

## MODELLING SOLID WASTE GENERATION USING LEFKOVITCH MATRIX

J. P. SENZIGE, O.D. MAKINDE

**Abstract:** Population projection models provide a vital tool for planning, not only in the provision of social services but also in various other fields such as conservation strategies for endangered plants and animal species. As the name implies, these models have traditionally been used in ecological and population studies. In this article, the Lefkovitch matrix is used to predict solid waste generation by linking population growth with solid waste generation. The results indicate gradual population growth results in gradual increase in solid waste generation rate. Variability analysis shows that survival rates of the first three groups have significant effect on the population growth rate and so solid waste generation rate. The results are based on the solid waste characterisation and quantification study carried out in Dar es Salaam, Tanzania.

### 1. Introduction

Mathematical modelling provides an insight into a problem by establishing mathematical relationships among the variables and parameters involved. Several attempts at modelling solid waste generation have been made (Najm *et al.*, 2004; Benitez *et al.*, 2008; Dyson and Chang, 2005; Eleyan *et al.* 2013; Senzige *et al.*, 2014). According to Beigl *et al.* (2008), the differences in previous attempts at modelling solid waste were in the size of the area considered, choice of independent variables, waste streams considered and techniques employed. The techniques that have been in use are least square regression (Benitez *et al.*, 2008); linear programming models (Najm *et al.*, 2004); system dynamics modelling (Dyson and Chang, 2005, Eleyan *et al.* 2013) and deterministic compartmental models (Senzige *et al.*, 2014).

Apart from the differences in the techniques employed there were also differences in the streams addressed. For example, the works of Daskalopoulos *et al.* (1998), Christiansen and Fischer (1999) and Skovgaard *et al.* (2005) addressed materials constituting the waste while the works of Leao *et al.* (2001), Beigl *et al.* (2004) and Dyson and Chang (2004) dealt with solid collection and disposal systems. Modelling of fractions of household waste (comingled or residual waste) is accredited to the works of Abu Qdais *et al.* (1997) and Denison *et al.* (1996).

Despite the various attempts at modelling solid waste, nowhere in literature, the Leslie (1945) or Lefkovitch (1965) matrix models have been used to model solid waste generation. The models are normally used in population ecology and demographic studies (Leslie, 1945; Lefkovitch, 1965; Crouse *et al.* 1987; Lo *et al.* 1995; Shea and Kelly, 1998; Godfray and Rees, 2002; Carslake *et al.* 2008; Coulson *et al.* 2010; Jonzen *et al.* 2010;

Tuljapurkar, 2010; Akamine and Suda, 2011 and Kajin *et al.* 2012). In this work, the author uses the already established strength of the Leslie/Lefkovitch matrix models in modelling population growth to predict solid waste generation as there is a direct link between population growth and solid waste generation rates (Senzige *et al.* 2014). The author demonstrates how population parameters affect solid waste generation through variability and sensitivity analysis.

## 2. Development of the Model

Model development is split into two sections. The first part is on the model for population dynamics where the Lefkovitch matrix is used. The second part is modelling solid waste generation and treatment based on population dynamics. The Lefkovitch (1965) matrix model is a stage structured model based on fecundity and survivorship of discrete stage-classes in a population. In Figure 1 six stage-structured classes  $A_1, A_2, A_3, A_4, A_5$  and  $A_6$  is presented.

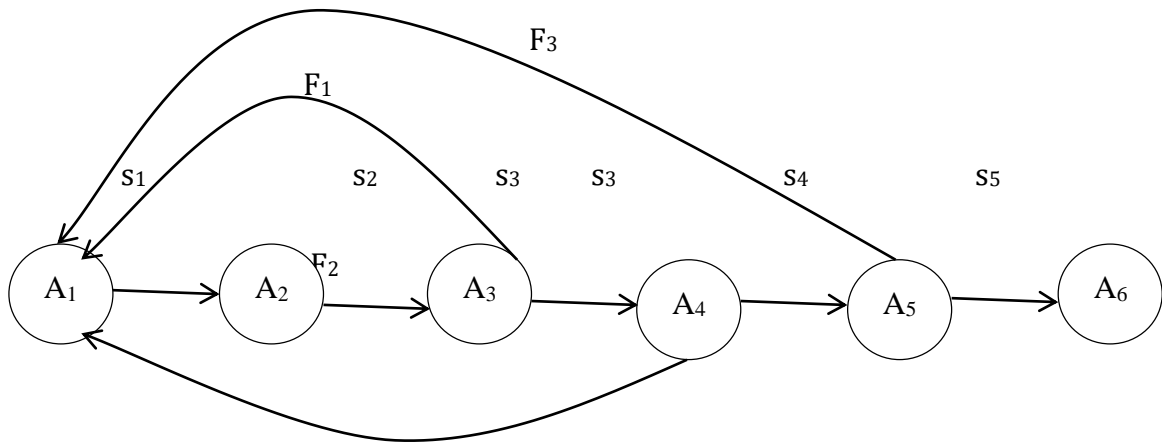


Figure1: Life cycle graph for six-class stage-structured population

From the model we derive the system of equations in eq. (1)

$$\left. \begin{aligned}
 A_1(t+1) &= F_1 A_3(t) + F_2 A_4(t) + F_3 A_5(t) \\
 A_2(t+1) &= s_1 A_1(t) \\
 A_3(t+1) &= s_2 A_2(t) \\
 A_4(t+1) &= s_3 A_3(t) \\
 A_5(t+1) &= s_4 A_4(t) \\
 A_6(t+1) &= s_5 A_5(t)
 \end{aligned} \right\} \quad (1)$$

where  $A_1$  represents infant (age 0-4) group,  $A_2$  represents children (age 5-14) group,  $A_3$  represents adolescents (15-19),  $A_4$  represents young adults (age 20-34),  $A_5$  represents adults (age 35-49)  $A_6$  represents elderly (age 50 and above). The  $s_1, s_2, s_3, s_4$  and  $s_5$  are

survival rates, that is, the chances that individuals in group  $A_1$  will survive and cross to age group  $A_2$ ,  $A_2$  to  $A_3$ ,  $A_3$  to  $A_4$ ,  $A_4$  to  $A_5$  and  $A_5$  to  $A_6$  respectively while  $F_1$ ,  $F_2$  and  $F_3$  are reproductive (fecundity) rates for groups  $A_3$ ,  $A_4$  and  $A_5$  respectively. It is assumed that  $A_1$ ,  $A_2$  and  $A_6$  group are non-reproductive due to age. In this way, population growth can be projected using the Lefkovitch (1965) population matrix model.

When written in matrix form, the system of equations in (1) becomes:

$$\begin{bmatrix} A_1(t+1) \\ A_2(t+1) \\ A_3(t+1) \\ A_4(t+1) \\ A_5(t+1) \\ A_6(t+1) \end{bmatrix} = \begin{bmatrix} 0 & 0 & F_1 & F_2 & F_3 & 0 \\ s_1 & 0 & 0 & 0 & 0 & 0 \\ 0 & s_2 & 0 & 0 & 0 & 0 \\ 0 & 0 & s_3 & 0 & 0 & 0 \\ 0 & 0 & 0 & s_4 & 0 & 0 \\ 0 & 0 & 0 & 0 & s_5 & 0 \end{bmatrix} \begin{bmatrix} A_1(t) \\ A_2(t) \\ A_3(t) \\ A_4(t) \\ A_5(t) \\ A_6(t) \end{bmatrix} \quad (2)$$

Written in compact form, equation (2) becomes,

$$A(t+1) = LA(t) \quad (3)$$

Where  $L = \begin{bmatrix} 0 & 0 & F_1 & F_2 & F_3 & 0 \\ s_1 & 0 & 0 & 0 & 0 & 0 \\ 0 & s_2 & 0 & 0 & 0 & 0 \\ 0 & 0 & s_3 & 0 & 0 & 0 \\ 0 & 0 & 0 & s_4 & 0 & 0 \\ 0 & 0 & 0 & 0 & s_5 & 0 \end{bmatrix}$  is the Lefkovitch Matrix

It can also be shown from equation (3) that at time  $t+r$  we have,

$$A(t+r) = L^r A(t) \quad (4)$$

## 2.1. Determining the vital rates

Solid waste generation is a function of population, among other factors. Therefore, in order to forecast solid waste generation as a function of population growth, we need to determine age-specific rates of survival and fertility ( $s_i$  and  $F_i$ ) of the population in question. In this case, the survival and fertility rates of the population of Dar es Salaam which is the study area are used. The survival and fertility rates are collectively known as vital rates. It is by using these rates the model determines population growth rate, projected estimates of the population size and age distribution over a specific period of time. Estimates of survival and fertility rates for each stage class over the population projection time are estimated using data from the 2002 and 2012 population and housing census in Table 1.

The formula for computing the survival rate is:

$$s_i = \frac{l(i)}{l(i-1)} \quad , \quad \text{where } l \text{ is the number of individuals in a given stage class at a given time and}$$

$l$  is an integer and the age specific fertility rate (ASFR) is given by the formula:

$$ASFR = \frac{\text{Number of livebirths to women in the specific age group}}{\text{Number of women in the same age group}} \times 1000$$

**Table1: Computation of Vital rates**

Ages at 2002 Census	Ages at 2012 Census	2002 Female population	2012 Female population	No. of live births (2012 census)	Survival rates	Fertility rates
0-4	10-14	285386	262555	0	0.92	0
5-14	15-24	490940.	436937	0	0.89	0
15-19	25-29	324910	281047	101,177	0.865	0.36
20-34	30-44	941198	775547	589,416	0.824	0.76
35-49	45-59	425233	330831	117,446	0.778	0.355
50+	60+	225262	151838	0	0	0

The stage-structured matrix model (Lefkovitch, 1965) was employed basically for three reasons. First, for humans; the vital rates are better predicted by social status rather than age. Secondly, the data are based on census and so are not fine-grained to generate age-specific vital rates (Alberts and Altmann, 2003) that are normally required in Leslie (1945) matrix model to give good results. Thirdly, the Lefkovitch (1965) matrix model provides more flexibility in terms of stage durations – the stage durations do not have to be equal to projection interval as is the case in the Leslie (1945) matrix model. However, regardless of duration of the stage-classes, vital rates are calculated based on the same projection interval (Caswell, 2001).

### 3. Results and Discussion

Substituting the vital rates in equation (3) the Lefkovitch matrix is given by;

$$L = \begin{bmatrix} 0 & 0 & 0.360 & 0.760 & 0.355 & 0 \\ 0.920 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0.890 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0.865 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0.824 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0.778 & 0 \end{bmatrix}$$

And by using Maple (Appendix 2), the Lefkovitch matrix above has the following eigenvalues  $\lambda_1 = 0$  ,  $\lambda_2 = 1.010129096$  ,  $\lambda_3 = -0.0040270666 + 0.8556497155i$ ,  $\lambda_4 = -0.0040270666 - 0.8556497155i$  ,  $\lambda_5 = -0.5010375003 + 0.1705835670i$  and  $\lambda_6 = -0.5010375003 - 0.1705835670i$ .

Surely; the dominant eigenvalue is  $\lambda = 1.01012909$  which implies that the population grows at 1% and solid waste generation increases with increasing population growth. The solid waste dynamics are influenced by the solid waste generation and treatment rate as shown in Figure 2.  $\lambda$  is the population growth rate which determines the amount of solid waste generation and  $r$  is the solid waste treatment rate.

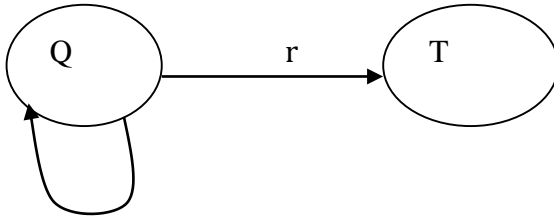


Figure1: Life cycle graph for solid waste generation and treatment

From Figure 2 we have,

$$\left. \begin{aligned} Q(t+1) &= \lambda Q(t) \\ T(t+1) &= rQ(t) \end{aligned} \right\} \quad (5),$$

which in matrix form can be written as

$$\begin{bmatrix} Q(t+1) \\ T(t+1) \end{bmatrix} = \begin{bmatrix} \lambda & 0 \\ 0 & r \end{bmatrix} \begin{bmatrix} Q(t) \\ T(t) \end{bmatrix} \quad (6)$$

From equation (6), it is clear that:

$$\begin{aligned} Q(t+1) &= \lambda Q(t) \\ Q(t+2) &= \lambda Q(t+1) \\ &= \lambda^2 Q(t) \\ &\cdot \\ &\cdot \\ Q(t+10) &= \lambda^{10} Q(t) \\ &\cdot \\ &\cdot \\ &\cdot \\ Q(t+n) &= \lambda^n Q(t) \end{aligned} \quad (7)$$

Similarly,

$$T(t+n) = r^n Q(t) \quad (8)$$

Now let  $\beta$  be the stable solid waste generation- treatment rate; then  $\beta$  can be obtained by solving the characteristic equation  $\beta^2 - (\lambda + r)\beta + \lambda r = 0$  which gives  $\beta = \lambda$  or  $\beta = r$ .

However for a solid waste free equilibrium  $\lambda Q(t) = rQ(t)$  implying that  $\lambda = r$ ; that is, all waste generated is treated. By treatment here, we mean all means, techniques, technologies, methods and methodologies geared towards elimination of solid waste in the environment. These include collection, reuse, recycling, composting, incineration, land filling and even natural decay.

If  $\lambda Q(t) > rQ(t) \Rightarrow \lambda > r$  or  $\frac{\lambda}{r} > 1$  then, solid waste generation will increase with increasing population, otherwise; it will decrease with treatment provided

$$\lambda Q(t) < rQ(t) \Rightarrow \lambda < r \text{ or } \frac{\lambda}{r} < 1$$

### 3.1. Variability Analysis

Variability analysis is intended to tell us how the population growth rate and therefore solid waste generation rate varies with a small change in the vital rates.

**Table1: Variability of  $\lambda$  due to a 0.005 increase in vital rates**

Elements	$\nabla \lambda$	Percentage change
$l_{13}$	0.001025	0.101511
$l_{14}$	0.000877	0.086858
$l_{15}$	0.000715	0.07082
$l_{21}$	0.001401	0.138693
$l_{32}$	0.001448	0.143358
$l_{43}$	0.001064	0.105333
$l_{54}$	0.000309	0.030541
$l_{65}$	0	0

Table 2 shows how the population growth rate (the dominant eigenvalue) changes as each of the vital rates increases by 0.005. The elements  $l_{13}$  to  $l_{15}$  are fertility rates for age groups  $A_3$  to  $A_5$  respectively while elements  $l_{21}$  to  $l_{65}$  are survival rates for groups  $A_1$  to  $A_5$ . It is clear that the survival of the first three age groups has significant effect on the population growth rate and so more important as far as solid waste generation is concerned. So, any change in the survival rates of these groups will result in the change of solid waste generation rates. It is surprising however that the survival of the fifth group has no effect of the population growth rate.

#### 4. Numerical results

In this section graphical representation of equations (7)-(8) is presented. Figure 3 depicts solid waste generation when  $\lambda=1$ . That is the population is stable; it is neither increasing nor decreasing. The solid waste generation remains constant. That is if the population is not growing there is no increase in solid waste generation.

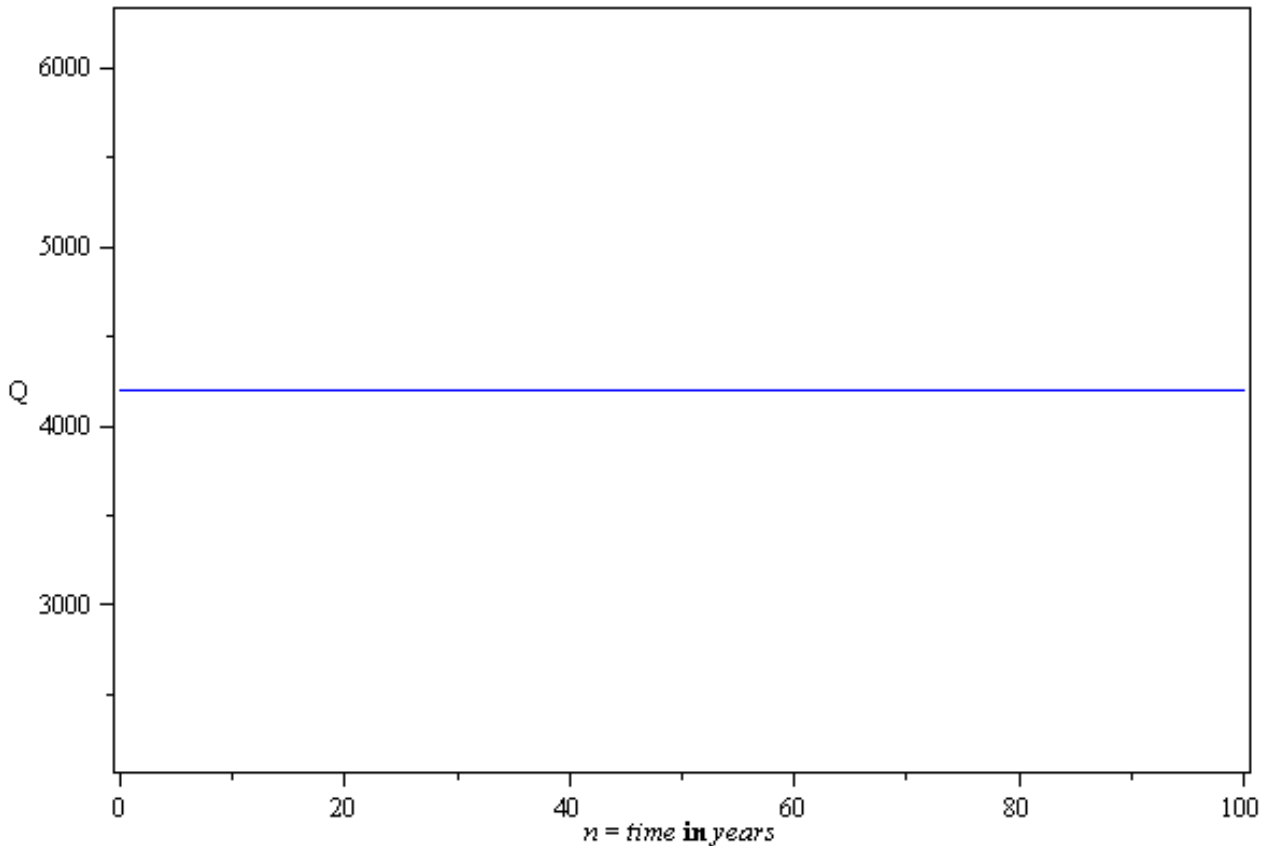


Figure1: Solid waste generation rate when  $\lambda=1$

Figure 4 presents solid waste generation when the population is growing at 1% (that is  $\lambda = 1.01$ ). We note that solid waste generation increases with time as population increases. In this case, treatment has to be employed in order to achieve a solid waste free environment.

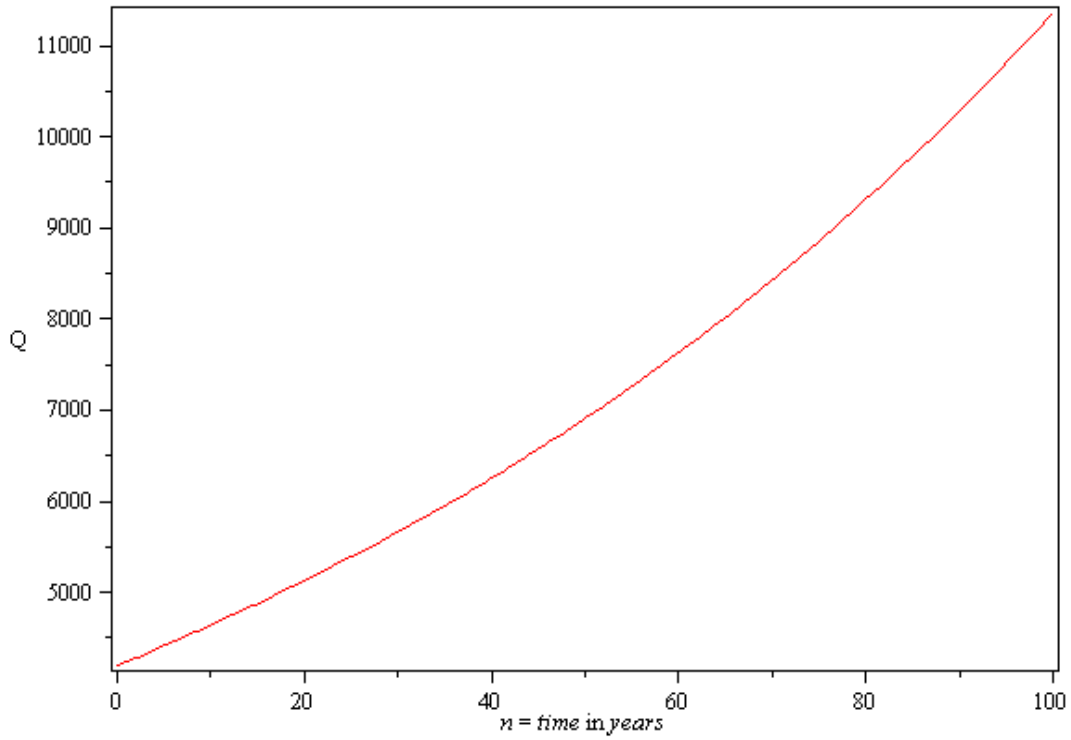


Figure2: solid waste generation  $\lambda=1.01$

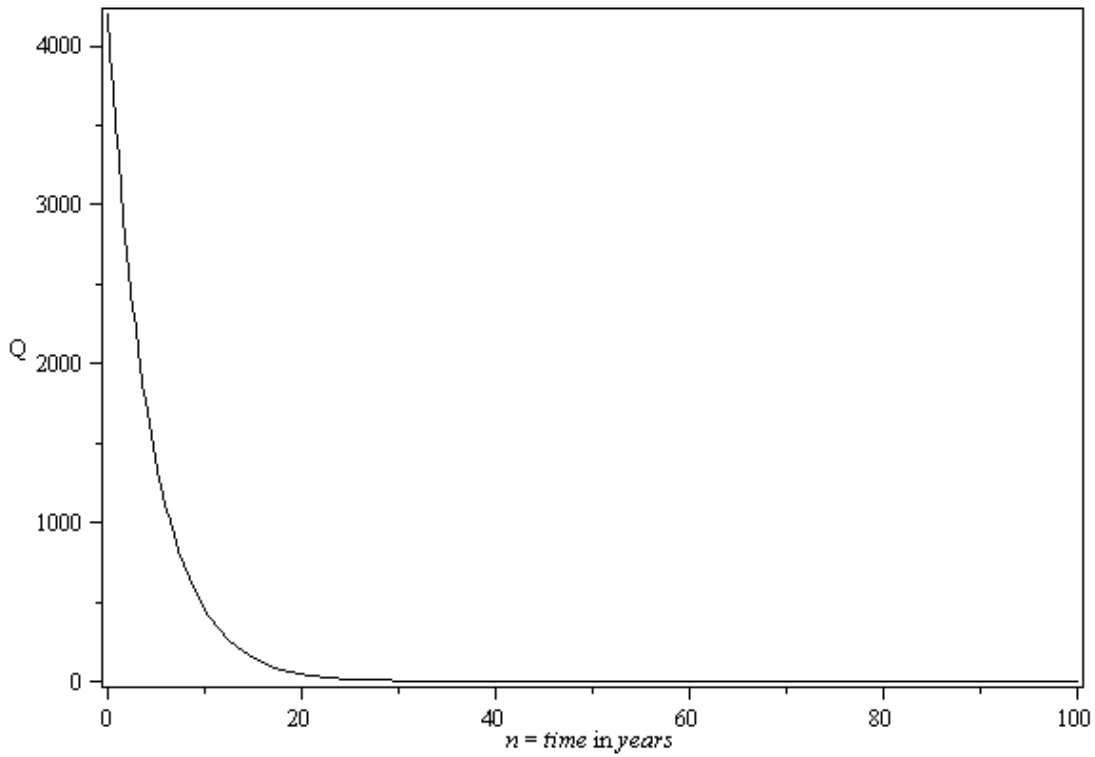


Figure3: solid waste generation when  $\lambda=0.8$



Figure 5 depicts a picture about solid waste generation when the population is decreasing that is when  $\lambda < 1$  (0.8 in this case). A population growth rate less than one indicate that the population in question is decreasing. It implicitly means that the solid waste generation rate should also decrease as the population decreases. In the event of the population extinction (a most unlikely scenario) solid waste generated will be zero.

## 5. Conclusion

The value of  $\lambda = 1.01012$  implies that a gradual increase in the population with time is expected. This also implies a gradual increase in the solid waste generation, and hence treatment of solid waste must be intensified on yearly bases in order to reduce the menace. Solid waste free equilibrium can be achieved when the population growth rate  $\lambda$  equals the solid waste treatment rate  $r$ . In the event  $\lambda > r$  solid waste accumulation increases with increasing population while if  $\lambda < r$  solid waste generation decreases with decreasing population and due to treatment. The variability analysis also indicates that the survival of the first three age groups has significant effect on the population growth rate and so more important as far as solid waste generation is concerned. So, any change in survival rates of these groups will result in the change of solid waste generation rates.

## REFERENCES

- [1] AbuQdais, H.A., Hamoda, M.F., Newham, J. (1997). Analysis of residential waste at generation sites. *Waste management and Research* 15(4) 395-406
- [2] Akamine, T. Suda, M., 2011. The Growth Rates of Population Projection Matrices in Random Environments. *Aqua-BioScience Monographs* Vol. 4 (3) 95-104
- [3] Alberts SC, Altmann J. 2003. Matrix models for primate life history analysis. In: Kappeler PM, Pereira ME, editors. *Primate life histories and socioecology*. Chicago: University of Chicago Press. p 66–102.
- [4] Benitez, S.O, Lozaro-Olvera. G, Morelos, R.A, de Vega, C.A., 2008. Mathematical Modelling to predict residential solid waste generation. *Waste Management* 28, S7-S13
- [5] Biegl, P., Lebersorger, S., Salhofer, S., 2008. Modelling Solid Waste generation: a review. *Waste Management* 28, 200-214
- [6] Carslake, D., Townley, S., Hodson, D.J., 2008. Nonlinearity in Eigen-value perturbation curves of simulated population projection matrices. *Theoretical Population Biology* 73 498-505
- [7] Caswell, H. (2001). *Matrix population models: Construction, analysis, and interpretation*. Second edition. Sunderland, Massachusetts, USA: Sinauer Associates.
- [8] Christiansen, K.M and Fischer, C (1999). Baseline projections of selected waste streams: developments of a methodology. European Environmental Agency, Technical Report No. 28, Copenhagen, Denmark.
- [9] Coulson, T., Tuljapurkar, S., Childs, D.Z., 2010. Using evolutionary demography to link life history theory, quantitative genetics and population ecology. *Journal of Animal Biology*, 79 1226-1240
- [10] Crouse D.T., Crowder, L.B., Caswell, H., 1987. A stage-based Population Model for Loggerhead Sea Turtles and Implications for Conservation. *Ecology* 68(5) 1412-1423
- [11] Daskalopoulos, E., Badr, O., Probert, S.D. (1998). Municipal solid waste: a prediction methodology for the generation rate and composition in the European Union countries and the United States of America. *Resources, Conservation and Recycling* 24(1), 155-166

- [12] Denison, G.J., Dodd, V.A., Whelan, B. (1996a). A socioeconomic based survey of household waste characteristics in the City of Dublin, Ireland, I. Waste Composition. *Resources, Conservation and Recycling* 17(3), 227-244
- [13] Dyson, B., Chang, N.B., 2005. Forecasting municipal solid waste generation in a fast growing-urban region with system dynamics modelling. *Waste management* 25(7) 669-679
- [14] Eleyan, D., Al-Khatib, I.A, Garfield, J., 2013. System dynamics model for hospital waste characterization and generation in developing countries; 31(10) 986–995
- [15] Godfray, H.C.J and Rees, M., 2002. Population growth rate: issues and an application. *Philosophical Transactions of The Royal Society Biological Sciences* 357 1307-1319.
- [16] Jonzen, N., Pople, T., Knape, K., Skjold., 2010. Stochastic demography and population dynamics in the red kangaroo *Macropus rufus*. *Journal of Animal Biology* 79 109-116
- [17] Kajin, M., Almeida, P.J.A.L., Viera, M.V., Cerqueira, R., 2012. The State of the Art of Population Models: From Leslie Matrix to Evolutionary Demography. *Oecologia Australis* 16(1) 13-22
- [18] Leao, S., Bishop, I., Evans, D., (2001). Assessing the demand of solid waste disposal in urban region by urban dynamics modelling in a gis environment. *Resource, Conservation and Recycling* 33 (4), 289-313.
- [19] Leftkovich. A., 1965. The study of Population Growth in Organisms Grouped by Stages. *Biometrics*, 21 1-18.
- [20] Leslie, P.H., 1945. On the use of Matrices in Certain Population Mathematics, *Biometrika* Volume XXXIII, pp. 183-212
- [21] Lo, N.C.H., Smith, P.E., Butler, J.L., 1995. Population Growth of northern anchovy and Pacific sardine using stage-specific matrix models. *Marine Ecology Progress series* vol. 127 15-26
- [22] Najm, M.A., El-Fadel, M., 2004. Computer-based interface for integrated solid waste management optimisation model. *Environmental Modelling and Software* 19, 1151-1164 National Solid Waste Association of India, 2008. *Urban Waste Management Newsletter*.
- [23] Senzige *et al.*, 2014. Computational Dynamics of Solid Waste Generation and Treatment in the Presence of Population Growth. *Asian Journal of Mathematics and Applications*. Volume 2014, Article ID ama0145, 14 pages
- [24] Shea, K. And Kelly, D., 1998. Estimating Biocontrol Agent Impact with Matrix Models: *Carduus Nutans* in New Zealand. *Ecological Applications* 8(3) 824-832
- [25] Skovgaard, M., Moll, S., Andersen, F.M, Larsen, H., (2005). Outlook for waste and material flows:L baseline and alternative scenarios. Working paper 1. European Topic Centre on Resource and Waste Management, Copenhagen, Denmark.
- [26] Tuljapurkar, S., 2010. Environmental variance, population growth and evolution. *Journal of Animal Ecology*. 79 1-3