

## Sage Quick Reference: Linear Algebra

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Based on work by Peter Jipsen, William Stein

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### Vector Constructions

**Caution:** First entry of a vector is numbered 0

`u = vector(QQ, [1, 3/2, -1])` length 3 over rationals

`v = vector(QQ, {2:4, 95:4, 210:0})`

211 entries, nonzero in entry 4 and entry 95, sparse

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### Vector Operations

`u = vector(QQ, [1, 3/2, -1])`

`v = vector(ZZ, [1, 8, -2])`

`2*u - 3*v` linear combination

`u.dot_product(v)`

`u.cross_product(v)` order:  $u \times v$

`u.inner_product(v)` inner product matrix from parent

`u.pairwise_product(v)` vector as a result

`u.norm() == u.norm(2)` Euclidean norm

`u.norm(1)` sum of entries

`u.norm(Infinity)` maximum entry

`A.gram_schmidt()` converts the rows of matrix A

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### Matrix Constructions

**Caution:** Row, column numbering begins at 0

`A = matrix(ZZ, [[1,2],[3,4],[5,6]])`

$3 \times 2$  over the integers

`B = matrix(QQ, 2, [1,2,3,4,5,6])`

2 rows from a list, so  $2 \times 3$  over rationals

`C = matrix(CDF, 2, 2, [[5*I, 4*I], [I, 6]])`

complex entries, 53-bit precision

`Z = matrix(QQ, 2, 2, 0)` zero matrix

`D = matrix(QQ, 2, 2, 8)`

diagonal entries all 8, other entries zero

`I = identity_matrix(5)`  $5 \times 5$  identity matrix

`J = jordan_block(-2,3)`

$3 \times 3$  matrix,  $-2$  on diagonal,  $1$ 's on super-diagonal

`var('x y z'); K = matrix(SR, [[x,y+z],[0,x^2*z]])`

symbolic expressions live in the ring SR

`L=matrix(ZZ, 20, 80, {(5,9):30, (15,77):-6})`

$20 \times 80$ , two non-zero entries, sparse representation

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### Matrix Multiplication

`u = vector(QQ, [1,2,3]), v = vector(QQ, [1,2])`

`A = matrix(QQ, [[1,2,3],[4,5,6]])`

`B = matrix(QQ, [[1,2],[3,4]])`

`u*A, A*v, B*A, B^6, B^(-3)` all possible

`B.iterates(v, 6)` produces  $vB^0, vB^1, \dots, vB^5$

`rows = False` moves  $v$  to right of matrix powers

`f(x)=x^2+5*x+3` then `f(B)` is possible

`B.exp()` matrix exponential, i.e.  $\sum_{k=0}^{\infty} \frac{B^k}{k!}$

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### Matrix Spaces

`M = MatrixSpace(QQ, 3, 4)`

dimension 12 space of  $3 \times 4$  matrices

`A = M([1,2,3,4,5,6,7,8,9,10,11,12])`

is a  $3 \times 4$  matrix, an element of M

`M.basis()`

`M.dimension()`

`M.zero_matrix()`

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### Matrix Operations

`5*A+2*B` linear combination

`A.inverse()`, also `A^(-1)`, `~A`

ZeroDivisionError if singular

`A.transpose()`

`A.antitranspose()` transpose + reverse orderings

`A.adjoint()` matrix of cofactors

`A.conjugate()` entry-by-entry complex conjugates

`A.restrict(V)` restriction on invariant subspace V

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### Row Operations

Row Operations: (change matrix in place)

**Caution:** first row is numbered 0

`A.rescale_row(i,a)`  $a*(\text{row } i)$

`A.add_multiple_of_row(i,j,a)`  $a*(\text{row } j) + \text{row } i$

`A.swap_rows(i,j)`

Each has a column variant, `row`  $\rightarrow$  `col`

For a new matrix, use e.g. `B = A.with_rescaled_row(i,a)`

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### Echelon Form

`A.echelon_form()`, `A.echelonize()`, `A.hermite_form()`

**Caution:** Base ring affects results

`A = matrix(ZZ, [[4,2,1],[6,3,2]])`

`B = matrix(QQ, [[4,2,1],[6,3,2]])`

`A.echelon_form()`   `B.echelon_form()`

$\begin{pmatrix} 2 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$     $\begin{pmatrix} 1 & \frac{1}{2} & 0 \\ 0 & 0 & 1 \end{pmatrix}$

`A.pivots()` indices of columns spanning column space

`A.pivot_rows()` indices of rows spanning row space

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### Pieces of Matrices

**Caution:** row, column numbering begins at 0

`A.nrows()`

`A.ncols()`

`A[i,j]` entry in row  $i$  and column  $j$

**Caution:** OK: `A[2,3] = 8`, Error: `A[2][3] = 8`

`A[i]` row  $i$  as immutable Python tuple

`A.row(i)` returns row  $i$  as Sage vector

`A.column(j)` returns column  $j$  as Sage vector

`A.list()` returns single Python list, row-major order

`A.matrix_from_columns([8,2,8])`

new matrix from columns in list, repeats OK

`A.matrix_from_rows([2,5,1])`

new matrix from rows in list, out-of-order OK

`A.matrix_from_rows_and_columns([2,4,2],[3,1])`

common to the rows and the columns

`A.rows()` all rows as a list of tuples

`A.columns()` all columns as a list of tuples

`A.submatrix(i,j,nr,nc)`

start at entry  $(i,j)$ , use `nr` rows, `nc` cols

`A[2:4,1:7]`, `A[0:8:2,3::-1]` Python-style list slicing

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### Combining Matrices

`A.augment(B)` A in first columns, B to the right

`A.stack(B)` A in top rows, B below

`A.block_sum(B)` Diagonal, A upper left, B lower right

`A.tensor_product(B)` Multiples of B, arranged as in A

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### Scalar Functions on Matrices

`A.rank()`

`A.nullity() == A.left_nullity()`

`A.right_nullity()`

`A.determinant() == A.det()`

`A.permanent()`

`A.trace()`

`A.norm() == A.norm(2)` Euclidean norm

`A.norm(1)` largest column sum

`A.norm(Infinity)` largest row sum

`A.norm('frob')` Frobenius norm

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### MatrixProperties

`.is_zero()` (totally?), `.is_one()` (identity matrix?),

`.is_scalar()` (multiple of identity?), `.is_square()`,

`.is_symmetric()`, `.is_invertible()`, `.is_nilpotent()`

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## Eigenvalues

`A.charpoly('t')` no variable specified defaults to `x`  
`A.characteristic_polynomial() == A.charpoly()`  
`A.fcp('t')` factored characteristic polynomial  
`A.minpoly()` the minimum polynomial  
`A.minimal_polynomial() == A.minpoly()`  
`A.eigenvalues()` unsorted list, with multiplicities  
`A.eigenvectors_left()` vectors on left, `_right` too  
Returns a list of triples, one per eigenvalue:  
  `e`: the eigenvalue  
  `V`: list of vectors, basis for eigenspace  
  `n`: algebraic multiplicity  
`A.eigenmatrix_right()` vectors on right, `_left` too  
Returns two matrices:  
  `D`: diagonal matrix with eigenvalues  
  `P`: eigenvectors as columns (rows for left version)  
      has zero columns if matrix not diagonalizable

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## Decompositions

**Note:** availability depends on base ring of matrix  
`A.jordan_form(transformation=True)`  
returns a pair of matrices:  
  `J`: matrix of Jordan blocks for eigenvalues  
  `P`: nonsingular matrix  
  so  $A == P^{-1}JP$   
`A.smith_form()` returns a triple of matrices:  
  `D`: elementary divisors on diagonal  
  `U`, `V`: with unit determinant  
  so  $D == UAV$   
`A.LU()` returns a triple of matrices:  
  `P`: a permutation matrix  
  `L`: lower triangular matrix  
  `U`: upper triangular matrix  
  so  $PA == LU$   
`A.QR()` returns a pair of matrices:  
  `Q`: an orthogonal matrix  
  `R`: upper triangular matrix  
  so  $A == QR$   
`A.SVD()` returns a triple of matrices:  
  `U`: an orthogonal matrix  
  `S`: zero off the diagonal, same dimensions as `A`  
  `V`: an orthogonal matrix  
  so  $A == US^*(V\text{-conjugate-transpose})$   
`A.symplectic_form()`  
`A.hessenberg_form()`  
`A.cholesky()`

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## Solutions to Systems

`A.solve_right(B)` `_left` too  
is solution to  $A \cdot X = B$ , where `X` is a vector **or** matrix  
`A = matrix(QQ, [[1,2],[3,4]])`  
`b = vector(QQ, [3,4])`  
then `A\b` returns the solution `(-2, 5/2)`

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## Vector Spaces

`U = VectorSpace(QQ, 4)` dimension 4, rationals as field  
`V = VectorSpace(RR, 4)` “field” is 53-bit precision reals  
`W = VectorSpace(RealField(200), 4)`  
“field” has 200 bit precision  
`X = CC^4` 4-dimensional, 53-bit precision complexes  
`Y = VectorSpace(GF(7), 4)` finite  
  `Y.finite()` returns `True`  
  `len(Y.list())` returns  $7^4 = 2401$  elements

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## Vector Space Properties

`V.dimension()`  
`V.basis()`  
`V.echelonized_basis()`  
`V.has_user_basis()` with non-canonical basis?  
`V.is_subspace(W)` `True` if `W` is a subspace of `V`  
`V.is_full()` rank equals degree (as module)?  
`Y = GF(7)^4`, `T = Y.subspaces(2)`  
  `T` is a generator object for 2-D subspaces of `Y`  
  `[U for U in T]` is list of 2850 2-D subspaces of `Y`

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## Constructing Subspaces

`span([v1,v2,v3], QQ)` span of list of vectors over ring  
For a matrix `A`, objects returned are  
  vector spaces when base ring is a field  
  modules when base ring is just a ring  
`A.left_kernel() == A.kernel()` `right_` too  
`A.row_space() == A.row_module()`  
`A.column_space() == A.column_module()`  
`A.eigenspaces_right()` vectors on right, `_left` too  
  Pairs, having eigenvalue with its right eigenspace

If `V` and `W` are subspaces

`V.quotient(W)` quotient of `V` by subspace `W`  
`V.intersection(W)` intersection of `V` and `W`  
`V.direct_sum(W)` direct sum of `V` and `W`  
`V.subspace([v1,v2,v3])` specify basis vectors in a list

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## Dense versus Sparse

**Note:** Algorithms may depend on representation  
Vectors and matrices have two representations  
  Dense: lists, and lists of lists  
  Sparse: Python dictionaries  
`.is_dense()`, `.is_sparse()` to check  
`A.sparse_matrix()` returns sparse version of `A`  
`A.dense_rows()` returns dense row vectors of `A`  
Some commands have boolean `sparse` keyword

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## Rings

**Note:** Many algorithms depend on the base ring  
`<object>.base_ring(R)` for vectors, matrices, ...  
to determine the ring in use  
`<object>.change_ring(R)` for vectors, matrices, ...  
to change to the ring (or field), `R`,  
`R.is_ring()`, `R.is_field()`  
`R.is_integral_domain()`, `R.is_exact()`

Some ring and fields

`ZZ` integers, ring  
`QQ` rationals, field  
`QQbar` algebraic field, exact  
`RDF` real double field, inexact  
`RR` 53-bit reals, inexact  
`RealField(400)` 400-bit reals, inexact  
`CDF`, `CC`, `ComplexField(400)` complexes, too  
`RIF` real interval field  
`GF(2)` mod 2, field, specialized implementations  
`GF(p) == FiniteField(p)` `p` prime, field  
`Integers(6)` integers mod 6, ring only  
`CyclotomicField(7)` rationals with 7<sup>th</sup> root of unity  
`QuadraticField(-5, 'x')` rationals adjoin  $x = \sqrt{-5}$   
`SR` ring of symbolic expressions

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## Vector Spaces versus Modules

A module is “like” a vector space over a ring, not a field  
Many commands above apply to modules  
Some “vectors” are really module elements

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## More Help

“tab-completion” on partial commands  
“tab-completion” on `<object.>` for all relevant methods  
`<command>?` for summary and examples  
`<command>??` for complete source code