### Matrix inverses in Julia

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## Matrix inverses in Julia

- QR factorization
- ► inverse
- pseudo-inverse
- backslash operator

# **QR** factorization

- the qr command finds the QR factorization of a matrix
  A = rand(5, 3)
  Q, R = qr(A)
- when columns of  $n \times k$  matrix A are independent, qr is same as ours
- when columns are dependent, qr is not same as ours
  - A = QR,  $Q^TQ = I$ , and  $R_{ij} = 0$  for i > j always holds
  - R can have zero or negative diagonal entries
  - R is not square when A is wide

## Checking linear independence with Julia's QR

- let's check if columns of A are linearly independent
- A must be tall or square
- columns are linearly independent if and only if R has no 0 diagonal entries
- check if columns of (tall or square) A are linearly independent:

```
a1 = rand(5)
a2 = rand(5)
A = [a1 a2 a1+a2] # linearly dependent columns
Q, R = qr(A)
# find the entry of diagonal of R closest to 0
# R can have negative entries
minimum(abs(diag(R)))
```

#### Inverse

- inv(A) returns the inverse matrix  $A^{-1}$
- Julia will issue an error if
  - -A is not square
  - -A is not invertible
- ▶ you can solve square set of linear equations Ax = b, with invertible A, using

```
b = rand(5,1)
A = rand(5,5)
x = inv(A)*b
norm(A*x-b) # check residual
but there is a better way, using backslash
```

### Pseudo-inverse

- ▶ for a  $m \times n$  matrix A, pinv(A) will return the  $n \times m$  pseudo-inverse
- ▶ if A is square and invertible
  - pinv(A) will return the inverse  $A^{-1}$
- $\blacktriangleright$  if A is tall with linearly independent columns
  - pinv(A) will return the left inverse  $(A^T A)^{-1} A^T$
- ▶ if A is wide with linearly independent rows
  - pinv(A) will return the right inverse  $A^T (AA^T)^{-1}$
- $\blacktriangleright$  in other cases, pinv(A) returns an  $m \times n$  matrix, but
  - it is not a left or right inverse of  $\boldsymbol{A}$
  - what it is is beyond the scope of this class

### The backslash operator

- ▶ given A and b, the \ operator solves the linear system Ax = b for x
- $\blacktriangleright$  for a  $m \times n$  matrix A and a  $m\mbox{-vector}\ b,$  A\b returns a  $n\mbox{-vector}\ x$
- ▶ if A is square and invertible

$$-x = A^{-1}b$$

- the unique solution of Ax = b
- $\blacktriangleright$  if A is tall with linearly independent columns

$$-x = (A^T A)^{-1} A^T b$$

- the least squares approximate solution of  $\boldsymbol{A}\boldsymbol{x}=\boldsymbol{b}$
- $\blacktriangleright$  if A is wide with linearly independent rows

$$-x = A^T (AA^T)^{-1}b$$

- x is the least norm solution of Ax = b
- in other cases, A\b returns an n-vector x, but what it means is beyond the scope of this class
- uses a factor and solve method similar to QR

#### Solving matrix systems with backslash

- solve matrix equation AX = B for X, with A square
- ▶ with  $X = [x_1 \cdots x_k]$ ,  $B = [b_1 \cdots b_k]$ , same as solving k linear systems

$$Ax_1 = b_1, \dots, Ax_k = b_k$$

- X = A\B solves the system, doing the right thing:
  - factor A once (order  $n^3$ )
  - back substitution to get  $x_i = A^{-1}b_i$ , i = 1, ..., k (order  $kn^2$ )