

MATH 100 – Introduction to the Profession

Random Affine Transformations and Fractals in MATLAB

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Linear Transformations

Recall that multiplication by the matrix A , i.e.,

$$\mathbf{x} \mapsto A\mathbf{x},$$

represents a **linear transformation** of the vector \mathbf{x} .



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- shear maps (distorted version of our house)

In particular, **the origin** $\mathbf{x} = [0 \ 0]^T$ is mapped to $A\mathbf{x} = [0 \ 0]^T$, so **is kept fixed**.



Affine Transformations

Now we also allow a possible **translation by a vector \mathbf{b}** in addition to the matrix multiplication, i.e.,

$$\mathbf{x} \mapsto \mathbf{Ax} + \mathbf{b}.$$

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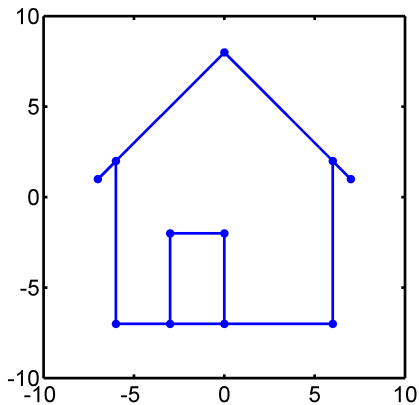
2D affine transformations

- include all linear transformations (when $\mathbf{b} = [0\ 0]^T$)
- allow the origin to be moved (**translated**)



We begin with the house as before:

```
X = house  
dot2dot (X)
```



The matrix $G\left(\frac{\pi}{4}\right)$

$$G\left(\frac{\pi}{4}\right) = \begin{bmatrix} \cos \frac{\pi}{4} & -\sin \frac{\pi}{4} \\ \sin \frac{\pi}{4} & \cos \frac{\pi}{4} \end{bmatrix} = \begin{bmatrix} \frac{\sqrt{2}}{2} & -\frac{\sqrt{2}}{2} \\ \frac{\sqrt{2}}{2} & \frac{\sqrt{2}}{2} \end{bmatrix}$$

rotates the house counterclockwise by a 45° angle:

```
G = [sqrt(2)/2 -sqrt(2)/2; sqrt(2)/2 sqrt(2)/2]
dot2dot(G*X)
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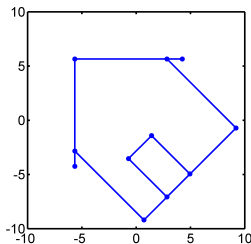
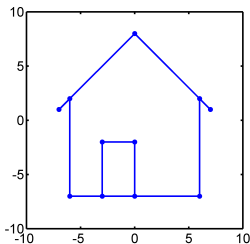
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This is a **linear transformation** (as in `wiggle.m`).



To obtain an affine transformation we add a nonzero vector \mathbf{b} .

However, since in our house example the “vector” \mathbf{x} is actually a matrix \mathbf{X} (a collection of many points listed in the columns of \mathbf{X}), we need to use a translation matrix \mathbf{B} consisting of many copies of the (same) translation vector \mathbf{b} .



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However, since in our house example the “vector” ***x*** is actually a matrix ***X*** (a collection of many points listed in the columns of ***X***), we need to use a translation matrix ***B*** consisting of many copies of the (same) translation vector ***b***.

This can be done by using MATLAB's `repmat()` command:

```
G = [sqrt(2)/2 -sqrt(2)/2; sqrt(2)/2 sqrt(2)/2]
b = [1; 2]      % 1 to the right, 2 up
n = size(X,2)   % number of columns/points in X
% make as many copies of b as are needed to match X
B = repmat(b,1,n)
dot2dot(G*X + B)
```



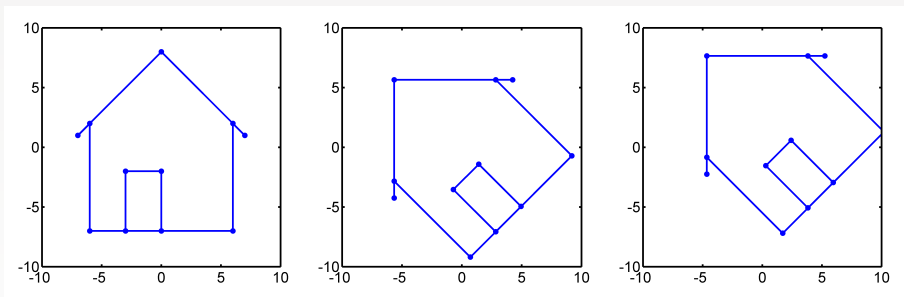


Figure : The original house (left), rotated by $G(\frac{\pi}{4})$ about the origin (middle), and rotated by $G(\frac{\pi}{4})$ about the origin and then translated by $\mathbf{b} = [1 \ 2]^T$ (right).



Fractal fern

The MATLAB script `fern.m` from [ExM] uses

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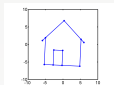
that are **performed randomly with different probabilities** to generate a fractal shape that looks like a real-life fern.



In particular, `fern.m` uses (plots show effects of A only)

- 85% of the time: a small clockwise rotation and small rescaling with an upward shift:

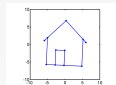
$$\mathbf{x} \mapsto \mathbf{A}_1 \mathbf{x} + \mathbf{b}_1 = \begin{bmatrix} 0.85 & 0.04 \\ -0.04 & 0.85 \end{bmatrix} \mathbf{x} + \begin{bmatrix} 0 \\ 1.6 \end{bmatrix}$$



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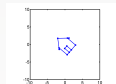
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- 7% of the time: a larger counter-clockwise rotation and larger rescaling with the same upward shift:

$$\mathbf{x} \mapsto A_2 \mathbf{x} + \mathbf{b}_2 = \begin{bmatrix} 0.20 & -0.26 \\ 0.23 & 0.22 \end{bmatrix} \mathbf{x} + \begin{bmatrix} 0 \\ 1.6 \end{bmatrix}$$

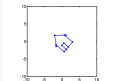


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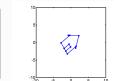
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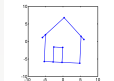
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$$\mathbf{x} \mapsto A_3 \mathbf{x} + \mathbf{b}_3 = \begin{bmatrix} -0.15 & 0.28 \\ 0.26 & 0.24 \end{bmatrix} \mathbf{x} + \begin{bmatrix} 0 \\ 0.44 \end{bmatrix}$$


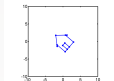


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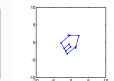
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
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- 1% of the time: a projection and rescaling onto the stem:

$$\mathbf{x} \mapsto A_4 \mathbf{x} = \begin{bmatrix} 0 & 0 \\ 0 & 0.16 \end{bmatrix} \mathbf{x}$$




Other (mathematically) interesting parts of the MATLAB script `fern.m` are:

- Use of **negation** to control the loop that keeps adding points (it runs until the “stop” button is pressed, i.e., its value is 1):

```
while ~get(stop, 'value')
```



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- Use of **negation** to control the loop that keeps adding points (it runs until the “stop” button is pressed, i.e., its value is 1):
`while ~get(stop, 'value')`
- Use of a **random number generator** to generate a random number (the **probability** of switching between transformations) uniformly distributed in $(0, 1)$:

```
r = rand;
```



Summary scripts

Look at `fern_recap.m` (on the ExM website).

In particular, `finitefern(n, 's')` produces a fern picture in which n points are highlighted and added one at a time.



A group at the University of Calgary [Algorithmic Botany] around Przemyslaw Prusinkiewicz has been using so-called **L-systems** (similar to the system of transformations that generated the fractal fern) to create entire synthetic landscapes:



They have many publications, such as [PalubickiEtAl], from which the above image is taken.



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Algorithmic Botany.

University of Calgary.

<http://algorithmicbotany.org/>

