Definitions

Eigenvalues and Eigenvectors of a Diagonal Matrix

Eigenvalues of a Triangular Matrix

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\label{eq:solve} \begin{split} &\text{Solve}\Big[\begin{pmatrix} 1 & 1 \\ 0 & 1 \end{pmatrix} \cdot \{x,\,y\} = \{x,\,y\},\,\{x,\,y\} \Big] \\ &\text{Solve::svars}: \text{ Equations may not give solutions for all "solve" variables.} \gg \\ &\{\{y \to 0\}\} \\ &\text{Roots}\Big[\text{Det}\Big[\begin{pmatrix} a & b \\ 0 & c \end{pmatrix} - \lambda \, \text{IdentityMatrix}[2]\Big] = 0\,,\,\lambda\Big] \\ &\lambda = c \mid |\; \lambda = a \end{split}
```

3.

$$\begin{bmatrix} 2 & + \\ 0 & -3 \end{bmatrix} \begin{bmatrix} 1/5 \\ -1 \end{bmatrix} = \begin{bmatrix} 2/5-1 \\ 0+3 \end{bmatrix} = \begin{bmatrix} -3/5 \\ 3 \end{bmatrix} = -3 \cdot \begin{bmatrix} 1/5 \\ -1 \end{bmatrix}$$

4.

I decided to automate here, and gained a ton of insight from doing so. In particular, thinking about solving the equation $A.x = \lambda.x$ for known λ as looking for the null space of a matrix is really cool.

triangleEigens
$$\begin{bmatrix} 1 & 0 & 0 \\ -1 & 2 & 0 \\ 2 & 1 & 3 \end{bmatrix}$$

1	$\begin{pmatrix} -2 \\ -2 \\ 3 \end{pmatrix}$
2	$\begin{pmatrix} 0 \\ -1 \\ 1 \end{pmatrix}$
3	$\begin{pmatrix} 0 \\ 0 \\ 1 \end{pmatrix}$

$$\texttt{triangleEigens}\left[\begin{pmatrix}2&0&0\\0&2&0\\0&1&4\end{pmatrix}\right]$$

2	0 - 2 1	1 0 0	
2	$\begin{pmatrix} 0 \\ -2 \\ 1 \end{pmatrix}$	1 0 0	
4	$\begin{pmatrix} 0 \\ 0 \\ 1 \end{pmatrix}$		

This last problem is particularly interesting because the value 2 appears multiple times on the diagonal, and is thus a repeated eigenvalue. There are still three distinct eigenvectors, but pairing them up nicely is difficult.

The Characteristic Equation

Nice explanation! When I first learned this, it seemed unmotivated, but seeing the derivation this plainly makes it obvious.

```
In[8]:= myCharacteristicEqn[A_] := Module[{}},
       Factor@Det[A - \lambda IdentityMatrix[Length@A]] == 0
```

Diagonal matrices

myCharacteristicEqn[DiagonalMatrix[
$$\{-3, -1, 4\}$$
]] $-(-4 + \lambda) (1 + \lambda) (3 + \lambda) = 0$

I don't know why exactly the leading - snuck in, but it isn't particuarly important.

myCharacteristicEqn[DiagonalMatrix[{1, 1, 2}]]
$$-(-2 + \lambda)(-1 + \lambda)^2 = 0$$

As expected, there is a squared term representing the duplicate eigenvalue.

myCharacteristicEqn[DiagonalMatrix[{2, 4, 0}]]
$$-(-4 + \lambda) (-2 + \lambda) \lambda = 0$$

And bare eigenvalues of 0 work too!

Triangular Matrices

$$\begin{split} & \text{myCharacteristicEqn}\left[\begin{pmatrix} 1 & 0 \\ 1 & 2 \end{pmatrix}\right] \\ & (-2+\lambda) & (-1+\lambda) = 0 \\ \\ & \text{myCharacteristicEqn}\left[\begin{pmatrix} 1 & 0 & 0 \\ -1 & 2 & 0 \\ 2 & 1 & 3 \end{pmatrix}\right] \\ & - (-3+\lambda) & (-2+\lambda) & (-1+\lambda) = 0 \\ \\ & \text{myCharacteristicEqn}\left[\begin{pmatrix} 2 & 0 & 0 \\ 0 & 2 & 0 \\ 0 & 1 & 4 \end{pmatrix}\right] \\ & - (-4+\lambda) & (-2+\lambda)^2 = 0 \end{split}$$

8.

Because A is triangular, $A - \lambda I$ must also be diagonal. We showed earlier that this implies that $\det(A - \lambda I)$ is the product of the diagonal elements of that matrix, which are first-degree polynomials of the form $(a - \lambda)$ where $a \in \text{Diagonal}(A)$. Thus, their product is a degree-n polynomial with roots consisting of the diagonal elements of A.

7.

Diagonal matrices are triangular. See problem 8.

Eigenvalues and Eigenvectors of 2x2

9.

$$\begin{array}{ll} & \ln[22]:=& \mathbf{A}=\left(\begin{array}{cc} 18 & -2\\ 12 & 7 \end{array}\right);\\ & 15 \rightarrow \mathtt{MatrixForm@NullSpace}\left[\mathbf{A}-15\ \mathtt{IdentityMatrix}[2]\right][[1]]\\ & 10 \rightarrow \mathtt{MatrixForm@NullSpace}\left[\mathbf{A}-10\ \mathtt{IdentityMatrix}[2]\right][[1]]\\ & \mathrm{Out}[23]:=& 15 \rightarrow \left(\begin{array}{c} 2\\ 3 \end{array}\right)\\ & \mathrm{Out}[24]:=& 10 \rightarrow \left(\begin{array}{c} 1\\ 4 \end{array}\right) \end{array}$$

```
In[34]:= A = \begin{pmatrix} 3 & -2 \\ 4 & -1 \end{pmatrix};
          HoldForm@Det[A] = A[[1, 1]] * A[[2, 2]] - A[[1, 2]] * A[[2, 1]]
          HoldForm@Tr[A] == Total@Diagonal@A
          TraditionalForm[\lambda^2 - Tr[A]\lambda + Det[A] == 0]
 Out[35] = Det[A] == 5
 Out[36] = Tr[A] == 2
Out[37]//TraditionalForm=
          \lambda^2 - 2\lambda + 5 = 0
          Relatively standard
  In[38]:= A = \begin{pmatrix} 0 & -1 \\ 1 & 0 \end{pmatrix};
          {\tt HoldForm@Det[A] = A[[1, 1]] * A[[2, 2]] - A[[1, 2]] * A[[2, 1]]}
          HoldForm@Tr[A] == Total@Diagonal@A
          TraditionalForm[\lambda^2 - Tr[A]\lambda + Det[A] == 0]
 Out[39] = Det[A] == 1
 Out[40] = Tr[A] == 0
Out[41]//TraditionalForm=
         \lambda^2 + 1 = 0
          This equation has no real roots.
  In[46]:= \mathbf{A} = \begin{pmatrix} \mathbf{Cos}[\theta] & -\mathbf{Sin}[\theta] \\ \mathbf{Sin}\theta\theta & \mathbf{Cos}\theta\theta \end{pmatrix};
          HoldForm@Det[A] = A[[1, 1]] * A[[2, 2]] - A[[1, 2]] * A[[2, 1]]
          HoldForm@Tr[A] == Total@Diagonal@A
          TraditionalForm \left[ Simplify[\lambda^2 - Tr[A] \lambda + Det[A] \right] = 0 \right]
 Out[47]= Det[A] == Cos[\theta]^2 + Sin[\theta]^2
 Out[48] = Tr[A] == 2 Cos[\theta]
Out[49]//TraditionalForm=
          -2\lambda\cos(\theta) + \lambda^2 + 1 = 0
          After throwing on a simplify, lots of the trig goes away, which is nice.
      11.
 In[140]:= myEigenValues[A_] := (
             Clear@λ;
              \texttt{List@@Roots}\big[\texttt{myCharacteristicEqn[A],}\,\lambda\big]\big[\big[\texttt{All,2}\big]\big]
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```
ln[163] = myEigenValues@ \begin{pmatrix} 3 & -2 \\ 4 & -1 \end{pmatrix}
Out[163]= \{1-2 i, 1+2 i\}
ln[164]:= myEigenValues@\begin{pmatrix} 0 & -1 \\ 1 & 0 \end{pmatrix}
Out[164]= \{i, -i\}
 \begin{array}{ll} & \texttt{In[170]:=} & \texttt{myEigenValues@} \left( \begin{array}{cc} \texttt{Cos}[\theta] & -\texttt{Sin}[\theta] \\ \texttt{Sin@}\theta & \texttt{Cos}@\theta \end{array} \right) \end{array}
                  % == myEigenValues@RotationMatrix@0
\mathsf{Out} [\mathsf{170}] = \left\{ \mathsf{Cos}\left[\theta\right] - \mathbf{i} \; \mathsf{Sin}\left[\theta\right] , \; \mathsf{Cos}\left[\theta\right] + \mathbf{i} \; \mathsf{Sin}\left[\theta\right] \right\}
Out[171]= True
```

12.

There is an awesome theorem showing that the sum of the roots of any polynomial in standard form is always $-\frac{b}{a}$ where b is the coefficient on the x^{n-1} term and a is the coefficient on the x^n term. In this case, $b = -\det(A) \land a = 1$, so the sum of the roots (the sum of the eigenvalues) must be $\det(A)$.

13.

A second related theorem shows that the product of the roots of any polynomial is $(-1)^n * \frac{Z}{a}$ where n is the degree of the polynomial, and z is the constant term. In this case, $n = 2 \land z = \det(A)$, so the product of the roots is det(A).

14.

Consider $A = \begin{pmatrix} a & b \\ b & d \end{pmatrix}$. $\det(A) = a \, d - b^2$. $\operatorname{tr}(a) = a + d$. In order for the eigenvalues to be complex, it is necessarily true that $tr(A)^2 - 4 det(A) < 0$. Expanding, $(a + d)^2 - 4 (-b^2 + a d) < 0$, or $a^2 + 4b^2 - 2ad + d^2 < 0$. In the worst case, b = 0, so $a^2 - 2ad + d^2 = (a - d)^2 < 0$. Because a - d is real, its square must be non-negative, so the discriminant of the equation must be nonnegative, and the eigenvalue(s) must be real.

In[57]:=
$$A = \{\{a, b\}, \{b, d\}\};$$
In[83]:= $Tr[A] \land 2 - 4 Det[A] < 0$
Expand@%
% /. b $\rightarrow 0$
Factor@%

Out[83]:= $(a + d)^2 - 4 (-b^2 + a d) < 0$
Out[84]:= $a^2 + 4 b^2 - 2 a d + d^2 < 0$
Out[85]:= $a^2 - 2 a d + d^2 < 0$
Out[86]:= $(a - d)^2 < 0$

Or, the lame way,

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ln[88]:= Reduce[Tr[A] ^2 - 4 Det[A] < 0]
  Out[88]= False
        15.
              As discovered Nathan and Sam, the problem here should read v_2 = \begin{pmatrix} 1 \\ 1 \end{pmatrix}.
 In[123]:= A = \begin{pmatrix} 1 & -1 \\ 1 & 1 \end{pmatrix};
              \lambda 2 = 1 - i;
             v2 = \begin{pmatrix} 1 \\ \frac{1}{11} \end{pmatrix};
              A.v2 // MatrixForm
              λ2 v2 // MatrixForm
Out[126]//MatrixForm=
Out[127]//MatrixForm=
               \begin{pmatrix} 1 - i \\ 1 + i \end{pmatrix}
        16.
              This uses definitions from problem 11.
  In[151]:= myEigenVectors[A_] := (
                   DeleteDuplicates@
                      {\tt Flatten}\big[{\tt Map}\big[{\tt NullSpace}\big[{\tt A-\#IdentityMatrix}\big[{\tt Length@A}\big]\big]~\&,~{\tt myEigenValues}\,[{\tt A}]\,\big]~,~1\big]
 In[155]:= MatrixForm /@myEigenVectors@\begin{pmatrix} 3 & -2 \\ 4 & -1 \end{pmatrix}
Out[155]= \left\{ \left( \begin{array}{c} 1 - i \\ 2 \end{array} \right), \left( \begin{array}{c} 1 + i \\ 2 \end{array} \right) \right\}
 In[156]:= MatrixForm /@myEigenVectors@\begin{pmatrix} 0 & -1 \\ 1 & 0 \end{pmatrix}
Out[156]= \left\{ \begin{pmatrix} \mathbf{i} \\ 1 \end{pmatrix}, \begin{pmatrix} -\mathbf{i} \\ 1 \end{pmatrix} \right\}
 \label{eq:loss_envectors} $$ \ln[160] := $ \text{MatrixForm /@myEigenVectors@} \left( \begin{array}{cc} \cos[\theta] & -\sin[\theta] \\ \sin@\theta & \cos@\theta \end{array} \right) $$
              MatrixForm /@myEigenVectors@RotationMatrix[\theta]
              myEigenValues@RotationMatrix[\theta]
Out[160]= \left\{ \begin{pmatrix} -i \\ 1 \end{pmatrix}, \begin{pmatrix} i \\ 1 \end{pmatrix} \right\}
Out[161]= \left\{ \begin{pmatrix} -i \\ 1 \end{pmatrix}, \begin{pmatrix} i \\ 1 \end{pmatrix} \right\}
Out[162] = \left\{ Cos[\theta] - iSin[\theta], Cos[\theta] + iSin[\theta] \right\}
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Misc