

Inter-individual variation in lifetime accumulation of income,
consumption, and transfers in aging countries*

Hal Caswell
Institute for Biodiversity and Ecosystem Dynamics
University of Amsterdam
and
Biology Department
Woods Hole Oceanographic Institution

Fanny Annemarie Kluge
Max Planck Institute for Demographic Research
18057 Rostock, Germany

September 25, 2013

*

1 Introduction

2 Among the many events that characterize individuals of different ages as they progress through
3 the life cycle are economic events, including the receipt of income, and the consumption of goods
4 and services. These economic events represent transfers between different groups within society, or
5 among individuals of different generations. Against the background of population aging in most
6 industrialized countries studies on this topic are numerous. They are based on the idea that an
7 individual has some level of income, consumption, and deficit (the difference between income and
8 consumption), and that aggregated over a population, these generate transfers of resources among
9 age classes (Lee, 1994; Lee et al., 2006; Lee and Mason, 2011).

10 National Transfer Accounts (NTAs)¹ are collections of data that report important economic
11 variables by age. Using these data, it is possible to picture the economic life cycle of individuals
12 and to study, e.g., the impact of changes in the age structure on the economy. Studies of these
13 transfers typically report labor income and consumption for a representative individual by age.
14 They often determine those periods in which labor income is insufficient to finance an individual's
15 consumption (i.e., periods of dependency), and how those periods are changed by public and private
16 transfers or asset-based reallocations (e.g. Lee and Mason (2011)).

17 Periods of dependency are generally longer than the periods of surplus production in developed
18 countries. In welfare states like Germany, with high public transfers to the dependent young and
19 elderly through education or pension programs, labor income exceeds consumption for only 30
20 years while life expectancy equals 80 years on average. The NTA approach has lately started
21 to incorporate differences by gender for some countries, but it still masks heterogeneity among
22 individuals by region, or due to socio-economic status or educational attainment. This is especially
23 important as the costs of an aging society also depend on the decomposition of the population. One
24 important example is educational attainment that might alter consumption and income patterns on
25 the macroeconomic level in case lower and higher educated individuals have very different budget
26 constraints or preferences and the ratio of the subgroups changes over time.

27 In this paper, we present a perspective that examines two new aspects of economic transfers.

- 28 • First, we will use the trajectories of age-specific income, consumption, and deficit to compute

¹For more details see www.ntaccounts.org.

individual lifetime accumulations of these quantities. This calculation integrates the trajectories of age-specific quantities with the mortality schedule. The lifetime accumulation of, say, income, for an individual of age x depends not only on the income received at each age from age x onward, but also on the mortality risks to which the individual is exposed from age x onward. These lifetime accumulations do not seem to have been given a name. They are directly analogous to indices such as the net reproductive rate R_0 or the total fertility rate TFR, which measure accumulated reproduction over a lifetime (with, or without, accounting for mortality, respectively).

- Second, we recognize that the lifetime accumulation is a random variable, and so we will go beyond the mean accumulation to focus on variation among individuals. Two identical individuals, experiencing identical mortality risks and receiving income from the same age-specific distributions, will differ in their lifetime accumulation because of the random outcome of those processes. Such variability is called *individual stochasticity* (Caswell 2009). To quantify individual stochasticity, we will calculate the variance, standard deviation, coefficient of variation, and skewness of lifetime accumulated transfers.

Analysis based solely on expected values provides no information on the risks associated with variable outcomes. Knowing the mean lifetime income or consumption does not reveal how variable that accumulation will be among members of a cohort, and hence says nothing about how common unusually high or unusually low values will be among members of a cohort. Skewness (the standardized third moment about the mean) provides extra information beyond variance; positive skewness implies a distribution with a long positive tail, and negative skewness implies the opposite. The approach we will introduce provides, if desired, all the moments of remaining lifetime accumulation, so kurtosis and other functions of the higher moments could also be calculated (Caswell 2011).

Individual stochasticity is not the same as, nor does it imply, heterogeneity among individuals. Empirical measurement of the variation in accumulated rewards will reflect both individual stochasticity and heterogeneity; one of the values of our approach is the potential to separate the two sources of variation (Caswell 2011).

2 Data and Methods

For our analyses, we use National Transfer Account estimates for Germany. National Transfer Accounts are usually used to provide information about the impact of institutional settings on the economic life cycle of individuals in a given country. The data include consumption, income, public and private transfers, and asset-based reallocations. The detailed estimates, by single years of age, are very important to quantify transfers between generations and the impact of population aging for example. The results are based on the German Income and Expenditure Survey (Einkommens- und Verbrauchsstichprobe, or EVS) of 1978, 1993, and 2003. The EVS has been conducted by the Federal Statistical Office since 1978 at five year intervals, and is based on a representative quota sample of Germany’s private households.

We analyze lifetime accumulated rewards using the approach introduced to demography by Caswell (2011) in the context of reproductive output. This is based on the mathematical framework of *Markov chains with rewards* (MCWR), introduced by Howard (1960) in the context of dynamic programming and greatly extended since (Benito, 1982; Sobel, 1982; Puterman, 1994; Sladký and van Dijk, 2005). The idea is simple but powerful: an individual moves among states according to a finite-state Markov chain. In our case, the states consist of age classes, plus an absorbing state representing death. The probability of transition from age class i to age class $i + 1$ is the survival probability p_i , and the probability of transition from age class i to death is $q_i = 1 - p_i$. At each transition until absorption, the individual accumulates a “reward,” which is itself a random variable. Caswell (2011) shows how to compute all the moments of the lifetime accumulation of this reward. We analyze income, consumption, and deficit (income - consumption) as rewards, and calculate the mean, standard deviation, coefficient of variation, and skewness of lifetime rewards remaining at each age.

3 Applications

Education is well known to effect levels of income (Miller, 1960; Becker and Chiswick, 1966; Hause, 1975) as does occupation (Wilkinson, 1966). Lifetime earnings also play an important role in the area of intergenerational mobility (Dunn, 2007). We expect that it may also influence the variability in lifetime accumulated income. To explore this, we analyze data from the Income and Expenditure

84 Survey 2003. We estimate the labor income for individuals with high, medium and low educational
 85 attainment. We grouped individuals without completed degree in the low education category. All
 86 individuals having attained university or *Fachhochschule* fall in the high education category. The
 87 remaining are grouped into medium education. Figure 1 shows first results of the mean, standard
 88 deviation, CV, and skewness of age-specific income for the low, medium, and high education level
 89 categories. As expected, mean income is ordered from low to high income. The standard deviation
 90 follows the same pattern, but the CV is very similar for all three groups. Figure 2 shows the
 91 statistics of lifetime accumulation. The mean remaining lifetime income shows a similar pattern
 92 for all three education groups. The standard deviation falls with age, and the CV combines the
 93 mean and standard deviation into a pattern that differs little among education groups.

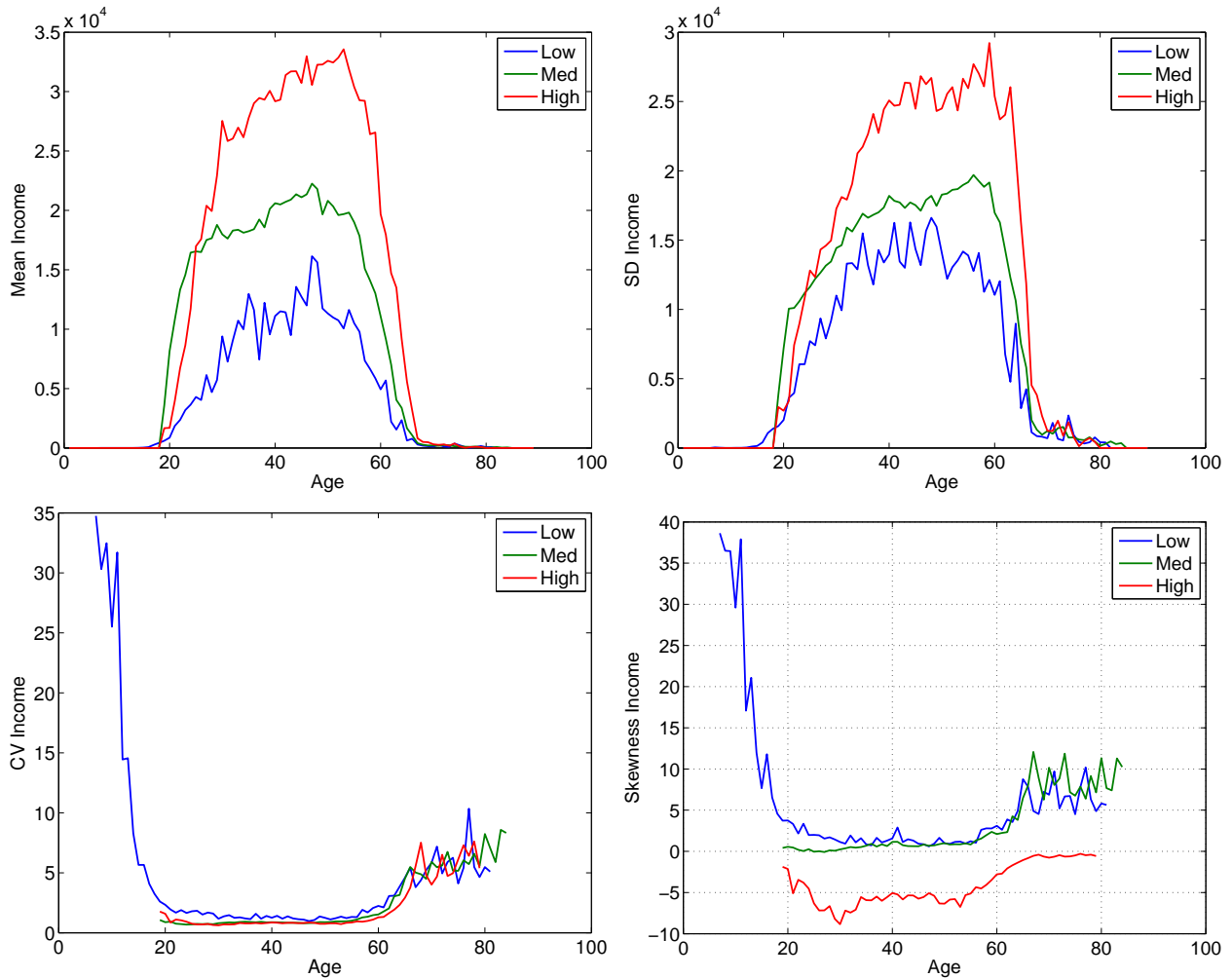


Figure 1: Statistics of the age schedule of income for low, medium, and high educational levels.

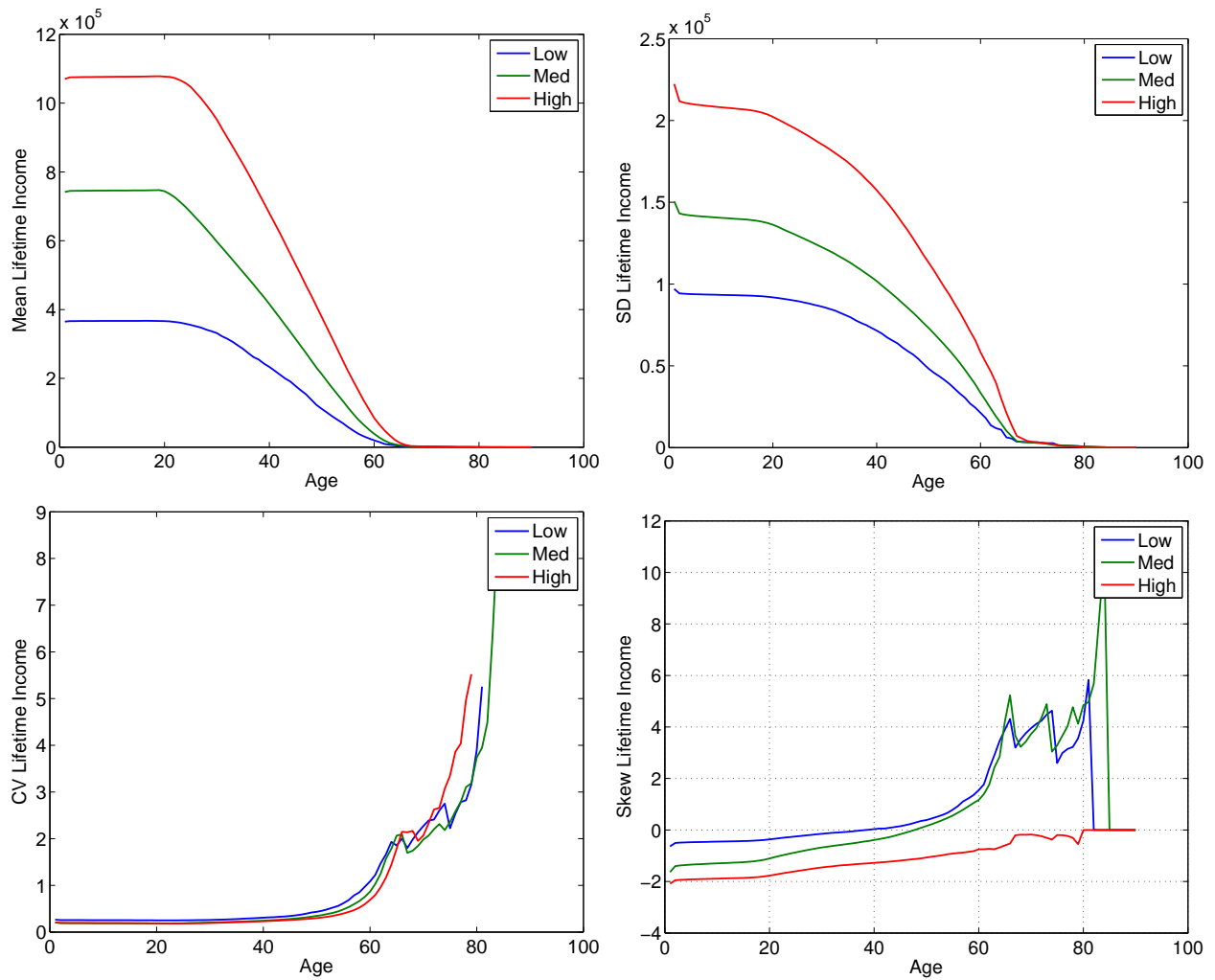


Figure 2: Statistics of lifetime accumulation of income for low, medium, and high educational levels.

94 In addition to the effects of education, we would like to estimate regional variations, income
95 variation across time as well as corresponding consumption and deficit schedules. Furthermore, we
96 will show the impact of the mortality schedule on the expected results.

97 **4 Discussion**

98 This study is an important step to estimate differences in key economic variables for individuals that
99 belong to different population subgroups, facing alternative mortality schedules or simply realize
100 other outcomes due to individual stochasticity (luck or decisions made that impact your expected
101 stream of income). We will show how income varies between different socio-economic groups and
102 regions and how this affects their expected lifetime accumulation of economic variables. We will
103 furthermore show the importance of the mortality schedule for our results. Against the background
104 of population aging, a decomposition of results for individuals having different characteristics is
105 very important. The study adds individual stochasticity and lifetime estimates to the valuable
106 results of National Transfer Accounts.

References

- 107
- 108 Becker, G. and Chiswick, B. (1966). Education and the distribution of earnings. *The American*
109 *Economic Review*, pages 358–369.
- 110 Benito, F. (1982). Calculating the variance in markov-processes with random reward. *Trabajos de*
111 *estadística y de investigación operativa*, 33(3):73–85.
- 112 Dunn, C. (2007). The intergenerational transmission of lifetime earnings: Evidence from brazil.
113 *The BE Journal of Economic Analysis & Policy*, 7(2).
- 114 Hause, J. (1975). Ability and schooling as determinants of lifetime earnings, or if you’re so smart,
115 why aren’t you rich? In *Education, Income, and Human Behavior*, pages 123–150. NBER.
- 116 Lee, R. (1994). The Formal Demography of Population Aging, Transfers, and the Economic Life
117 Cycle. In Martin, L. G. and Preston, S. H., editors, *Demography of Aging*, pages 8–49. National
118 Academy Press Washington, DC 1994.
- 119 Lee, R., Lee, S., and Mason, A. (2006). Charting the Economic Life Cycle. In A. Prskawetz, D.
120 E. B. and Lutz., W., editors, *Population Aging, Human Capital Accumulation, and Productivity*
121 *Growth*, pages 208–237. Population and Development Review, New York, Population Council.
- 122 Lee, R. and Mason, A. (2011). *Population aging and the generational economy: a global perspective*.
123 Edward Elgar Pub.
- 124 Miller, H. (1960). Annual and lifetime income in relation to education: 1939-1959. *The American*
125 *Economic Review*, 50(5):962–986.
- 126 Puterman, M. L. (1994). Markov decision processes: Discrete dynamic stochastic programming.
- 127 Sladkỳ, K. and van Dijk, N. M. (2005). Total reward variance in discrete and continuous time
128 markov chains. In *Operations Research Proceedings 2004*, pages 319–326. Springer.
- 129 Sobel, M. J. (1982). The variance of discounted markov decision processes. *Journal of Applied*
130 *Probability*, pages 794–802.

131 Wilkinson, B. (1966). Present values of lifetime earnings for different occupations. *The Journal of*
132 *Political Economy*, 74(6):556–572.