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Section 12.3

Check written problems

1.

Find the SVD of the following symmetric matrices by hand calculation, and describe geometrically the action of the matrix on the unit circle

$$A = \begin{vmatrix} \frac{3}{2} & -\frac{1}{2} \\ -\frac{1}{2} & \frac{3}{2} \end{vmatrix}$$

$$A := \begin{bmatrix} \frac{3}{2} & -\frac{1}{2} \\ -\frac{1}{2} & \frac{3}{2} \end{bmatrix} \tag{1}$$

$$\begin{bmatrix} -0.707106781186547 & 0.707106781186547 \\ 0.707106781186547 & 0.707106781186547 \end{bmatrix}$$

> $S := Matrix([[2, 0], [0, 1]]); U \cdot S \cdot Vt$

$$S := \left[\begin{array}{cc} 2 & 0 \\ 0 & 1 \end{array} \right]$$

$$\begin{bmatrix} 1.50000000000000 & -0.5000000000000 \\ -0.50000000000000 & 1.5000000000000 \end{bmatrix}$$
(3)

$$A := \begin{bmatrix} 6 & -2 \\ 8 & \frac{3}{2} \end{bmatrix}$$

 $A := Matrix\left(\left[\left[6, -2\right], \left[8, \frac{3}{2}\right]\right]\right)$

$$A := \begin{bmatrix} 6 & -2 \\ 8 & \frac{3}{2} \end{bmatrix} \tag{4}$$

 \rightarrow U, S, Vt := SingularValues(A, output = ['U', 'S', 'Vt'])

$$U, S, Vt := \begin{bmatrix} -0.600000000000000 & -0.8000000000000 \\ -0.8000000000000 & 0.6000000000000 \end{bmatrix}, \begin{bmatrix} 10. \\ 2.500000000000000 \end{bmatrix},$$

$$(5)$$

$$\begin{bmatrix} -1. & -0. \\ 0. & 1. \end{bmatrix}$$

 $S := Matrix([[10, 0], [0, 2.5]]); U \cdot S \cdot Vt$

$$S := \begin{bmatrix} 10 & 0 \\ 0 & 2.5 \end{bmatrix}$$

$$\begin{bmatrix} 6.00000000000000 & -2. \\ 8. & 1.5000000000000 \end{bmatrix}$$

$$(6)$$

different signs in the answer from wtitten problem Check if it is correct:

$$V := Matrix \left(\left[\left[\frac{3}{5}, \frac{4}{5} \right], \left[-\frac{4}{5}, \frac{3}{5} \right] \right] \right)$$

$$U := \begin{bmatrix} \frac{3}{5} & \frac{4}{5} \\ -\frac{4}{5} & \frac{3}{5} \end{bmatrix}$$

$$(7)$$

$$S := Matrix \left(\left[[10, 0], \left[0, \frac{5}{2} \right] \right] \right)$$

$$S := \begin{bmatrix} 10 & 0 \\ 0 & \frac{5}{2} \end{bmatrix} \tag{8}$$

> Vt := Matrix([[1, 0], [0, 1]])

$$Vt := \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \tag{9}$$

 $\rightarrow U \cdot S \cdot Vt$

$$\begin{bmatrix} 6 & 2 \\ -8 & \frac{3}{2} \end{bmatrix} \tag{10}$$

Both SVD from written and Maple give the same matrix $A = \begin{bmatrix} 6 & 2 \\ -8 & \frac{3}{2} \end{bmatrix}$

$$\begin{bmatrix} 6 & 2 \\ -8 & \frac{3}{2} \end{bmatrix} \tag{11}$$

Section 12.4

1. d

Use Matlab's svd command to find the best rank-one approximation of the following matrices

A := Matrix([[1, 5, 3], [2, -3, 2], [-3, 1, 1]])

$$A := \begin{bmatrix} 1 & 5 & 3 \\ 2 & -3 & 2 \\ -3 & 1 & 1 \end{bmatrix}$$
 (12)

V, S, Vt := SingularValues(A, output = ['U', 'S', 'Vt'])

$$U, S, Vt := \begin{bmatrix} 0.898402133395958 & 0.438966448173354 & -0.0134931126009142 \\ -0.361733436568794 & 0.757058495583138 & 0.544069255824593 \\ 0.249043224316024 & -0.483912070156827 & 0.838931809373570 \end{bmatrix},$$

$$(13)$$

6.26135133093290

4.17319797039996

2.52584603855312

-0.09138513117174770.9305106666381750.3546810638775360.815877816954797-0.1342508359328510.562423417766726-0.570957218714149-0.3407735499182840.746914481098267

> $U \cdot Srank_1 \cdot Vt$; $Srank_1 := DiagonalMatrix(S_{1..1}, 2, 3)$

```
\begin{bmatrix} -0.647227628489829 & 6.59026478739581 & 2.51199928150541 \\ 0.260600309808826 & -2.65351009400633 & -1.01143363197782 \\ -0.179415931322682 & 1.82686653419382 & 0.696343404908098 \end{bmatrix}
```

$$Srank_1 := \begin{bmatrix} 6.26135133093290 & 0. & 0. \\ 0. & 0. & 0. \end{bmatrix}$$
 (14)

$$Srank_1 := \begin{bmatrix} 6.26135133093290 & 0. & 0. \\ 0. & 0. & 0. & 0. \end{bmatrix}$$

$$Arank_1 := U \cdot Srank_1 \cdot Vt$$

$$Arank_1 := \begin{bmatrix} -0.514060681077674 & 5.23431920388754 & 1.99515596163644 \\ 0.206981851287708 & -2.10755095445190 & -0.803331376524436 \\ -0.142501141471856 & 1.45098913190237 & 0.553070896905676 \end{bmatrix}$$

$$(14)$$

Answer:

Best Rank one approximation:

-0.5140606810776739 5.23431920388754 1.995155961636438 $0.20698185128770794 \quad -2.107550954451898 \quad -0.8033313765244364$ -0.1425011414718564 1.4509891319023662 0.553070896905676

2. c

> $Srank_2 := DiagonalMatrix(S_{1..2}, 3, 3)$

$$Srank_2 := \begin{bmatrix} 6.26135133093290 & 0. & 0. \\ 0. & 4.17319797039996 & 0. \\ 0. & 0. & 0. \end{bmatrix}$$
 (16)

>
$$Srank_2 := Diagonal Matrix(S_{1..2}, 3, 3)$$

$$Srank_2 := \begin{bmatrix} 6.26135133093290 & 0. & 0. \\ 0. & 4.17319797039996 & 0. \\ 0. & 0. & 0. \end{bmatrix}$$
(16)
$$Arank_2 := U \cdot Srank_2 \cdot Vt$$

$$Arank_2 := \begin{bmatrix} 0.980540907270313 & 4.98838591773545 & 3.02545598456845 \\ 2.78462949310486 & -2.53169700115519 & 0.973563847714099 \\ -1.79013446672211 & 1.72210344170339 & -0.582721187100628 \end{bmatrix}$$
(17)

Best Rank 2 approximation is:

0.980540907270313 4.988385917735454 3.02545598456845482.784629493104856 -2.531697001155195 0.9735638477140988 $-1.790134466722111 \quad 1.7221034417033938 \quad -0.5827211871006 \\ 283$

Find the best least squares approximating plane for the following

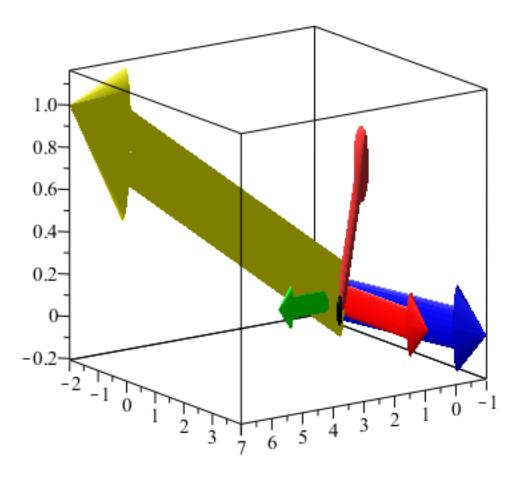
```
three-dimensional vectors,
and the projections of the vectors onto the subspace:
 *************************
The best least square (12.4.2)
with(VectorCalculus):
> A := Matrix([[2,-1,7,1],[3,4,-2,1],[1,0,1,0]])
                                       A := \begin{bmatrix} 2 & -1 & 7 & 1 \\ 3 & 4 & -2 & 1 \\ 1 & 0 & 1 & 0 \end{bmatrix}
                                                                                                                 (18)
> U, S, Vt := SingularValues(A, output = ['U', 'S', 'Vt'])

U, S, Vt := \begin{bmatrix} -0.932323094927223 & -0.313172844465256 & -0.180821503574287 \\ 0.334156944734542 & -0.937229798827319 & -0.0996967425534974 \\ -0.138248988969183 & -0.153372336748329 & 0.978449867581040 \end{bmatrix}
                                                                                                                 (19)
      7.76383316783266

5.14665168641866

0.484634873637294

, [[ -0.128857012121923, 0.292246217147758,
     -0.944485073856352, -0.0770452091463042],
     [-0.697814354065975, -0.667569239222174, -0.0915396415097822,
     -0.242954588629385],
     [0.655579385749605, -0.449751923553959, -0.181388457814040,
     -0.578823896890521],
     [0.258198889747161, -0.516397779494322, -0.258198889747161,
     0.774596669241483 ]]
> Srank_2 := DiagonalMatrix(S_{1..2}, 3, 4)
                 Srank\_2 := \begin{bmatrix} 7.76383316783266 & 0. & 0. & 0. \\ 0. & 5.14665168641866 & 0. & 0. \\ 0. & 0. & 0. & 0. \\ \end{bmatrix}
                                                                                                                 (20)
\rightarrow ARank 2 := U.Srank 2.Vt,
ARank 2 :=
                                                                                                                 (21)
     [2.05744999924839, -1.03941284340506, 6.98410449292397,
     0.949276268955153],
     [3.03167531334243, 3.97826955298687, -2.00876405872859, 0.972033244634240]
    [0.689130202735967, 0.213268281970857, 1.08601276112764, 0.274473040777796]]
> PlotVector([\langle A[1][1], A[2][1], A[3][1]\rangle, \langle A[1][2], A[2][2], A[3][2]\rangle,
        \langle A[1][3], A[2][3], A[3][3] \rangle, \langle A[1][4], A[2][4], A[3][4] \rangle,
        \langle ARank\_2[1][1], 0, 0 \rangle, \langle 0, ARank\_2[2][1], 0 \rangle, \langle color = [orange, blue, yellow, black, ]
        green, red]);
```



$$\rightarrow v1 := Vector(Column(ARank_2, 1)); v2 := Vector(Column(ARank_2, 2));$$

Vectors v1 and v2 are red and green -> they are projections (2 principal components) they are the best least square 2 dimentional subspace that is found by SVD according to the section 12.4.2 on the data matrix A.

The cross product of this 2 vectors will give the vecotr n orthogonal to v1 an v2 and the plane they make

_is below:

>
$$n := CrossProduct(v1, v2)$$

 $n := (-2.09498551801817)e_x + (-1.15507961008274)e_y + (11.3362529465249)e_z$ (23)

>
$$plane := -2.09498551801817 \cdot xI - 1.15507961008274 \cdot x2 + 11.3362529465249 \cdot x3 = 0$$

 $plane := -2.09498551801817 \cdot xI - 1.15507961008274 \cdot x2 + 11.3362529465249 \cdot x3 = 0$ (24)

Answer:

The best Plane is:

 $plane \coloneqq -2.09498551801817 \ xI - 1.15507961008274 \ x2 + 11.3362529465249 \ x3 = 0$ The projections are: