

EIGENVALUES AND EIGENVECTORS.

A nonzero vector  $v$  is called an **eigenvector** of  $A$  if  $Av = \lambda v$  for some number  $\lambda$  which is called an **eigenvalue**.

EXAMPLES.

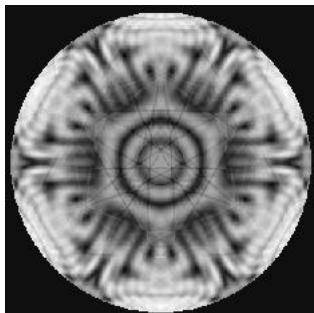
- $v$  is an eigenvector to the eigenvalue 0 if and only if it is in the kernel of  $A$ .
- If  $v$  is an eigenvector to the eigenvalue 1, then  $Av = v$ . Example: a vector in the axis of rotation of a rotation  $A$ .
- If  $A$  is a diagonal matrix with diagonal elements  $a_i$ , then the basis vectors  $e_i$  are eigenvectors.
- A shear  $A$  in the direction  $v$  has an eigenvector  $v$ .
- A rotation in the plane by an angle 30 degrees has no eigenvector. (There are actually eigenvectors but they are complex).

LINEAR DYNAMICAL SYSTEMS.

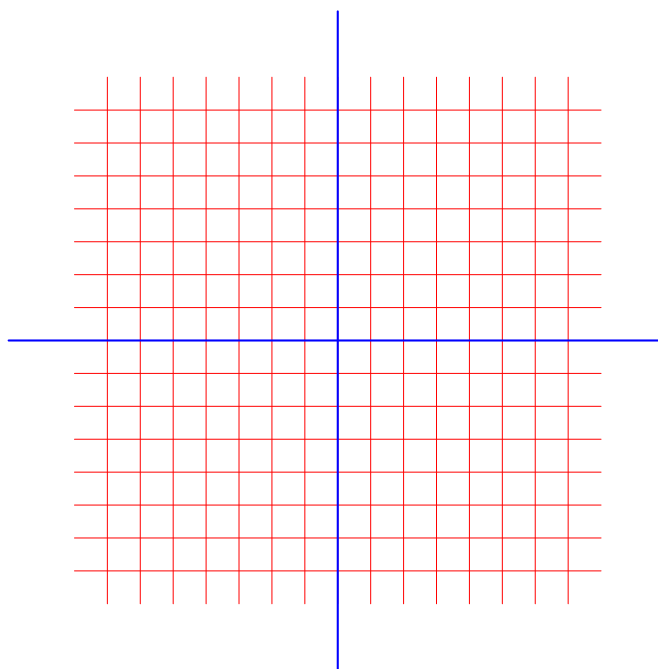
Iterating a linear map  $x \mapsto Ax$  appears in many applications. One wants to understand what happens with  $x_1 = Ax, x_2 = AAx = A^2x, x_3 = AAAx = A^3x, \dots$

One dimension:  $x \mapsto ax$  or  $x_{n+1} = ax_n$  has the solution  $x_n = a^n x_0$ . For example,  $1.03^{20} \cdot 1000 = 1806.11$  is the balance on a bank account which had 1000 dollars 20 years ago and if the interest rate was constant 3 percent. In many cases the behavior of  $u_{n+1}$  does not only depend on  $u_n$  but also on  $u_{n-1}$  or earlier times. In that case we write  $(x_n, y_n) = (u_n, u_{n-1})$  and get a linear map.  $x_{n+1}, y_{n+1}$  depend in a linear way on  $x_n, y_n$ . We see two examples below.

EXAMPLE. A linear recursion problem: (motivated from quantum mechanics) How does  $u_n$  grow if  $u_{n+1} + u_{n-1} = u_n$  and  $u_0 = 0, u_1 = 1$ . Plot  $(x_n, y_n) = (u_n, u_{n-1})$  for different initial conditions like for example  $(2, 0), (0, 4)$ .



(The picture shows electron diffraction patterns calculated using **Bloch waves**. By the way, the  $u_n$  just calculated is an example of a Bloch wave in a one dimensional crystal). Picture Source: P. Stadelman, 1995, [cimesg1.epfl.ch/CIOL/asu94/ICT5.html](http://cimesg1.epfl.ch/CIOL/asu94/ICT5.html)



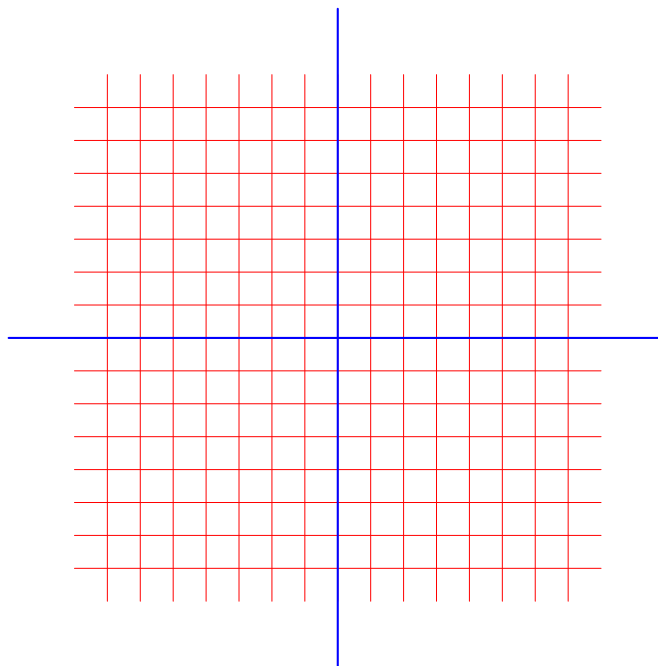
**LINEAR RECURSION PROBLEM:**



A problem in the third section of Liber abbaci, published in 1202 by **Leonardo Fibonacci** (1170-1250):

*A certain man put a pair of rabbits in a place surrounded on all sides by a wall. How many pairs of rabbits can be produced from that pair in a year if it is supposed that every month each pair begets a new pair which from the second month on becomes productive?*

How does  $u_n$  grow, if  $u_{n+1} = u_n + u_{n-1}$ ? Plot  $(x_n, y_n) = (u_n, u_{n-1})$  for different initial conditions like  $(1, 0)$  or  $(0, 1)$  and also  $n < 0$ .



**WHERE DO LINEAR DYNAMICAL SYSTEMS APPEAR?**

Linear systems  $x \mapsto Ax$  appear in many places, like quantum mechanics, chaos theory, probability theory economics or biology. More examples are still to come.

**EXAMPLE 1: Quantum mechanics.** Some quantum mechanical systems of a particle in a potential  $V$  are described by  $(Lu)_n = u_{n+1} + u_{n-1} + V_n u_n$ . Energies  $E$  for which  $(Lu)_n = E u_n$ , we have the recursion  $u_{n+1} + u_{n-1} = (E - V_n)u_n$ , when the potential is periodic in  $n$ , then this leads to a linear recursion problem. For example, if  $V_n = V$  is constant, then  $u_{n+1} + u_{n-1} = (E - V)u_n$ . A question is for which  $E$  the solutions stay bounded. You have seen above the case  $E - V = 1$ .

**EXAMPLE 2: Chaos theory.** In plasma physics, one studies maps like  $(x, y) \mapsto (2x - y - a \sin(x), x)$ . You see that  $(0, 0)$  is a fixed point. Near that fixed point, the map is described by its Jacobian  $\begin{bmatrix} x \\ y \end{bmatrix} \mapsto \begin{bmatrix} 2 - a & -1 \\ 1 & 0 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$ . For which  $a$  is this linear system stable near  $(0, 0)$  in the sense that a point near  $(0, 0)$  stays nearby? The answer will be given using eigenvalues.

**EXAMPLE 3: Evolution of quantities.** Example could be market systems, population quantities of different species, or ingredient quantities in a chemical reaction. A linear description might not always be a good model but it has the advantage that we can solve the system explicitly. Eigenvectors will provide the key to do so.

**EXAMPLE 4: Markov Processes.** The percentage of people using Apple OS or the Gnu/linux operating system is represented by a vector  $\begin{bmatrix} m \\ l \end{bmatrix}$ . Let  $2/3$  be the percentage of Mac OS users, who switch to Linux each month and  $1/2$  the percentage of Linux OS users, who switch to Apple. We look at the matrix  $P = \begin{bmatrix} 1/3 & 1/2 \\ 2/3 & 1/2 \end{bmatrix}$ . (It is called a **Markov matrix**: the entries satisfy  $0 \leq P_{ij} \leq 1$  and the sum of each column elements is equal to 1). What ratio of Apple/Linux users do we have? We can simulate this as follows with a dice: start in the state  $M=(1,0)$  (Mac). In the state M, if 3,4,5 or 6 shows up, switch to  $L=(0,1)$  otherwise keep M. If in the state L, if 1,2 or 3 shows up, switch to M otherwise keep L. The matrix  $P$  has an eigenvector  $(3/7, 4/7)$  to the eigenvalue 1. The interpretation is that eventually, the probability to be in state M is  $3/7$  and the probability to be in state L is  $4/7$ .