -0.0351563 -0.0117188
-0.0117188 -0.0351563 -0.0481771 -0.0195313
-0.00390625 -0.0117188 -0.0195313 -0.0169271
      julia> r = mdopen("deriv2", 3, false) # generate all data
     MatrixDepot.GeneratedMatrixData{:B}("deriv2", 10, MatrixDepot.deriv2)(3, false)
julia> metasymbols(r) # which darta are available?
(:A, :b, :x)
julia> r.A # matrix A
3x3 Array{Float64,2}:
-0.0277778 -0.0277778 -0.00925926
-0.0277778 -0.0648148 -0.0277778
-0.00925926 -0.0277778 -0.0277778
julia> r.b # right hand side
3-element Array{Float64,1}:
-0.01514653483985129
-0.03474793286789414
-0.022274315940957783
julia> r.x # solution
3-element Array{Float64,1}:
0.09622504486493762
0.28867513459481287
0.48112522432468807
```

Here is a list of test problems in the collection:

- baart
- blur
- deriv2
- foxgood
- gravity
- heat
- parallax
- phillips
- shaw
- spikes
- ursell
- wing

baart Discretization of an artificial Fredholm integral equation of the first kind [baart82]. The kernel K is given by

$$K(s,t) = \exp(s\cos(t)).$$

The right-hand side g and the solution f are given by

$$g(s) = 2\frac{\sin(s)}{s}, \quad f(t) = \sin(t).$$

**blur** Image deblurring test problem. It arises in connection with the degradation of digital images by atmospheric turbulence blur, modelled by a Gaussian point-spread function

$$h(x,y) = \frac{1}{2\pi\sigma^2} \exp(-\frac{x^2 + y^2}{2\sigma^2}).$$

The matrix A is a symmetric  $n^2 \times n^2$  doubly block Toeplitz matrix, stored in sparse format.

**deriv2** Computation of the second derivative. The kernel K is Green's function for the second derivative

$$K(s,t) = \begin{cases} s(t-1), & s < t, \\ t(s-1), & s \ge t, \end{cases}$$

and both integration intervals are [0, 1]. The function g and f are given by

$$q(s) = (s^3 - s)/6, \quad f(t) = t.$$

The symmetric matrix A and vectors x and b are computed from K, f and g using the Galerkin method.

**foxgood** A severely ill-posed problem suggested by Fox & Goodwin. This is a model problem which does not satisfy the discrete Picard condition for the small singular values [baker77].

**gravity** One-dimensional gravity surveying model problem. Discretization of a 1-D model problem in gravity surveying, in which a mass distribution f(t) is located at depth d, while the vertical component of the gravity field g(s) is measured at the surface. The resulting problem is a first-kind Fredholm integral equation with kernel

$$K(s,t) = d(d^2 + (s-t)^2)^{-3/2}.$$

**heat** Inverse heat equation [carasso82]. It is a Volterra integral equation of the first kind with integration interval [0,1]. The kernel K is given by

$$K(s,t) = k(s-t),$$

where

$$k(t) = \frac{t^{-3/2}}{2\kappa\sqrt{\pi}} \exp\left(-\frac{1}{4\kappa^2 t}\right).$$

 $\kappa$  controls the ill-conditioning of the matrix A.  $\kappa=1$  (default) gives an ill-conditioned matrix and  $\kappa=5$  gives a well-conditioned matrix.

**parallax** Stellar parallax problem with 26 fixed, real observations. The underlying problem is a Fredholm integral equation of the first kind with kernel

$$K(s,t) = \frac{1}{\sigma\sqrt{2\pi}} \exp\left(-\frac{1}{2}\left(\frac{s-t}{\sigma}\right)^2\right),\,$$

with  $\sigma=0.014234$  and it is discretized by means of a Galerkin method with n orthonormal basis functions. The right-hand side b consists of a measured distribution function of stellar parallaxes, and its length is fixed at 26; i.e., the matrix A is  $26 \times n$ . The exact solution, which represents the true distribution of stellar parallaxes, is unknown.

**phillips** Phillips's "famous" problem. Discretization of the "famous" Fredholm integral equation of the first kind devised by D.L. Phillips [phillips62]. The kernel K and solution f are given by

$$K(s,t) = \theta(s-t), \quad f(t) = \theta(t),$$

where

$$\theta(x) = \begin{cases} 1 + \cos(\frac{\pi x}{3}), & |x| < 3, \\ 0, & |x| \ge 3. \end{cases}$$

The right-hand side q is given by

$$g(s) = (6 - |s|)\left(1 + \frac{1}{2}\cos\left(\frac{\pi s}{3}\right)\right) + \frac{9}{2\pi}\sin\left(\frac{\pi|s|}{3}\right).$$

Both integration intervals are [-6, 6].

**shaw** One-dimensional image restoration model. This test problem uses a first-kind Fredholm integral equation to model a one-dimensional image restoration situation. The kernel K is given by

$$K(s,t) = (\cos(s) + \cos(t))^2 \left(\frac{\sin(u)}{u}\right)^2,$$

where

$$u = \pi(\sin(s) + \sin(t)).$$

Both integration intervals are  $[-\pi/2, \pi/2]$ . The solution f is given by

$$f(t) = a_1 \exp(-c_1(t - t_1)^2) + a_2 \exp(-c_2(t - t_2)^2).$$

K and f are discretized by simple quadrature to produce the matrix A and the solution vector x. The right-hand b is computed by b = Ax.

spikes Artificially generated discrete ill-posed problem.

**ursell** Discretization of a Fredholm integral equation of the first kind with kernel K and right-hand side g given by

$$K(s,t) = \frac{1}{s+t+1}, \quad g(s) = 1,$$

where both integration intervals are [0,1] [ursell].

wing A problem with a discontinuous solution. The kernel K is given by

$$K(s,t) = t \exp(-st^2),$$

with both integration intervals are [0, 1]. The functions f and g are given as

$$f(t) = \begin{cases} 1, & t_1 < t < t_2, \\ 0, & \text{otherwise,} \end{cases} \qquad g(s) = \frac{\exp(-st_1^2) - \exp(-st_2^2)}{2s}.$$

Here  $0 < t_1 < t_2 < 1$ . The matrix A and two vectors x and b are obtained by Galerkin discretization with orthonormal basis functions defined on a uniform mesh.

# 1.5 Groups

Groups are lists of matrix names and we use them to categorize matrices in Matrix Depot. The list below shows all the predefined groups in Matrix Depot and we can extend this list by defining new groups. Group names are noted as symbols, e.g. :symmetric.

### 1.5.1 Predefined Groups

all All the matrices in the collection.

data The matrix has been downloaded from UF sparse matrix collection or the Matrix Market collection.

eigen Part of the eigensystem of the matrix is explicitly known.

graph An adjacency matrix of a graph.

illcond The matrix is ill-conditioned for some parameter values.

inverse The inverse of the matrix is known explicitly.

**posdef** The matrix is positive definite for some parameter values.

random The matrix has random entries.

**regprob** The output is a test problem for Regularization Methods.

**sparse** The matrix is sparse.

**symmetric** The matrix is symmetric for some parameter values.

# 1.5.2 Adding New Groups

New groups can be added with the macro @addgroup:

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```
@addgroup myfav = ["lehmer", "cauchy", "hilb"]
@addgroup test_for_paper2 = ["tridiag", "sampling", "wing"]
listgroups()
Groups:
                        illcond inverse regprob sparse
data
            eigen
                                        inverse
posdef
          random
symmetric myfav
                          test_for_paper2
listnames(:myfav)
3-element Array{ASCIIString,1}:
"lehmer"
 "cauchy"
 "hilb"
```

### 1.6 Interface to Test Collections

The internal database is loaded automatically when using the module:

```
julia> using MatrixDepot
include group.jl for user defined matrix generators
verify download of index files...
used remote site is https://sparse.tamu.edu/?per_page=All
populating internal database...
```

### 1.6.1 Interface to the SuiteSparse Matrix Collection (formerly UFL collection)

Use M = matrixdepot(NAME) or md = mdopen(NAME); M = md.A, where NAME is collection\_name + '/' + matrix\_name, to download a test matrix from the 'SuiteSparse Matrix Collection. https://sparse.tamu.edu/ For example:

```
julia> md = mdopen("SNAP/web-Google")
PG SNAP/web-Google(#2301) 916428x916428(5105039) 2002 [A] 'Directed Graph' [Web_
→ graph from Google]()
```

**Note:** listnames ("\*/\*") displays all the matrix names in the collection, including the newly downloaded matrices. All the matrix data can be found by listnames ("\*\*").

If the matrix name is unique in the collections, we could also use matrixdepot (matrix\_name) to download the data. If more than one matrix has the same name, an error is thrown.

When download is complete, we can check matrix information using:

```
julia> mdinfo("SNAP/web-Google")
SNAP/web-Google

MatrixMarket matrix coordinate pattern general
```

```
UF Sparse Matrix Collection, Tim Davis
http://www.cise.ufl.edu/research/sparse/matrices/SNAP/web-Google
name: SNAP/web-Google
[Web graph from Google]
id: 2301
date: 2002
author: Google
ed: J. Leskovec
fields: name title A id date author ed kind notes
kind: directed graph
```

#### and generate it by accessing the field A.

```
julia> M = md.A
916428×916428 SparseMatrixCSC{Bool,Int64} with 5105039 stored entries:
 [11343, 1] = true
 [11928 ,
             1] = true
 [15902 ,
             1] = true
 [29547 ,
             1] = true
 [30282 ,
             1] = true
 [788476, 916427] = true
 [822938, 916427] = true
 [833616, 916427] = true
 [417498, 916428] = true
 [843845, 916428] = true
```

You can convert the boolean pattern matrix to integer by M \* 1.

The metadata of a given matrix can be obtained by accessing properties of md.

Which properties are available is shown in the *md::MatrixDescriptor*:

```
julia> md = mdopen("TKK/t520")
(IS TKK/t520(#1908) 5563x5563(286341/145952) 2008 [A, b, coord] 'Structural Problem'

→ [T-beam, L = 520 mm, Quadratic four node DK type elements. R Kouhia]()
```

and also by the special function metasymbols:

```
julia> metasymbols(md)
(:A, :b, :coord)
```

When you access a single matrix with matrixdepot (pattern) or mdopen (pattern) the full matrix data are

dowloaded implicitly in the background, if not yet available on the local disk cache.

When you access matrix information with mdinfo(pattern) for one or more matrices, the header data of the matrix are downloaded implicitly, if not yet available on the local disk cache.

It is also possible to dowload a bulk of matrix data by MatrixDepot.loadinfo(pattern) and MatrixDepot.load(pattern) to populate the disk cache in advance of usage.

#### 1.6.2 Interface to NIST Matrix Market

Use M = matrixdepot (NAME) or md = mdopen (NAME); M = md.A, where NAME is collection name + '/' + set name + '/' + matrix name to download a test matrix from NIST Matrix Market: http://math.nist.gov/MatrixMarket/. For example:

Checking matrix information and generating matrix data are similar to the above case:

```
julia> mdinfo(md) # or mdinfo("*/*/bp__1400")
Harwell-Boeing/smtape/bp__1400

MatrixMarket matrix coordinate real general
822 822 4790
```

There is no header information in this collection besides m, n, and dnz.

```
julia> md.A # or matrixdepot("Harwell-Boeing/smtape/bp__1400")
822x822 sparse matrix with 4790 Float64 entries:
     [1, 1] = 1.0
     [1
        , 2] = 0.001
     [26, 2] =
                  -1.0
     [1 ,
            3] = 0.6885
     [25 ,
          3] = 0.9542
     [692,
          3] = 1.0
     [718,
          3] = 5.58
     [202, 820] = -1.0
     [776, 820] = 1.0
     [1, 821] = 0.4622
     [25, 821] = 0.725
     [28, 821] = 1.0
     [202, 821] = -1.0
     [796, 821] = 1.0
     [2, 822] = 1.0
```

# 1.7 Adding New Matrix Generators

Matrix Depot provides a diverse collection of test matrices, including parametrized matrices and real-life matrices. But occasionally, you may want to define your own matrix generators and be able to use them from Matrix Depot.

### 1.7.1 Declaring Generators

When Matrix Depot is first loaded, a new directory myMatrixDepot will be created. Matrix Depot automatically includes all Julia files in this directory. Hence, all we need to do is to copy the generator files to path/to/MatrixDepot/myMatrixDepot and use the function include\_generator to declare them.

```
include_generator(Stuff_To_Be_Included, Stuff, f)
```

Includes a piece of information of the function f to Matrix Depot, where Stuff\_To\_Be\_Included is one of the following:

- FunctionName: the function name of f. In this case, Stuff is a string representing f.
- Group: the group where f belongs. In this case, Stuff is the group name.

### 1.7.2 Examples

To get a feel of how it works, let's see an example. Suppose we have a file myrand.jl which contains two matrix generator randsym and randorth:

```
random symmetric matrix
______
*Input options:*
+ n: the dimension of the matrix
function randsym(n)
   A = zeros(n, n)
   for j = 1:n
     for i = j:n
       A[i,j] = randn()
       if i != j; A[j,i] = A[i,j] end
     end
   end
   return A
end
random Orthogonal matrix
*Input options:*
+ n: the dimension of the matrix
randorth(n) = qr(randn(n,n)).Q
```

We first need to find out where Matrix Depot is installed. This can be done by:

```
julia> @which matrixdepot("")
matrixdepot(p::Union{Regex,...}, args...) in MatrixDepot at
/home/.../.julia/dev/MatrixDepot/src/common.jl:508
```

For me, the package user data are installed at /home/.../.julia/dev/MatrixDepot/myMatrixDepot. We can copy myrand.jl to this directory. Now we open the file myMatrixDepot/generator.jl and write:

```
include_generator(FunctionName, "randsym", randsym)
include_generator(FunctionName, "randorth", randorth)
```

Due to a bug we have to remove file db.data and restart julia: rm MatrixDepot/data/db.data

This is it. We can now use them from Matrix Depot:

```
julia> using MatrixDepot
  include group.jl for user defined matrix generators
  include myrand.jl for user defined matrix generators
  verify download of index files...
  used remote site is https://sparse.tamu.edu/?per_page=All
  populating internal database...
  julia> mdinfo()
   Currently loaded Matrices
 builtin(#)
  10 deriv2 19 gravity 28 kms
                                           37 parter 46 rohess
                                                                   55
 2 binomial 11 dingdong 20 grcar 29 lehmer 38 pascal 47 rosser
                                                                  56 vand
 3 blur 12 erdrey 21 hadamard 30 lotkin 39 pei
                                                     48 sampling 57
∽wathen
                                                                  4 cauchy 13 fiedler 22 hankel 31 magic
                                           40 phillips 49 shaw
⇔wilkinson
 5 chebspec 14 forsythe 23 heat 32 minij 41 poisson 50 smallworld 59 wing 6 chow 15 foxgood 24 hilb 33 moler 42 prolate 51 spikes
  7 circul 16 frank 25 invhilb 34 neumann 43 randcorr 52 toeplitz
  8 clement 17 gilbert 26 invol 35 oscillate 44 rando 53 tridiag
  9 companion 18 golub 27 kahan 36 parallax 45 randsvd 54 triw
 user(#)
  1 randorth 2 randsym
  Groups
       _ ____ ____
  all local eigen illcond posdef regprob symmetric
  builtin user graph inverse random sparse test_for_paper2
  Suite Sparse of
  -----
  2773 2833
  MatrixMarket of
  488
            498
```

```
julia> mdinfo("randsym")
  random symmetric matrix
  Input options:
  • n: the dimension of the matrix
julia> matrixdepot("randsym", 5)
5x5 Array{Float64,2}:
 1.57579 0.474591 0.0261732 -0.536217 -0.0900839
 0.474591 0.388406 0.77178 0.239696 0.302637
 0.0261732 0.77178 1.7336
                            1.72549 0.127008
-0.536217 0.239696 1.72549 0.304016 1.5854
-0.0900839 0.302637 0.127008 1.5854 -0.656608
julia> A = matrixdepot("randorth", 5)
5x5 Array{Float64,2}:
-0.524132 -0.474053 -0.53949 -0.390514 0.238764
0.627656 0.223519 -0.483424 -0.104706 0.558054
-0.171077 0.686038 -0.356957 -0.394757 -0.465654
0.416039 - 0.305802 0.326723 - 0.764383 - 0.205834
julia> A'*A
5x5 Array{Float64,2}:
      8.32667e-17 1.11022e-16 5.55112e-17 -6.93889e-17
8.32667e-17 1.0
                 -1.80411e-16 -2.77556e-17 -5.55112e-17
1.11022e-16 -1.80411e-16 1.0
                                   1.94289e-16 -1.66533e-16
5.55112e-17 -2.77556e-17 1.94289e-16 1.0
                                               1.38778e-16
-6.93889e-17 -5.55112e-17 -1.66533e-16 1.38778e-16 1.0
```

We can also add group information in generator.jl:

include\_generator(Group, :random, randsym) include\_generator(Group, :symmetric, randsym)

#### After re-starting julia, if we type:

```
julia> using MatrixDepot
 include group.jl for user defined matrix generators
 include myrand.jl for user defined matrix generators
 verify download of index files...
 used remote site is https://sparse.tamu.edu/?per_page=All
 populating internal database...
 julia> listnames(:symmetric)
 list(22)
           cauchy clement fiedler hilb kms minij oscillate pei
                                                       prolate randsym_
⇔wathen
 circul dingdong hankel invhilb lehmer moler pascal poisson randcorr tridiag.
-wilkinson
julia> mdlist(:random)
9-element Array{ASCIIString,1}:
```

```
"golub"
"oscillate"
"randcorr"
"rando"
"randsvd"
"randsym"
"rohess"
"rosser"
"wathen"
```

the function randsym will be part of the groups: symmetric and :random.

It is a good idea to back up your changes. For example, we could save it on GitHub by creating a new repository named myMatrixDepot. (See https://help.github.com/articles/create-a-repo/ for details of creating a new repository on GitHub.) Then we go to the directory path/to/MatrixDepot/myMatrixDepot and type:

```
git init
git add *.jl
git commit -m "first commit"
git remote add origin https://github.com/your-user-name/myMatrixDepot.git
git push -u origin master
```

# 1.8 Examples

#### 1.8.1 Demo

IJulia Notebook

### 1.8.2 Getting Started

To see all the matrices in the collection, type

#### We can generate a Hilbert matrix of size 4 by typing

#### and generate a circul matrix of size 5 by

```
matrixdepot("circul", 5)

5x5 Array{Float64,2}:
   1.0   2.0   3.0   4.0   5.0
   5.0   1.0   2.0   3.0   4.0
   4.0   5.0   1.0   2.0   3.0
   3.0   4.0   5.0   1.0   2.0
   2.0   3.0   4.0   5.0   1.0
```

#### We can type the matrix name to get help.

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#### From the information given, we can create a 4-by-6 rectangular Hilbert matrix by

```
matrixdepot("hilb", 4, 6)

4x6 Array{Float64,2}:
1.0     0.5     0.333333     0.25     0.2     0.166667
0.5     0.333333     0.25     0.2     0.166667     0.142857
0.333333     0.25     0.2     0.166667     0.142857     0.125
0.25     0.2     0.166667     0.142857     0.125     0.111111
```

#### We can also specify the data type

### Matrices can be accessed by groups.

```
mdlist(:symmetric)
19-element Array{ASCIIString,1}:
"hilb"
"cauchy"
"circul"
"dingdong"
 "invhilb"
 "moler"
 "pascal"
 "pei"
 "clement"
 "fiedler"
 "minij"
 "tridiag"
 "lehmer"
 "randcorr"
 "poisson"
```

```
"wilkinson"
"randsvd"
"kms"
"wathen"
```

```
mdlist(:symmetric & :illcond)

7-element Array{ASCIIString,1}:
    "hilb"
    "cauchy"
    "invhilb"
    "moler"
    "pascal"
    "pei"
    "tridiag"
```

```
mdlist(:inverse & :illcond & :symmetric)

7-element Array{ASCIIString,1}:
    "hilb"
    "cauchy"
    "invhilb"
    "moler"
    "pascal"
    "pei"
    "tridiag"
```

### 1.8.3 User Defined Groups

We can add new groups to MatrixDepot. Since each group in Matrix Depot is a list of strings, you can simply do, for example,

```
spd = mdlist(:symmetric & :posdef)

10-element Array{ASCIIString,1}:
    "hilb"
    "cauchy"
    "circul"
    "invhilb"
    "moler"
    "pascal"
    "pei"
    "minij"
    "tridiag"
    "lehmer"
```

```
myprop = ["lehmer", "cauchy", "hilb"]

3-element Array{ASCIIString,1}:
    "lehmer"
    "cauchy"
    "hilb"
```

Then use it in your tests like

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```
for matrix in myprop
   A = matrixdepot(matrix, 6)
   L, U, p = lu(A) #LU factorization
   err = norm(A[p,:] - L*U, 1) # 1-norm error
   println("1-norm error for $matrix matrix is ", err)
end

1-norm error for lehmer matrix is 1.1102230246251565e-16
1-norm error for cauchy matrix is 5.551115123125783e-17
1-norm error for hilb matrix is 2.7755575615628914e-17
```

To add a group of matrices permanently for future use, we put the macro @addgroup at the beginning.

```
@addgroup myfav = ["lehmer", "cauchy", "hilb"]
@addgroup test_for_paper2 = ["tridiag", "sampling", "wing"]
```

You can see the changes immediately:

```
mdinfo()
 Currently loaded Matrices
 _____
builtin(#)
1 baart 10 deriv2 19 gravity 28 kms 37 parter 46 rohess 55 ursell
2 binomial 11 dingdong 20 grcar 29 lehmer 38 pascal 47 rosser 56 vand
3 blur 12 erdrey 21 hadamard 30 lotkin 39 pei 48 sampling 57 wathen
4 cauchy 13 fiedler 22 hankel 31 magic
                                          40 phillips 49 shaw
⇔wilkinson
5 chebspec 14 forsythe 23 heat 32 minij 41 poisson 50 smallworld 59 wing 6 chow 15 foxgood 24 hilb 33 moler 42 prolate 51 spikes
7 circul 16 frank 25 invhilb 34 neumann 43 randcorr 52 toeplitz
8 clement 17 gilbert 26 invol 35 oscillate 44 rando 53 tridiag
9 companion 18 golub 27 kahan 36 parallax 45 randsvd 54 triw
user(#)
Groups
     - ---- ---- ----- ----- ----- ------
all local eigen illcond posdef regprob symmetric test_for_paper2
builtin user graph inverse random sparse myfav
Suite Sparse of
_____ ___
2772
          2833
MatrixMarket of
```

Notice new defined groups have been included. We can use them as

```
"lehmer"
"cauchy"
"hilb"
```

We can remove a group using the macro @rmgroup. As before, we need to reload Julia to see the changes.

```
@rmgroup myfav
```

```
listgroups()
14-element Array{Symbol,1}:
    :all
    :builtin
    :local
    :user
    :eigen
    :graph
    :illcond
    :inverse
    :posdef
    :random
    :regprob
    :sparse
    :symmetric
```

## 1.8.4 More Examples

An interesting test matrix is magic square. It can be generated as

```
sum(M, dims=1)

1x5 Array{Int64,2}:
65 65 65 65 65
```

```
sum(M, dims=2)

5x1 Array{Int64,2}:
65
65
65
65
65
```

```
sum(diag(M))
65
```

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```
p = [5:-1:1]
sum(diag(M[:,p]))
65
```

#### Pascal Matrix can be generated as

```
P = matrixdepot("pascal", Int, 6)
6x6 Array{Int64,2}:
1 1 1 1 1
                 1
     3
        4
     6 10
            15
                21
  4 10 20
            35
                56
1
1 5 15 35
           70 126
1 6 21 56 126 252
```

#### Notice the Cholesky factor of the Pascal matrix has Pascal's triangle rows.

```
cholesky(P)

6x6 UpperTriangular{Float64,Array{Float64,2}}:
    1.0    1.0    1.0    1.0    1.0
    0.0    1.0    2.0    3.0    4.0    5.0
    0.0    0.0    1.0    3.0    6.0    10.0
    0.0    0.0    0.0    1.0    4.0    10.0
    0.0    0.0    0.0    0.0    1.0    5.0
    0.0    0.0    0.0    0.0    1.0    5.0
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