Recurrence relations

Olli-Pekka Hämäläinen

In prior lecture we derived a closed form formula for the recursion formula

$$p_{n+1} = 3p_n - 1$$

- Recursion formulas of this form are rather common coefficient parameters naturally vary
- Could we possibly be able to derive a closed form formula for a general 1st order recursion formula which, written in parametrized form, is

$$p_{n+1} = ap_n + b$$

• ...and even such a way that the initial value is left as a variable, so $p_0 = x$ like we did last time?

Let's be brave and start calculating terms!

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Write using sum notation

$$p_n = a^n x + b \left(\sum_{i=0}^{n-1} a^i \right)$$

The latter term is a geometric sum, where the common ratio is q = a. Let's replace the sum notation by the formula for geometric sum, so we'll get

$$p_n = a^n x + b \left(\frac{1 - a^n}{1 - a} \right)$$

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- ▶ Basic step: when n = 0, then

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$$Works! = x + b(0) = x$$

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$$p_{k+1} = ap_k + b = a\left(a^kx + b\left(\frac{1-a^k}{1-a}\right)\right) + b$$
 Multiply a inside the brackets

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$$= a^{k+1}x + b\left(\frac{a - a^{k+1}}{1 - a}\right) + b = a^{k+1}x + b\left(\frac{a - a^{k+1}}{1 - a} + 1\right)$$
Take b as common

multiple

Expand the 1 by term (1-a), so that we get both terms in brackets to have the same denominator:

$$= a^{k+1}x + b\left(\frac{a - a^{k+1}}{1 - a} + \frac{1 - a}{1 - a}\right)$$

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$$= a^{k+1}x + b\left(\frac{1 - a^{k+1}}{1 - a}\right)$$

- We managed to modify the left side to match the right side, so the claim is correct!
- Conclusion: the derived closed form formula is correct

Recurrence relations

So, we managed to derive that the recursive formula

$$p_{n+1} = ap_n + b \qquad , p_0 = x$$

...has a closed form solution

$$p_n = a^n x + b \left(\frac{1 - a^n}{1 - a} \right)$$

- Generally speaking, recursive formulae can be expressed in forms that are called recurrence relations
- For example, a recurrence relation that equals this recursive formula is (traditionally written using y)

$$y_{n+1} - ay_n = b$$

Recurrence relations of higher order

- We already derived a closed from formula (so, a solution) for a 1st order recursion formula
- We did this purely by using our own heuristic and proof by induction
- With higher order recurrence relations this method is quite work-heavy, so we'd need some handier tools
- Luckily, such tools exist!
- The solutions are based on the beforementioned nature of recurrence relations, where the order number *n* will appear in the exponent of the solution
- Let's start by examining a homogeneous recurrence relation of 2nd order

▶ Homogeneous recurrence relation of 2nd order is of form

$$y_{n+2} + ay_{n+1} + by_n = 0$$

- "Homogeneous" = right side is zero (only y-terms)
- In principle, coefficients a and b could also be dependent on the order number n, but let's now consider only the most common case where a and b are constant coefficients

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- It is possible to prove that the solutions of such a recurrence relation are of form "some number to the power of n", so $y_n = r^n$
- By understanding that this means $y_{n+1}=r^{n+1}$ and $y_{n+2}=r^{n+2}$ and by substituting these to the recurrence relation we get it to a form

$$r^{n+2} + ar^{n+1} + br^n = 0$$

Using exponent laws and by taking r^n as a common multiple we can modify the equation to form

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- This derivation actually applies for all homogeneous recurrence relations of nth order, so all recurrence relations of this form can be converted to such a polynomial equation (of nth order, respectively)
- The part in brackets is called a characteristic equation

$$r^2 + ar + b = 0$$

The total solution of a recurrence relation is formed by superposition from both solutions of the characteristic equation $(r_1 \text{ and } r_2)$ separately raised to a power of n:

$$y_n = r_1^n + r_2^n$$

Because the recurrence relation is always satisfied (= the left side of the equation always gets a value 0) by these r-values, naturally the same happens for all their multiples, too:

$$y_n = c_1 r_1^n + c_2 r_2^n$$

This form, where c_1 and c_2 are arbitrary constants, is the general solution of a homogeneous recurrence relation of 2^{nd} order - that is, if the characteristic equation has two real roots

Solutions of a homogeneous recurrence relation of 2nd order

- We remember, that a 2nd degree equation had three possible outcomes regarding the number of solutions:
 - 2 real roots
 - ▶ 1 root (so called double root)
 - Complex roots (no real solution)
- Due to this nature also a homogeneous recurrence relation of 2nd order has three possible situations depending on what kind of solutions we get from the characteristic equation:

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$$y_n = c_1 r_1^n + c_2 r_2^n$$
 if $r_1 \neq r_2$
 $y_n = c_1 r^n + c_2 n r^n$ if $r_1 = r_2 = r$
 $y_n = R^n (c_1 \cos(n\theta) + c_2 \sin(n\theta))$ if $r_1 = \alpha + i\beta$, $r_2 = \alpha - i\beta$

$$\begin{cases} if \ \alpha \neq 0, & \theta = \tan^{-1} \left(\frac{\beta}{\alpha} \right) \\ if \ \alpha = 0, & \theta = \frac{\pi}{2} \end{cases}$$

Homogeneous recurrence relation of 2nd order; initial conditions

- So far we haven't taken into account the initial conditions y_0 and y_1 , even though these naturally play a big role in the solution
- The effect of initial values will be considered via coefficients c_1 and c_2 : these coefficients must be chosen in such a way that the initial conditions are met

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- So, in the end we have to solve these coefficients
 - Group of equations for example, if 2 real solutions:

$$\begin{cases} y_0 = c_1 r_1^0 + c_2 r_2^0 \\ y_1 = c_1 r_1^1 + c_2 r_2^1 \end{cases}$$

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$$\begin{cases} y_0 = c_1 + c_2 \\ y_1 = c_1 r_1 + c_2 r_2 \end{cases}$$

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- Generally we can say the following:
 - Coefficients of the recurrence relation will define the shape of the solution
 - Initial conditions define the c-coefficients of solution terms

- Previously presented solution methods works for all homogeneous recurrence relations with constant coefficients regardless of the order
- Therefore, we can solve a recurrence relation of any order like this
- In higher order relations we'll naturally have to solve a higher order characteristic equation
 - Analytical solutions can be cumbersome, unless we find easy solutions by experimentation and can use long division
 - ▶ No problem if we can use a calculator/computer
- Solutions are combined by superposition according to the previous table
 - For example, if 3^{rd} order & characteristic equation has one double root and one single root: $r_1 = r_2$ and r_3



$$y_n = c_1 r_1^n + c_2 n r_1^n + c_3 r_3^n$$

Nonhomogeneous recurrence relation

- How about if the right hand side is not zero, but there exists a constant term d_n ?
 - This term can either be an "actual" constant or it can depend on the order number n

$$y_{n+2} + ay_{n+1} + by_n = d_n$$

The solution for such a recurrence relation is formed by combining the general solution of a corresponding homogeneous recurrence relation $y_{n,h}$ and a so called particular solution $y_{n,p}$ - by superposition, naturally:

$$y_n = y_{n,h} + y_{n,p}$$

The solution $y_{n,h}$ we could solve using the beforementioned process, so now we just have to find the particular solution $y_{n,p}$

Nonhomogeneous recurrence relation

- The particular solution is solved using the method of undetermined coefficients
- Here we'll make an educated guess on what form the $y_{n,p}$ is going to be based on the form of the nonhomogeneous part d_n and add undetermined coefficient(s) in front of the terms
 - if d_n is of the same form as one of the solutions to the homogeneous equation, the $y_{n,p}$ must be multiplied by n
- When a suitable guess $y_{n,p}$ has been chosen, it will be substituted to the original recurrence relation
- If the $y_{n,p}$ choice was successful, the recurrence relation can be simplified to a form where we can solve the undetermined coefficient(s)

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$$r^2 - 2r - 3 = 0$$

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$$r_1 = \frac{2-4}{2} = \frac{-2}{2} = -1$$
 $r_2 = \frac{2+4}{2} = \frac{6}{2} = 3$

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- Next we'll solve the particular solution. Because the nonhomogeneous part is $d_n = 2^n$, we'll guess that the particular solution will be of form $y_{n,p} = A2^n$
- Substituting this to the original recurrence relation:

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$$-3A = 1$$

$$A = -\frac{1}{3}$$

Now when we've solved the undetermined coefficient A (which is hence no longer undetermined), we can write the particular solution:

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Therefore, the final solution of the original recurrence relation is

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Had we been given the initial values y_0 and y_1 , we could substitute these to the solution and find out values for coefficients c_1 and c_2

Recurrence relations vs. difference equations

- In a recurrence relation we define the next term using the prior terms
- The corresponding equation could be written in such a way that we'd define the differences Δ of consecutive terms $\Delta(y_n) = y_{n+1} y_n$
 - $\Delta^2(y_n) = \Delta y_{n+1} \Delta y_n$

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 Combined
$$\Delta^2(y_n) = (y_{n+2} - y_{n+1}) - (y_{n+1} - y_n) = y_{n+2} - 2y_{n+1} + y_n$$

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- Equations written in this Δ -form are called difference equations*
- Difference equations are strongly linked to differential equations: they are actually discretized differential equations! $dx \rightarrow \Delta x$

*Terminology is a bit hazy, though: some authors speak of recurrence relations as difference equations

Difference equations

- Difference equations often arise in programming
 - Big-Oh complexity calculation for algorithms often leads to a difference equation (since the number of options is an integer, not a continuous variable)
- Also common in biology & geography
 - Migration & mixing of species
 - Same principles can be applied to economics (trickle-down economics models, globalization)
- A difference equation of higher order can be broken down to a group of first-order difference equations
 - Solving these is very similar to solving groups of differential equations
 - Matrix calculation provides good tools for this
- Close relationship often leads to people using more familiar differential equation models even though their variables would be of discrete nature

Thank you!

