

## THE GOMPERTZ FUNCTION AND ITS APPLICATIONS IN MANAGEMENT

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**Abstract:** In the present paper, we investigate the Gompertz function, which is commonly used, mostly as diffusion model, in economics and management. Our approach is based on indicating in a given time series, presumably with a Gompertz trend, some characteristic points corresponding to zeroes of successive derivatives of this function. This allows us to predict the saturation level of a phenomenon under investigation, by using only the early values of the time series. We also give an example of applications of this method.

**Keywords:** Gompertz function, time series, Stirling number of the II kind, mathematical model.

### 1 Introduction

The Gompertz function is described by the following differential equation of the first order

$$u'(t) = q u \log \frac{u_{\max}}{u}, \quad u(0) = u_0 > 0, \quad (1)$$

where  $t$  denotes time (or expenditures),  $u = u(t)$  is the unknown function (a solution of equation (1)),  $q, u_{\max}$  are constants (parameters of the equation) and  $\log(x)$  stands for the natural logarithm. The constant  $u_{\max}$  is called a saturation level. The integral curve  $u = u(t)$  of the equation (1), fulfilling condition  $0 < u(t) < u_{\max}$  is known as the Gompertz function.

A phenomenon described by equation (1) and function  $u(t)$  has an important property that its rate of growth  $u'(t)$  is proportional to the level already achieved i.e.,  $u(t)$ . On the other hand, if  $u(t)$  is sufficiently large and close to  $u_{\max}$ , then the factor  $\log \frac{u_{\max}}{u}$  is more significant and its influence inhibits further growth of the function  $u(t)$ .

From mathematical point of view equation (1) is the first order ordinary differential equation, which is easily solved by the method of the separation of variables. After solving it we obtain the following formula for the Gompertz function

$$u(t) = u_{\max} e^{-ce^{-qt}}, \quad (2)$$

where constant  $c$  appears in the integration process of (1) and is connected with the initial condition

$$u(0) = u_0 = u_{\max} e^{-c}, \text{ thus } c = \log \frac{u_{\max}}{u_0} > 0.$$

Mahjan et al. [4] show areas in which various S-shaped curves are used as diffusion models. The authors find that the Bass function can be used for modeling of consumer durable goods, retail services, agricultural, education, and industrial innovations. The logistic curve serves as model in industrial, high technology, administrative innovations, and the Gompertz function can be used for modeling consumer durable goods and agriculture innovations. This division into the areas of application is then confirmed in other studies (see [2, and 3]). Many different applications of the Gompertz curve are given moreover in papers [7, and 8].

The main idea of the present paper is to look, among the data of a given time series, for some characteristic points, which correspond to zeroes of derivatives of the Gompertz function. One of these points is clearly the point corresponding to the inflection point (i.e., the zero of  $u''$ ) of the Gompertz curve, at which, as is well known, the function takes value  $0,368u_{\max}$ .

For a sufficiently long time series, the point corresponding to the inflection point is easy to locate approximately, even from the graph.

If the data were collected for the times spaced equally, then, instead of estimating the values of the first derivative, it is sufficient to calculate successive first order differences and seek for their maximum to find an approximate value of the inflection point.

What we can do however, when the time series is not long enough, and we expect that the investigated phenomenon follows the Gompertz curve? When the phenomenon is on an early stage of growth and the data is available only in a relatively short time interval? Statistical methods for estimating the parameters of the Gompertz function based, for example, on the method of the nonlinear least squares may be unreliable, since functions having significantly different values of the saturation level may produce only slightly differing error values.

A way to explain of the situation seems in seeking, in the time series, points corresponding to zeroes of successive derivatives of the Gompertz function. For equally spaced time points this is equivalent to calculating successive differences.

For example, as we will see in Section 3, the zero of the third derivative  $u'''$  (i.e., the extreme

(maximum) of the second derivative  $u''$ ) occurs at the point, where the value of the logistic function is approximately  $0,0729 u_{\max}$ .

Similar method was used in our paper [5] for phenomena having the logistic trend.

By considering examples from the field of economics and management we have demonstrated its usefulness and effectiveness.

In the present article, we use some formulas concerning the Gompertz function, which have been proved in paper [6].

## 2 Properties of the Gompertz function

In contrast to the logistic function the Gompertz function does not have a symmetrical first derivative. Therefore, at the inflection point, the Gompertz function takes approximately the value  $0,368u_{\max}$ , which is less than  $u_{\max}/2$  (it is the value of the logistic function at its inflection point).

The graph of an exemplary Gompertz function is shown in Fig. 1.

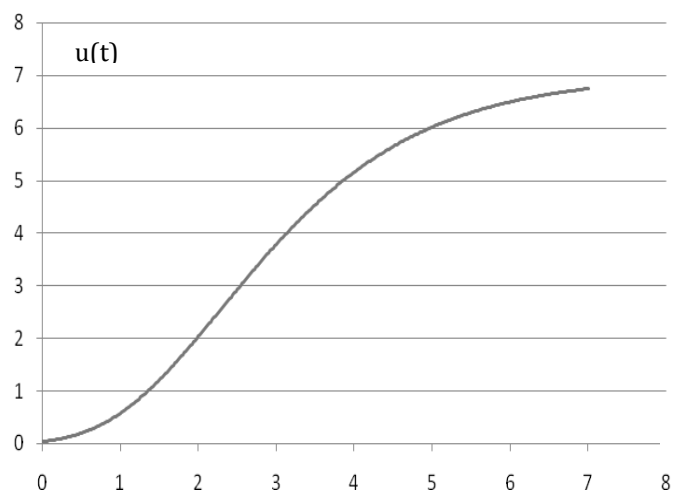


Figure 1. The Gompertz function with parameters  $q = 0,7$ ;  $u_{\max} = 7$ ;  $c = 5$   
(source: own elaboration in a spreadsheet)

We will introduce now Stirling numbers of the II kind because they are used in formulas for higher derivatives of the Gompertz function (see [1] for a good description of these numbers).

The Stirling number of the II kind, denoted by Knuth by  $\left\{ \begin{matrix} n \\ k \end{matrix} \right\}$  is defined in combinatorics as the number of ways of partitioning a set of  $n$  elements into  $k$  nonempty subsets.

For example three elements set consisting, say of numbers 1, 2, 3 can be partitioned into two nonempty subsets in three ways ( $\{1\}$  and  $\{2, 3\}$  or  $\{2\}$  and  $\{1,3\}$  or  $\{3\}$  and  $\{1, 2\}$ ), only one way into three nonempty subsets ( $\{1\}$ ,  $\{2\}$  and  $\{3\}$ ) and also one way into one nonempty subset (in this case it is the whole set  $\{1, 2, 3\}$ ).

Thus  $\left\{ \begin{matrix} 3 \\ 1 \end{matrix} \right\} = 1, \left\{ \begin{matrix} 3 \\ 2 \end{matrix} \right\} = 3, \left\{ \begin{matrix} 3 \\ 3 \end{matrix} \right\} = 1.$

The first few Stirling numbers of the II kind are given in Table 1.

Table 1. Stirling numbers of the II kind  
(source: Graham, Knuth and Patashnik [1])

n	$\left\{ \begin{matrix} n \\ 1 \end{matrix} \right\}$	$\left\{ \begin{matrix} n \\ 2 \end{matrix} \right\}$	$\left\{ \begin{matrix} n \\ 3 \end{matrix} \right\}$	$\left\{ \begin{matrix} n \\ 4 \end{matrix} \right\}$	$\left\{ \begin{matrix} n \\ 5 \end{matrix} \right\}$	$\left\{ \begin{matrix} n \\ 6 \end{matrix} \right\}$	$\left\{ \begin{matrix} n \\ 7 \end{matrix} \right\}$
1	1						
2	1	1					
3	1	3	1				
4	1	7	6	1			
5	1	15	25	10	1		
6	1	31	90	65	15	1	
7	1	63	301	350	140	21	1

The Stirling numbers of the II kind, as well as Newton binomial numbers, in addition to use in combinatorics, appear in many formulas of the broadly understood mathematical analysis.

In paper [4] we have proved, among other results, that if  $u(t)$  is a solution of the equation (1) then its  $n$ -th derivative  $u^{(n)}(t)$  is given by the following formula:

$$u^{(n)}(t) = q^n \sum_{k=1}^n (-1)^{n-k} \left\{ \begin{matrix} n \\ k \end{matrix} \right\} u \log^k \frac{u_{\max}}{u} \tag{3}$$

Using formula (3) and Table 1 let us write down formulas for the first few derivatives

$$u''(t) = q^2 u \log \frac{u_{\max}}{u} \left( -1 + \log \frac{u_{\max}}{u} \right) \tag{4}$$

$$u'''(t) = q^3 u \log \frac{u_{\max}}{u} \left( 1 - 3 \log \frac{u_{\max}}{u} + \log^2 \frac{u_{\max}}{u} \right) \tag{5}$$

$$u^{(4)}(t) = q^4 u \log \frac{u_{\max}}{u} \left( -1 + 7 \log \frac{u_{\max}}{u} - 6 \log^2 \frac{u_{\max}}{u} + \log^3 \frac{u_{\max}}{u} \right) \tag{6}$$

From formula (4) it follows, what we have already mentioned, that the value of the Gompertz function at the only inflection point is equal:

$$u_{\max}/e \approx 0,368u_{\max}.$$

In turn, by analyzing the quadratic function defined in brackets on the right hand side of (5), we easily

come to the conclusion that the value of the Gompertz function at the least zero point of its third derivative (it is simultaneously the maximum point of the second derivative) is equal:

$$\exp(-(3 + \sqrt{5})/2)u_{\max} \approx 0,0729u_{\max}.$$

Similarly, numerically computing the zeroes of the cubic polynomial in the brackets of (6) (note that the Cardano formulas give exact expressions but they are too difficult for practical use in this case) we are able to estimate the value of the Gompertz function at the least zero point of its fourth derivative as  $\exp(-4,49086)u_{\max} \approx 0,0112u_{\max}$ .

### 3 Applications

We will now attempt to apply the results derived in the previous section for actual data. The data are presented in Table 2 in column 2 and are for sale

in the consecutive 41 weeks in year 2013 (Week, column 1) of bicycle accessories (expressed in hundreds PLN rounded to the nearest hundred after completing the calculation) in a large retail chain of sport goods in Poland. The name of the retail chain has been reserved. column 3 shows the Total Sale, cumulatively in weeks 1 to 41 (see also Fig. 2). column 4 contains the exponentially smoothed values from column 2, with a smoothing constant equal to 0.17, and column 5 consecutive sums of the numbers from column 4. We will try to predict the saturation level using only the early part of the time series.

Table 2. Working table  
(source: own elaboration based on the collected data)

Week -1-	Sales -2-	Total Sales -3-	Exponential smoothing -4-	Total -5-	$\Delta^2 y$ -6-	$\Delta^3 y$ -7-
1	5 117	5 117	5 117	5 117		
2	5 569	10 686	5 117	10 233		
3	5 896	16 582	5 194	15 427	77	
4	4 929	21 511	5 313	20 740	119	43
5	8 110	29 621	5 248	25 988	- 65	- 185
6	8 491	38 112	5 734	31 722	487	552
7	9 265	47 376	6 203	37 925	469	- 18
8	12 028	59 405	6 723	44 648	521	52
9	44 264	103 669	7 625	52 274	902	381
10	67 592	171 262	13 854	66 128	6 229	5 327
11	53 566	224 828	22 989	89 117	9 136	2 907
12	48 381	273 209	28 188	117 305	5 198	- 3 937
13	51 245	324 454	31 620	148 925	3 433	- 1 765
14	84 510	408 964	34 957	183 882	3 336	- 97
15	200 786	609 750	43 381	227 262	8 424	5 088
16	326 679	936 429	70 140	297 402	26 759	18 335
17	359 837	1 296 266	113 751	411 153	43 612	16 853
18	286 480	1 582 747	155 586	566 739	41 835	- 1 777
19	344 658	1 927 405	177 838	744 577	22 252	- 19 583
20	271 164	2 198 569	206 197	950 775	28 359	6 107
21	264 860	2 463 429	217 242	1 168 016	11 044	- 17 315
22	259 355	2 722 784	225 337	1 393 353	8 095	- 2 949
23	230 485	2 953 269	231 120	1 624 473	5 783	- 2 312
24	257 313	3 210 583	231 012	1 855 485	- 108	- 5 891

Table 2. Working table, cont.

Week -1-	Sales -2-	Total Sales -3-	Exponential smoothing -4-	Total -5-	$\Delta^2 y$ -6-	$\Delta^3 y$ -7-
25	265 185	3 475 767	235 483	2 090 968	4 471	4 579
26	214 461	3 690 228	240 532	2 331 501	5 049	578
27	233 047	3 923 275	236 100	2 567 601	- 4 432	- 9 481
28	216 963	4 140 238	235 581	2 803 182	- 519	3 913
29	217 461	4 357 699	232 416	3 035 599	- 3 165	- 2 646
30	219 114	4 576 813	229 874	3 265 472	- 2 542	623
31	203 742	4 780 555	228 045	3 493 517	- 1 829	713
32	187 717	4 968 272	223 913	3 717 430	- 4 131	- 2 302
33	148 933	5 117 205	217 760	3 935 190	- 6 153	- 2 022
34	130 007	5 247 212	206 059	4 141 249	- 11 701	- 5 547
35	123 898	5 371 110	193 130	4 334 380	- 12 929	- 1 228
36	98 856	5 469 966	181 361	4 515 741	- 11 770	1 159
37	61 598	5 531 564	167 335	4 683 076	- 14 026	- 2 256
38	42 018	5 573 582	149 360	4 832 435	- 17 975	- 3 949
39	42 823	5 616 404	131 112	4 963 547	- 18 248	- 273
40	35 153	5 651 558	116 102	5 079 649	- 15 009	3 239
41	38 426	5 689 983	102 341	5 181 990	- 13 761	1 248

Denote by  $y_n$  consecutive values in column 5, indexed by the week numbers from column 1. The columns 6 and 7 show respectively the second and third differences of the numbers from column 5. Let us recall that the second difference is defined by

formula  $(\Delta^2 y)_n = y_n - 2y_{n-1} + y_{n-2}$  and the third one as  $(\Delta^3 y)_n = y_n - 3y_{n-1} + 3y_{n-2} - y_{n-3}$ .

Note that the greatest second difference appears in the 17th week and corresponds to the number  $y_{17} = 411,153$  in column 5.

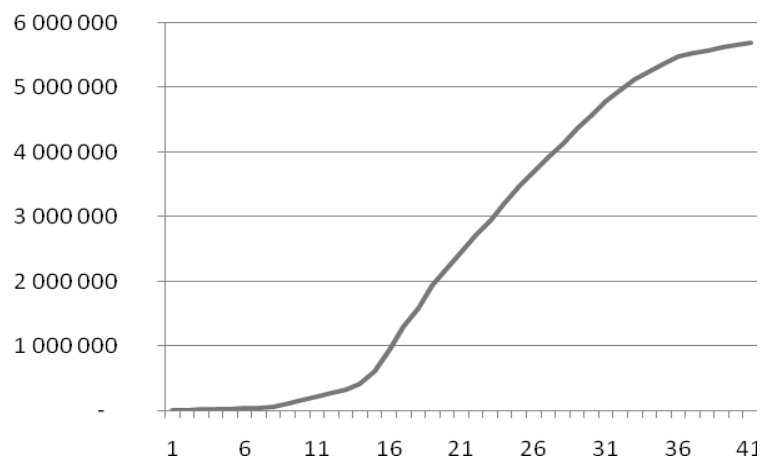


Figure 2. Total Sale of the bicycle accessories (data from column 3, Table 2)  
(source: own elaboration based on the collected data)

Thus, using the final conclusions from the previous section we estimate the saturation level as:

$$y_{\max} = 411,153/0.0729 = 5,639,961 .$$

Since the next second difference (calculated for the 18th week) is only slightly less, that is, in 17th week does not occur a distinct maximum, it seems that the above obtained value could be slightly enlarged.

We also see that the maximum of the third difference occurred in 10th week and corresponds to the value  $y_{10} = 66,128$ . Therefore the estimated saturation level will be equal to:

$$y_{\max} = 66,128/0.0112 = 5,904,241 .$$

The both above estimates of the saturation level well correspond to the actual level resulting from the primary data (see Fig. 2).

Looking more broadly at the management, the Gompertz curve (or, for example, the logistic curve, the Bass function or others, depending on the specific data) could be a tool for an improvement of the communication between different departments of the company. The logistics department can define, for the purchases department, the time period, within which it must enforce the appropriate size of delivery from suppliers (purchasing department deals with setting delivery times in the company from which the data have been received), so that the logistics department would have sufficient time for the receipt and delivery of the goods to shops. The curve shows the managers of a particular store, when they have to prepare, for instance furniture, on which the seasonal goods will be exhibited (retail chain in the study used furniture for skis and ski accessories and summer furniture just for bikes and bike accessories). Properly prepared curves thus allow the departments to be better self-organized.

#### 4 Conclusions

The smoothing constant 0.17, used in the calculations of Table 2, has been selected empirically. We wanted to remove random fluctuations from the initial part of the time series. We have checked however, that one could take here any value in the range from approx. 0.1 to 0.2.

We believe that our method, which consists of finding in a given time series, the points corresponding to zeroes of subsequent derivatives of the function describing the phenomenon under investigation, requires further study. One should examine its usefulness for others, possibly large datasets.

Furthermore, it seems that the method should be used together with existing methods of determining the characteristics of an S-shaped curve, for example, with the nonlinear least squares method.

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