Output Multiplier Analysis

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Chapter 1

Multiplier Analysis

1.1 Introduction

Input-Output (IO) multipliers are used widely in order to simulate shocks on an economy. The notion of multiplier modeling rests on the assumption that there is an output response first to meet the demand shock. Second, there are other observable changes in the economy's output and these are assumed to be the multipliers (see Section ?? for a more detailed treatment of these changes) (Miller & Blair, 2009). Multipliers are thus used to measure how a change in something exogenous to the model affects the economy (Miller & Blair, 2009).

Most commonly demand shocks are modelled using IO Type I and Type II multipliers. However, there is no set method as to how these multipliers are derived. This paper analyses common methods of Type II output multipliers for the Scottish economy ¹. The aim is to establish which method offers the best fit for multiplier modelling. Four methods are used for this study. Two of these methods use pure IO data and can be computed with the data available in an IO dataset alone. The other two methods use more comprehensive data for the endogenising of the Household sector.

In order to determine the best fitting Type II output multiplier for the Scottish economy, the methods presented in this paper need to be compared to a standard. The most appropriate benchmark for testing the fit of the Type II multipliers is assumed to be the SAM output multiplier. The 2009 Scottish SAM (Emonts-Holley et al., 2014) offers the most complete dataset for the Scottish economy for that year. The output multiplier derived from

¹Note that the findings of this paper are transferable to the discussion of other types of multipliers, e.g. income or employment multipliers.

that dataset therefore provides the best fit for multiplier modelling. Thus, if a Type II output multiplier is to be used and not a SAM output multiplier it is advisable to chose the best fitting Type II benchmarked against the SAM multiplier.

The Type I, the Type II and the SAM output multiplier are extensions of each other. All use an IO Table as the main dataset for the derivation of the multipliers. The data used in this paper is derived from the 2009 Scottish Industry-by-Industry (IxI) Input-Output Tables and the 2009 Scottish SAM (Emonts-Holley et al., 2014) as well as from the Scottish National Accounts Project (SNAP) (Scottish Government, 2013b).

This paper finds that the use of more comprehensive data for the endogenising of the Household sector results in a closer fit of the Type II in comparison to the SAM output multiplier. However, data availability might limit the computation of the more comprehensive Type II output multiplier.

This paper is structured as follows. The second Section describes the data used for the calculation of the Type I, the Type II and the SAM multipliers. The third Section outlines the computation and interpretation of the Type I, the Type II and the SAM multipliers, respectively. The fourth Section outlines four common methods used for the derivation of Type II output multipliers for the Scottish economy. The fifth Section analyses the derived multipliers and the sixth Section concludes.

1.2 Data

The main data source for the Type I, the Type II and the SAM output multiplier in this paper are the 2009 Scottish IxI Tables (Scottish Government, 2013a). Secondly, the 2009 Scottish SAM is used both for the computation of one of the Type II methods studied in this paper (see Section 1.4.3) as well as for the derivation of the SAM output multiplier (see Section 1.3.3). Lastly the figure for "Total household income from all sources" from SNAP is used for endogenising the Household sector in one of the methods discussed in this paper (see Section 1.4.4). This section presents the data sources outlined above in the same order below.

1.2.1 2009 Scottish Ixl Tables

Input-Output (IO) Tables provide a snapshot of an economy for a given year. They present macro-economic aggregates and their sectoral disaggregation. IO Tables show payments to factors of production (wages and OVA) as well as information on institutional accounts (i.e. households, government and corporations). The IxI Tables used here are for the calendar year 2009 and they are also the basis for the 2009 Scottish SAM (see Section 1.2.2). The IxI Tables show the destination of industry output, for example primary manufacturing products. The columns of the IxI Table show purchases made by industries and final demand from each Scottish industry's output arising from both principal production and intermediate demand. Conversely, the rows provide a breakdown of industry receipts by origin.

The data contained in the IxI Tables enables the computation of Type I output multipliers (see Section 1.3.1). Further, the data in these IO Tables is sufficient to calculate two of the Type II multiplier methods discussed below (see Section 1.4.1 and 1.4.2). Note that the data contained in the 2009 Scottish IxI Tables is for mainland activities only. Thus the multiplier analysis below is restricted to that geographic area of economic activity in Scotland.

1.2.2 2009 Scottish SAM

The SAM can be considered as extended IO Tables. As well as the information outlined above (see Section 1.2.1), a SAM also records the distribution and redistribution of income.

The focus of a SAM therefore lies in recording interrelationships at the meso-level with emphasis on distributive aspects (Keuning & Ruuter, 1988). It is concerned with the systematic organisation of information about the economic and social structure of a country, region, or city, in a particular time period - usually a year (King, 1981).

In contrast to IO tables, the SAM records flows from producing sectors to factors of production and then on to institutional accounts and finally back to the demand for goods (Adelman & Robinson, 1986). That is, IO tables show payments to factors of production (wages and OVA) but do not show subsequent flows to institutions. As such, a SAM is different from an IO table in that it contains complete information on institutional accounts (i.e. households, government and corporations), instead of solely tracing income and expenditure flows associated with the production of commodities (Breisinger et al., 2010).

This paper makes the assumption that the comprehensive information contained in a SAM provides the basis for robust output multiplier computations. Therefore, the 2009 Scottish SAM is used to construct SAM output multipliers, which are used as benchmarks for the analysis of the methods discussed in Section 1.1.

1.2.3 **SNAP**

SNAP is a quarterly publication by the Scottish Government aimed at offering a single data source on broad economic indicators. Currently it provides data on, inter alia, measures of GDP and Gross Disposable Household Income. The latter is of interest to this paper as it provides the "Total household income from all sources" used for the endogenising of the Household sector for one of the methods presented below (see Section 1.4).

1.3 Output Multiplier

IO Tables and SAMs allow for the computation for various types of multipliers, including income, employment and output multipliers. The focus here is on the latter. This is because, first, the output multiplier is calculated most directly. Second, it enables an extension of the discussion to other types of multipliers and their derivations. For example, different Type II computations of the income and of the employment multiplier can be analysed following the framework presented in this paper.

Three types of output multipliers are described below, starting with the simplest case the Type I. Next, the Type II output multiplier is outlined, which is the structure of the different kind of multipliers discussed in Section 1.4. Last, the SAM output multiplier is discussed, which is the benchmark multiplier used for the analysis in Section 1.5.

1.3.1 Type I Output Multiplier

The Type I output multiplier also known as the simple output multiplier enables the estimation of knock-on effects throughout the Scottish economy of a change in final demand (Miller & Blair, 2009). The data used for this multiplier are the inter-industry linkages in the IxI Tables. That is the matrix made up of only the rows and columns of the Interindustry flows (see Figure 1.3.1 below) ².

Calculation

The first step in deriving Input-Output (IO) multipliers is to construct the technical coefficient matrix, also referred to as the A-matrix. This matrix is calculated by dividing each entry of the inter-industry flows of the IO Tables by the relevant column total, i.e. the total expenditure in each sector (Miller & Blair, 2009). Following the calculation outlined below, the Leontief Inverse is calculated. The column-sums of which are the output multiplier for each sector (see Figure 1.3.1).

Below is a brief outline of how the A-matrix of technical coefficients and the Leontief

²Note, the IxI and SAM Tables used for the multiplier calculations omit industries 7 (Oil & gas extraction, metal ores) as well as 20 (Tobacco) as there are no data entries for either industry in the 2009 Scottish IxI Tables. Thus the total number of industries used here is 102, rather than the full 104 industries (under SIC 2007 code).

Inverse is derived. Note that the derivation of the a-coefficients is the same for the different types of multipliers discussed in this section as well as for the types in Section 1.4.

First, the individual column entries of the inter-industry flows from the IO Tables are divided by the relevant column total. For example, the first sector in the 2009 Scottish Ixl Tables is Agriculture (Scottish Government, 2013a). The figure for the inter-industry flow from Agriculture to Agriculture is £339m and the column total ("Total output at basic prices") for Agriculture is £2,584.3m. This results in the technical coefficient being estimated at 0.131 (this figure corresponds to the a_{11} in Equation 1.3.1). Note that the *A*-matrix below is also labelled as A_{II} . The capital i's here are for the industry-by-industry coefficients.

$$A = \begin{pmatrix} a_{1,1} & \cdots & a_{1,j} \\ \vdots & \ddots & \vdots \\ a_{i,1} & \cdots & a_{i,j} \end{pmatrix}$$
 (1.3.1)

The next step in order to be able to calculate the Leontief Inverse, is to construct the I-A-matrix (see Equation 1.3.4). This matrix simply uses an identity matrix (see Equation 1.3.2) and subtracts the A-matrix (Equation 1.3.1) from it. The resultant matrix from this calculation has positive values on the diagonal (i.e. the inter-industry flow entries for the individual sectors between themselves). All other entries are negative. Following the example above, the identity matrix gives the value 1 for the Agriculture-Agriculture entry. This is then subtracted by the technical coefficient a_{11} at 0.131. The (I-A)-matrix entry (corresponding to $1-a_{11}$ in Equation 1.3.4) is calculated at 0.869.

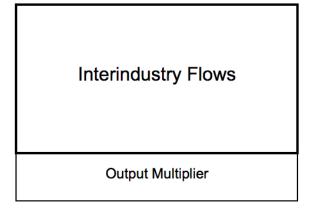


Figure 1.3.1: Type I Output Multiplier

$$I = \begin{pmatrix} 1 & \cdots & 0 \\ \vdots & \ddots & \vdots \\ 0 & \cdots & 1 \end{pmatrix} \tag{1.3.2}$$

$$I - A = \begin{pmatrix} 1 - a_{1,1} & \cdots & 0 - a_{1,j} \\ \vdots & \ddots & \vdots \\ 0 - a_{i,1} & \cdots & 1 - a_{i,j} \end{pmatrix}$$
 (1.3.3)

The last step for the calculation of the Leontief Inverse is inverting the I-A-matrix, thus deriving $L = (I - A)^{(-1)}$ (see Equation 1.3.4). The value for the Agriculture-Agriculture entry for the Leontief Inverse is calculated at 1.156 for the Type I output multiplier.

$$L = (I - A)^{-1} = Inverse \begin{pmatrix} 1 - a_{1,1} & \cdots & 0 - a_{1,j} \\ \vdots & \ddots & \vdots \\ 0 - a_{i,1} & \cdots & 1 - a_{i,j} \end{pmatrix}$$
(1.3.4)

The total output multiplier for the Agriculture sector is computed at 1.608 (see Appendix A, 1.7.1).

Interpretation

The Type I output multiplier (as outlined above) gives the total value of production for all sectors required to satisfy a £1m increase in one sector. The Type I provides two distinct output effects. First, the direct effect shows the increase in production needed in sector i to satisfy the initial increase in final demand of £1m in sector i's output. Second, the indirect effect gives the increase in output that is generated following the direct effect demand response.

For example, if the final demand of the agriculture sector increases by £1m then the direct effect is a £1m increase in the Agriculture sector output (to satisfy the increase in final demand). The indirect effect is the additional output response by all other sectors, including the agriculture sector, to the initial shock. This second effect highlights the interdependencies of the various sectors in order to satisfy a final demand increase in one sector.

1.3.2 Type II Output Multiplier

The Type II output multiplier extends the analysis of the Type I to include households endogenously in the model. The Interindustry flows are supplemented with data on wages and household expenditure. As a result, following a simulated demand shock to the economy, a third effect, the induced effect is also observed.

Calculation

The Type II output multiplier allows for a more detailed analysis of a demand shock of the economy due to households being endogenised. Essentially, the household sector is being treated as an additional sector to the model. Figure 1.3.2visualizes the addition to the multiplier calculation. In comparison to Figure 1.3.1 (see Section 1.3.1), the data on the interindustry flows are supplemented by data on wages (Income from Employment row) and data on household expenditure (Households column) in Figure 1.3.2. Note, however, that the calculated entries of the Leontief Inverse matrix for the Income from Employment row are not added to the sum for the output multiplier. Adding the entries of the Income from Employment row results in the Gross Value Added (GVA) multiplier. According to Miller and Blair (2009, p.248) the Type II shown in Appendix A, 1.7.1 are the truncated output multiplier.

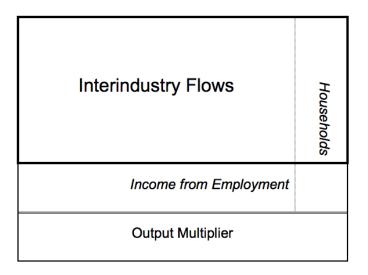


Figure 1.3.2: Type I Output Multiplier

The data used for the additional (Income from Employment) row for the Type II output multiplier (see Figure 1.3.2), are wages. The IxI Tables give the "Compensation of Em-

ployees" for wages received. The corresponding total by which this row is divided in order to derive the *A*-matrix entry for the Income from Employment row is the same as for the Interindustry flows. That is each sector's column total, the "Total Output at basic prices".

The second part for endogenising the Household sector is shown as the Households column in Figure 1.3.2. The cells used for this from the IxI Tables are the Household sectors "Final Consumption Expenditure". Note that this data is used in all the methods discussed in Section 1.4. The total used for the division of the Household cells for the A-matrix differs, however. Assessing which of these totals provides the best fit in comparison with the SAM multiplier is the motivation of this paper. For the purpose of illustration this paper uses the total from the Miller and Blair Miller and Blair (2009) method (see Section 1.4.1). The total here for deriving the *a*-coefficients for the Household sector is the "Total Intermediate Demand" of the "Compensation of employees" row at £63,560.9m (Scottish Government, 2013a).

Following the computation of the matrix of technical coefficients outlined above, the Leontief Inverse is computed. The method here is the same as for the Type I output multiplier in Section 1.3.1 (Equation 1.3.2 to 1.3.4). The Leontief Inverse for the Type II is shown in Equation 1.3.5.

$$L = (I - A)^{-1} = Inverse \begin{pmatrix} A_{II} & A_{IH} \\ A_{HI} & A_{HH} \end{pmatrix}$$
 (1.3.5)

Equation 1.3.5 shows that the Leontief Inverse for the Type II multiplier now consists of additional technical coefficient entries in contrast to Equation 1.3.4. These additions reflect the endogenised Household sector. A_{II} is the technical coefficient matrix for the interindustry flows equal to Equation 1.3.1. A_{IH} is the amount of industry output required to satisfy Household demand. A_{HI} is the amount of industry required per unit of total household income. A_{HH} is household expenditure per unit of exogenous household income (Scottish Government, 2013a).

The computed value for the Agriculture-Agriculture entry for the Leontief Inverse differs to that of the Type I (see Section 1.3.1). The Type I value is 1.156 and that for the Type II is

1.163 ³. The Type II output multiplier is also bigger, as it is now 1.963, compared to 1.608 for the Type I. The following Section discusses the increase in multiplier value from Type I to Type II.

Interpretation

As noted above, the Type II output multiplier ⁴ is larger than that of the Type I. This is due to the fact that the Type II multiplier models both the direct and indirect effects (like the Type I) as well as the induced effect. The induced effect results from the endogenising of the Household sector, as outlined in the Section above (see Section 1.3.2).

Section 1.3.2)above outlined the direct effect and the indirect effect a demand shock of £1m in one sector. The induced effect observed in the Type II output multiplier results from additional household expenditure. The demand shock results in an output response throughout the economy (the direct- and indirect effects). It is assumed that the increase in output also has a positive effect on wages. Due to higher wages the Household sector increases expenditure and this is the induced effect.

Comparing the value of a Type I and a Type II output multiplier allows for the observation of the size of the induced effect. Following on from the example above, the Type II output multiplier (using the Miller and Blair Miller and Blair (2009) method introduced in Section 1.4.1) below) is bigger by 0.355 ⁵. Thus the initial £1m demand shock results in a multiplier effect in household expenditure of £355,000. Note that the size of the induced effect differs depending on which method of the Type II output multiplier is used.

1.3.3 SAM Output Mulltiplier

The SAM output multiplier offers the most inclusive study of the multipliers discussed in this Section. As well as endogenising the Household sector, the SAM output multiplier also endogenises the Corporate sector. It uses a more comprehensive dataset and thus relies on more assumptions than the Type I or Type II output multiplier. Also note that the SAM output multiplier can only be computed in the presence of a suitable SAM.

³Note that this value differs depending on which method of the Type II output multiplier is used (see Section 1.3.1).

⁴The Miller and Blair Miller and Blair (2009) method is used here for illustrative purposes (see Section 1.4.1).

⁵The Type I output multiplier for Agriculture is computed at 1.608 and the Miller and Blair Miller and Blair (2009) Type II one at 1.963.

Calculation

The basic calculation of the SAM output multiplier is very similar to the one outlined for the Type II in the Section above (see Section 1.3.2). Figure 1.3.3) shows which elements need to be added to the computation of the SAM output multiplier in order to endogenise the Corporate sector as well as the Household sector.

Interindustry Flows	Households	Employment Income	Other Value Added	Net Commodity Tax	Corporate
Households					
Income from Employment					
Other Value Added					
Taxes on Expenditure					
Corporate					
Output Multipli	er				

Figure 1.3.3: Type I Output Multiplier

Equation 1.3.6 shows the Leontief Inverse of the SAM output multiplier. The interindustry matrix of technical coefficients is the A_{II} in Equation 1.3.6. The other data used for endogenising the Corporate Sector as well as the Household sector are shown as the additional row and column entries in Equation 1.3.6. The interpretation of these vectors is equivalent to the added entries in Equation 1.3.5 (see Section 1.3.2).

$$L = (I - A)^{-1} = Inverse \begin{pmatrix} A_{II} & \cdots & A_{IC} \\ \vdots & \ddots & \vdots \\ A_{CI} & \cdots & A_{CC} \end{pmatrix}$$
(1.3.6)

Note that the rows shown below the interindustry flows in Figure 1.3.3 are also not added to the multiplier figure (see Section 1.3.2 for comparison).

Interpretation

The interpretation of the SAM output multiplier follows along that of the Type II in Section 1.3.2. The SAM multiplier computed here treats the Household- and the Corporate sector as endogenous.

... more

1.4 Four Type II Methods

The previous Section outlined how the Type I, the Type II and the SAM output multiplier are computed. This basic structure for the derivation of these multipliers is used throughout the literature REF ⁶. However, there are variations in what totals should be used for endogenising the Household sector in the Type II output multiplier as outlined in Section ??.

This Section outlines four methods used for the computation of the Type II output multiplier for Scotland. Section 5 analyses the results and compares the multipliers with each other. A benchmark value is needed in order to compare the different Type II multiplier methods. For this, it is assumed that the most complete set of accounts for the flow of goods and services in Scotland are given in a 2009 SAM for Scotland (Emonts-Holley et al., 2014). Thus, the SAM output multiplier is calculated and used as a benchmark ⁷. The inter-industry flows as well as the Income from Employment and Household entries are the same for the IO and the SAM multiplier calculations. The variation of the multiplier values for the methods outlined below is due in part to the different Totals used for endogenising the Household sector. Thus the assumption is that the Totals closest in value to the Total used in the SAM multiplier calculations will derive the closest fitting multipliers.

1.4.1 Miller and Blair

The first method analysed here originates from Miller and Blair (2009), who use the total of the "Compensation of Employee" as the denominator for the technical coefficients of the Household sector ⁸. The corresponding value of this entry in the 2009 Scottish Ixl Table is £63,561m (Scottish Government, 2013a).

1.4.2 Ixl Household Expenditure Total

The second method uses the "Total Intermediate Consumption at basic prices" of "House-holdsåĂŹ Final Consumption Expenditure". This value is also given in the Ixl Table and amounts to £65,421m (Scottish Government, 2013a).

⁶Additionally, there are various extensions for the Type II multiplier in particular REF, but this paper is concerned with the standard derivation of the Type II output multiplier.

⁷Note that a SAM multiplier automatically includes the Income from Employment and Household coefficients and thus is suitable to be used for a benchmark of the IO Type II's.

⁸Note, that this is the total of the Income from Employment row used by all four approaches.

1.4.3 SAM Output Mulltiplier

The third method uses the total expenditure of the Household sector from the 2009 Scottish SAM (Emonts-Holley et al., 2014). This figure is derived by first, summing up the "Final Consumption Expenditure" of Households and "Final Consumption Expenditure" of Non-Profit Organisations Serving Households (NPISHs). Second, the Household expenditure on goods & services of the following sectors are added to the Household Total: Rest of The World, Rest of the UK, Corporate, Government and Capital. This figure amounts to £107,877m.

1.4.4 SAM Output Multiplier

The fourth method uses the combined Compensation of Employees at £63,561m from the IxI Table ⁹ (Scottish Government, 2013a) and all Unearned Income at £46,835m (Scottish Government, 2013b). The total here is £110,396m. This figure is similar in nature to the one taken from the SAM above as it incorporates additional Household income sources. This is in contrast to the pure wage figures used, for example, in the Miller and Blair (2009) method. It is also the figure used for the official Scottish Government Leontief Inverse calculations.

Following on from the assumption placed above, the method using the Scottish SAM Household Total for endogenising the Household sector ought to be closest to the values derived by the SAM output multiplier. That is, the SAM uses the same Household Total for endogenising the Household sector. Next, the Combined Household Income Total is expected be closest. Then in descending order from Household Total value, the IxI Household Expenditure Total should give the third closest Type II estimate and lastly the one derived through the Miller and Blair (2009) method. However, it is worth noting that the Scottish SAM Household Total can only be used to derive the (IO) Type II if there is an applicable SAM. Hence the question arises whether pure IO modelling would allow for the presence of this type of IO multiplier.

⁹This is the Total used in the Miller and Blair (2009) method.

1.5 Results

This Section discusses the results of the multiplier computations. First, the raw multiplier values are discussed using descriptive analysis. Second, the different Type II output multipliers are compared to the SAM output multiplier using difference statistics. Third, error computations are utilized to determine a best fit of one of the four Type II output multipliers compared to the SAM output multiplier. Fourth, the results are summarized to provide a comprehensive overview of the findings in this Section.

1.5.1 Multiplier Descriptives

Appendix A provides a full breakdown of the Type I, the Type II and the SAM output multipliers derived for 102 sectors of the 2009 Scottish IxI Tables and the 2009 Scottish SAM. This table allows for an in-depth analysis of the value of each multiplier for each sector.

Furthermore, Appendix A shows the average values for each type of output multiplier. The Type I output multiplier is the lowest on average. This is to be expected, since this multiplier is computed using only the interindustry flow data from the IxI Tables. In contrast, the two largest average multiplier values are derived using the Miller and Blair and the IxI Household Expenditure Total methods (see Sections 1.4.1 and 1.4.2). Again this is to be expected, because these two methods use smaller values for the endogenising of the Household sector ¹⁰. In comparison, the other two methods outlined in Section 1.4 (see Sections 1.4.3 and 1.4.4) use higher values for the endogenising of the Household sector

Using the SAM output multiplier as a benchmark, the average values show that the Miller and Blair as well as the Ixl Household Expenditure Total method overestimate the average output multiplier effect. In contrast, the Scottish SAM Household Total and the Combined Household Income Total method underestimate the average output multiplier effect. Note though that the average difference of the latter compared to the SAM output multiplier is smaller. Lastly, Appendix A also shows the minimum and maximum multiplier values. These values reflect the analytics from above.

¹⁰The Miller and Blair value is £63,561m, and the IxI Household Expenditure Total value is £65,421m.

¹¹The Scottish SAM Household Total value is £107,877m, the Combined Household Income Total value is £110,396m.

Table 1.5.1: Descriptives Output Multiplier

	Туре І	Miller and Blair	Scot Gov Stev	Scot Gov SAM	НН Ехр	SAM
Average	1.465	2.096	1.778	1.787	2.072	1.910
Minimum	1.000	1.214	1.182	1.183	1.212	1.321
Maximum	2.780	3.295	3.035	3.042	3.275	3.214

1.5.2 Multiplier Difference Statistics

Appendix B shows the differences between the Type II multiplier methods and the SAM benchmark. This allows for an in-depth study of which method of the multiplier is closest in value to the SAM multiplier broken down by individual sectors. This detailed analysis shows that there is not one method, which is closest in value for all sectors. For example, the first sector Agriculture shows that the Miller and Blair (Miller & Blair, 2009) method gives the closest fitting multiplier at a value of 0.001¹². For the same sector, the multiplier figure from the Combined Household Income Total shows the biggest difference at 0.180. In comparison, looking at the last sector, Households as Employers, using the SAM Household Income figure shows the smallest difference at 0.145. Here, the Miller and Blair (Miller & Blair, 2009) version gives the biggest gap compared to the SAM at -0.485 with the Household Expenditure method following close behind at -0.435. This detailed analysis offers insights into which method might be offer the closest fit for different sectors.

Note that the first two methods (Miller and Blair; IxI Household Expenditure Total) have mostly negative differences to the benchmark (see Appendix B)¹³. In contrast, the last two methods described above (Scottish SAM Household Total; Combined Household Income Total) show only positive differences. These findings seem to suggest that the first two methods overestimate the Leontief Inverse. In contrast, the last two methods underestimate the Leontief Inverse compared to the benchmark. In order to be able to analyse which

¹²This value is calculated by taking the SAM multiplier value for the Agriculture sector of 1.964 and subtracting it by the relevant Miller and Blair method multiplier, which has a value of 1.963.

¹³Whilst the majority of sectors follow the same pattern, there are five sectors that diverge. Large differences between OVA and wages in those sectors seem to cause the reversed signs.

methods are closer to the benchmark, the absolute values of the differences in Appendix B are calculated (Appendix C).

The graph in Appendix C gives the "Absolute Value Difference" ¹⁴. The horizontal axis here can be interpreted to represent the SAM multiplier value and thus the closer the lines are to this axis, the better the fit. This graph shows that the two Type II methods using the more comprehensive household figure, the Scottish SAM Household Total and the Combined Household Income Total, give the closest fit to the SAM multiplier. The graph also strongly depicts that these two methods vary less in value compared to the first two Type II methods discussed above. The Miller and Blair (Miller & Blair, 2009) method shows the overall biggest differences to the benchmark. In contrast, the Scottish SAM Household Total provides the closest fit in the graph. This confirms that endogenising the household sector using the SAM Household Total results in the closest fit.

Furthermore, Appendix C highlights that the difference between the methods varies substantially between the sectors. The methods using the Scottish SAM Household Total and the Combined Household Income Total for endogenising the Household sector show some variation compared to the benchmark. However, there are some very pronounced spikes observable in Appendix C for the Miller and Blair and the Ixl Household Expenditure Total methods. The three biggest differences are for the Education (93), Security & Investigation (89) and the Social Work (96) sectors. The multipliers for these sectors show large variation in comparison to the SAM output multiplier. These differences seem to be due to a small Gross Value Added to Total Output gap in the Ixl Tables (REF).

1.5.3 Error Computation

Table 1 shows various error-computations of the methods outlined above and the SAM benchmark. This allows for detailed measurements of the differences between the methods. The error-measurements in Table 1 are the "Average of Differences" 15, the Root Mean Squared Error (RMSE) and the Mean Absolute Error (MAE). The smallest value indicates the best fit with respect to the SAM output multiplier. All measurements show that endogenising the Household sector using the Scottish SAM Household Total figure results in the closest fit, followed by using the Combined Household Income Total figure. These two

¹⁴Absolute Value Differences - see word file

¹⁵This is the average of the differences for each sectoral multiplier derived from Appendix B.

methods do not differ much in the error values. Also note that the values in Table 1 show that the four methods can be classified into two groups. First, the methods using pure IO data and second, the methods using the more comprehensive household expenditure figures. An example is the "Average of Difference" for Miller and Blair and the Household Expenditure total are estimated at 0.186 and 0.161, respectively. The same error computation for the Household Income from the SAM is given at 0.124 and that for the Household Income Scottish Government at 0.132.

Table 1.5.2: RMSE and MAE Errors

	Miller and Blair	Scot Gov Stev	Scot Gov SAM	НН Ехр
Average of Differences	0.186	0.161	0.124	0.132
RMSE	0.156	0.138	0.093	0.099
MAE	0.101	0.089	0.065	0.070

Note: Smallest value shows closest fit to SAM multipliers

The values in Table 1 also confirm that the Miller and Blair method results in the least close fit compared to the benchmark. In comparison, endogenising household expenditure using the IxI Household expenditure total, the Household sector column Total (2nd method from the left in Table 1) results in a closer fit. For example, the RMSE for the Miller and Blair method is given at 0.156 and the RMSE for the Household Expenditure total at 0.138. Therefore these results seem to suggest that computing a Type II with figures given only in the IO Tables would result in more accurate computations using the Household Expenditure total.

The overall smallest error values are computed using the Scottish SAM Household Total. For example, is the MAE for this method is 0.065 and the next closest fit, the Combined Household Income Total, is 0.070. As noted above, the benchmark here is the SAM multiplier, due to the assumption that the 2009 Scottish SAM provides the most comprehensive single set of accounts of the Scottish economy for 2009. However, it is questionable whether pure IO modeling allows for the use of the SAM Household figure in endogenising household expenditure.

1.5.4 Summary of Results

The general finding of this paper is that using more comprehensive household expenditure totals result in the closest fit of the Type IIs in comparison to the output multiplier derived from IxI data. An explanation for this is that not all household expenditure is covered using the income from employment figures from the Miller and Blair as well as the IxI Household Expenditure Total from the IxI Tables. Unearned income is part of householdsâĂŹ budgets and thus householdsâĂŹ total funds are bigger than those provided just in the IO Tables. Using these smaller income figures (Miller and Blair and IxI Household Expenditure Total) for endogenising household expenditure for the multiplier analysis is assumed to result in an overestimated Leontief Inverse. This in turn leads to a larger induced effect than is actually observed in the economy (REF IO Guide).

The findings in Appendix C confirm that using the first two methods result in overestimated figures of the Leontief Inverse. It must be noted, however, that the two methods using the more comprehensive Household Totals result in underestimated Leontief Inverses compared to the benchmark. Yet, the latter two methods observe smaller differences compared to the benchmark.

1.6 Conclusion

This paper shows that using the Total Household Income figure from the SAM for endogenising the Household sector results in the best multiplier fit. Note though that some of the other multiplier methods discussed above show closer fits for individual sectors. The overall best fit of the SAM Household Total method is to be expected since the SAM output multiplier is used as the benchmark. It is questionable, however, whether using a SAM entry for the derivation of an IO multiplier is theoretically correct. Similarly, using the Combined Household Income Total value for endogenising the Household sector relies on the availability of a data source exogenous to the IxI Tables. This paper finds that using the IxI Total Household Expenditure Total method is the best fit if the methods using exogenous data to the IxI Tables are not used. Thus, this paper has also shown that the widely used Miller and Blair method (REF) often derives the least best fitting Type II output multipliers. Thus, using the IxI Total Household Expenditure Total figure for the derivation of a pure IO Type II results in more accurate multipliers overall.

1.7 Appendix

1.7.1 Appendix A

Output Multiplier

		Type I	Miller and Blair	Scot Gov Stev	Scot Gov SAM	НН Ехр	SAM
1	Agriculture	1.608	1.963	1.784	1.789	1.949	1.964
2	Forestry planting	1.615	2.069	1.840	1.846	2.051	1.972
3	Forestry harvesting	1.961	2.469	2.213	2.220	2.449	2.367
4	Fishing	1.611	1.962	1.785	1.790	1.949	1.933
5	Aquaculture	1.625	1.928	1.775	1.779	1.916	1.916
6	Coal & lignite	1.671	2.079	1.874	1.879	2.063	1.983
8	Other mining	1.435	1.938	1.684	1.691	1.918	1.786
9	Mining Support	1.501	1.827	1.663	1.667	1.815	1.847
10	Meat processing	1.917	2.367	2.141	2.147	2.350	2.250
11	Fish & fruit processing	1.695	2.184	1.937	1.944	2.165	2.044
12	Dairy prod., oils & fats processing	1.923	2.430	2.174	2.181	2.410	2.300
13	Grain milling & starch	1.803	2.257	2.028	2.035	2.240	2.134
14	Bakery & farinaceous	1.426	2.031	1.726	1.735	2.007	1.840
15	Other food	1.609	2.139	1.872	1.879	2.118	1.980
16	Animal feeds	1.589	2.043	1.814	1.820	2.026	1.897
17	Spirits & wines	1.299	1.738	1.516	1.523	1.721	1.694
18	Beer & malt	1.367	1.775	1.570	1.575	1.760	1.746
19	Soft Drinks	1.493	2.009	1.749	1.756	1.989	1.872
21	Textiles	1.436	2.052	1.742	1.750	2.028	1.830
22	Wearing apparel	1.465	2.174	1.817	1.826	2.147	1.907
23	Leather goods	1.497	2.082	1.787	1.795	2.060	1.890
24	Wood and wood products	1.801	2.423	2.109	2.118	2.399	2.223
25	Paper & paper products	1.662	2.163	1.911	1.918	2.144	2.010
26	Printing and recording	1.378	2.159	1.766	1.776	2.129	1.883
27	Coke, petroleum & petrochemicals	1.204	1.302	1.253	1.254	1.299	1.321
28	Paints, varnishes and inks etc	1.421	1.924	1.671	1.678	1.905	1.756
29	Cleaning & toilet preparations	1.460	2.139	1.797	1.806	2.113	1.895
30	Other chemicals	1.251	2.026	1.635	1.646	1.996	1.765
31	Inorg. chem., dyestuffs & agrochem.	1.314	1.886	1.597	1.605	1.863	1.716
32	Pharmaceuticals	1.349 1.491	1.961	1.652	1.661	1.937	1.776
33 34	Rubber & Plastic		2.199	1.843 1.895	1.852	2.172	1.948
	Cement lime & plaster	1.594	2.200 2.144		1.903	2.177	1.997
35 36	Glass, clay & stone etc Iron & Steel	1.473 1.401		1.806 1.703	1.815	2.118	1.915
36 37	Other metals & casting	1.449	2.010	1.703	1.712	1.987	1.803
	•		1.982		1.721	1.962	1.831
38 30	Fabricated metal	1.481	2.185	1.830	1.840	2.157	1.941
39 40	Computers, electronics & opticals	1.416	1.931	1.671	1.679	1.911	1.767
40 41	Electrical equipment	1.483 1.519	2.123 2.236	1.800 1.875	1.809 1.885	2.098	1.896
41 42	Machinery & equipment Motor Vehicles	1.519	2.230	1.816	1.824	2.209 2.098	1.983 1.907
74	MOTOL ACLIICICS	1.010	4.141	1.010	1.024	2.000	1.507

40		4 0 4 7	0011	4 007	4 005	0.400	
43	Other transport equipment	1.647	2.211	1.927	1.935	2.190	2.026
44	Furniture	1.574	2.223	1.896	1.905	2.198	1.999
45	Other manufacturing	1.403	2.224	1.811	1.822	2.193	1.913
46	Repair & maintenance	1.427	2.101	1.761	1.770	2.074	1.877
47	Electricity	2.053	2.375	2.213	2.217	2.363	2.345
48	Gas etc	1.260	1.519	1.389	1.392	1.509	1.482
49	Water and sewerage	1.287	1.694	1.489	1.495	1.679	1.708
50	Waste	1.493	2.135	1.811	1.820	2.110	1.941
51	Remediation & waste managem.	2.780	3.295	3.035	3.042	3.275	3.214
52	Construction - buildings	1.766	2.347	2.054	2.062	2.324	2.200
53	Construction - civil engineering	1.731	2.388	2.057	2.066	2.363	2.202
54	Construction - specialised	1.530	2.223	1.874	1.883	2.196	2.020
55	Wholesale & Retail - vehicles	1.335	2.049	1.689	1.699	2.021	1.815
56	Wholesale - excl vehicles	1.521	2.190	1.853	1.862	2.164	1.990
57	Retail - excl vehicles	1.352	2.071	1.709	1.719	2.044	1.858
58	Rail transport	1.764	2.512	2.135	2.145	2.483	2.265
59	Other land transport	1.400	1.979	1.687	1.695	1.956	1.810
60	Water transport	1.657	2.097	1.875	1.881	2.080	1.980
61	Air transport	1.467	1.881	1.672	1.678	1.865	1.792
62	Support services for transport	1.541	2.139	1.838	1.846	2.116	1.994
63	Post & courier	1.278	2.153	1.765	1.778	2.221	1.893
64	Accommodation	1.352	2.004	1.675	1.684	1.979	1.814
65		1.362		1.688	1.697	1.995	1.816
	Food & beverage services		2.020				
66	Publishing services	1.279	2.066	1.670	1.681	2.036	1.790
67	Film video & TV etc	1.454	2.045	1.747	1.755	2.022	1.869
68	Broadcasting	1.386	1.987	1.684	1.692	1.963	1.819
69	Telecommunications	1.393	2.009	1.699	1.707	1.985	1.859
70	Computer services	1.250	2.041	1.642	1.653	2.010	1.789
71	Information services	1.185	1.918	1.549	1.559	1.890	1.719
72	Financial services	1.222	1.736	1.477	1.484	1.716	1.665
73	Insurance & pensions	1.859	2.316	2.086	2.092	2.298	2.234
74	Auxiliary financial services	1.282	2.065	1.670	1.681	2.035	1.796
75	Real estate - own	1.465	1.742	1.603	1.606	1.732	1.817
76	Imputed rent	1.151	1.214	1.182	1.183	1.212	1.387
77	Real estate - fee or contract	1.503	2.139	1.818	1.827	2.114	1.971
78	Legal activities	1.241	1.998	1.617	1.627	1.969	1.781
79	Accounting & tax services	1.202	2.040	1.617	1.629	2.007	1.786
80	Head office & consulting services	1.391	2.192	1.789	1.800	2.161	1.914
81	Architectural services etc	1.437	2.171	1.801	1.811	2.142	1.953
82	Research & development	1.423	2.439	1.927	1.941	2.400	2.057
83	Advertising & market research	1.250	1.953	1.599	1.608	1.926	1.772
84	Other professional services	1.330	1.978	1.651	1.660	1.953	1.801
85	Veterinary services	1.364	2.126	1.742	1.752	2.096	1.918
86	Rental and leasing services	1.324	1.861	1.590	1.598	1.840	1.751
87	Employment services	1.301	2.261	1.778	1.791	2.224	1.918
88	Travel & related services	1.520	1.900	1.709	1.714	1.886	1.786
89	Security & investigation	1.155	2.273	1.709	1.725	2.229	1.853
90	Building & landscape services	1.388	2.248	1.815	1.826	2.215	1.964
91	Business support services	1.285	1.925	1.602	1.611	1.900	1.769
92	Public administration & defence	1.410	2.169	1.786	1.797	2.139	1.903
93	Education	1.189	2.367	1.774	1.790	2.322	1.914
				-			

94	Health	1.362	2.210	1.782	1.794	2.177	1.902
95	Residential care	1.320	2.243	1.778	1.791	2.207	1.950
96	Social work	1.236	2.388	1.807	1.823	2.343	1.959
97	Creative services	1.474	2.319	1.893	1.905	2.286	2.005
98	Cultural services	1.356	2.294	1.821	1.834	2.258	1.948
99	Gambling	1.414	1.888	1.649	1.656	1.870	1.822
100	Sports & recreation	1.407	2.253	1.826	1.838	2.220	1.950
101	Membership organisations	1.436	2.253	1.841	1.852	2.221	1.970
102	Repairs - personal and household	1.357	2.055	1.703	1.713	2.028	1.822
103	Other personal services	1.233	1.886	1.557	1.566	1.861	1.732
104	Households as employers	1.000	2.284	1.637	1.655	2.234	1.799

Table 1.7.1: Output Multiplier

1.7.2 Appendix B

Differences Type II and SAM Output Multiplier

		Diff. Miller and Blair	Diff. HH Expenditure IxI	Diff. HH Income SAM	Diff HH Income Scot Gov
1	Agriculture	0.001	0.015	0.176	0.18
2	Forestry planting	-0.097	-0.079	0.126	0.132
3	Forestry harvesting	-0.102	-0.082	0.147	0.154
4	Fishing	-0.029	-0.015	0.143	0.148
5	Aquaculture	-0.012	0	0.137	0.141
6	Coal & lignite	-0.096	-0.081	0.104	0.109
8	Other mining	-0.152	-0.132	0.095	0.102
9	Mining Support	0.02	0.033	0.18	0.185
10	Meat processing	-0.117	-0.1	0.103	0.109
11	Fish & fruit processing	-0.14	-0.121	0.1	0.107
12	Dairy products, oils & fats processing	-0.13	-0.11	0.119	0.126
13	Grain milling & starch	-0.123	-0.105	0.1	0.106
14	Bakery & farinaceous	-0.191	-0.167	0.106	0.114
15	Other food	-0.159	-0.138	0.101	0.108
16	Animal feeds	-0.147	-0.129	0.076	0.083
17	Spirits & wines	-0.043	-0.026	0.172	0.178
18	Beer & malt	-0.029	-0.014	0.171	0.176
19	Soft Drinks	-0.137	-0.117	0.116	0.123
21	Textiles	-0.222	-0.198	0.08	0.088
22	Wearing apparel	-0.267	-0.24	0.08	0.09
23	Leather goods	-0.193	-0.17	0.095	0.103
24 25	Wood and wood products	-0.2	-0.176	0.105	0.114
	Paper & paper products	-0.153	-0.134 0.245	0.092 0.107	0.099 0.118
26 27	Printing and recording Coke, petroleum & petrochemicals	-0.275 0.019	-0.245 0.022	0.107	0.118
28	Paints, varnishes and inks etc	-0.168	-0.149	0.007	0.086
29	Cleaning & toilet preparations	-0.166 -0.244	-0.149 -0.218	0.079	0.000
30	Other chemicals	-0.2 44 -0.261	-0.216	0.009	0.038
31	Inorganic chemic., dyest. &agroch.	-0.17	-0.147	0.113	0.119
32	Pharmaceuticals	-0.17	-0.147	0.111	0.113
33	Rubber & Plastic	-0.252	-0.224	0.095	0.124
34	Cement lime & plaster	-0.203	-0.18	0.094	0.103
35	Glass, clay & stone etc	-0.229	-0.203	0.054	0.100
36	Iron & Steel	-0.207	-0.183	0.091	0.100
37	Other metals & casting	-0.151	-0.13	0.031	0.118
38	Fabricated metal	-0.244	-0.217	0.101	0.110
39	Computers, electronics & opticals	-0.164	-0.144	0.089	0.096
40	Electrical equipment	-0.227	-0.202	0.087	0.095

41 Machinery & equipment -0.254 -0.226 0.098 42 Motor Vehicles -0.215 -0.191 0.083	0.108
42 Motor Vohiolog 0.015 0.101 0.000	00
42 Motor Vehicles -0.215 -0.191 0.083	0.091
43 Other transport equipment -0.185 -0.163 0.091	0.099
44 Furniture -0.224 -0.198 0.095	0.104
45 Other manufacturing -0.311 -0.28 0.091	0.102
46 Repair & maintenance -0.224 -0.198 0.106	0.115
47 Electricity -0.03 -0.018 0.128	0.132
48 Gas etc -0.037 -0.027 0.09	0.094
49 Water and sewerage 0.014 0.029 0.213	0.219
50 Waste -0.194 -0.169 0.12	0.129
51 Remediation & waste management -0.081 -0.061 0.172	0.179
52 Construction - buildings -0.147 -0.124 0.138	0.146
53 Construction - civil engineering -0.186 -0.16 0.136	0.145
54 Construction - specialised -0.203 -0.176 0.137	0.146
55 Wholesale & Retail - vehicles -0.234 -0.207 0.116	0.126
56 Wholesale - excl vehicles -0.2 -0.174 0.128	0.137
57 Retail - excl vehicles -0.213 -0.186 0.139	0.149
58 Rail transport -0.248 -0.218 0.119	0.143
59 Other land transport -0.169 -0.146 0.115	0.13
60 Water transport -0.118 -0.1 0.098	0.123
•	0.104
·	
''	0.156
63 Post & courier -0.366 -0.328 0.115	0.129
64 Accommodation -0.19 -0.165 0.129	0.138
65 Food & beverage services -0.204 -0.179 0.119	0.128
66 Publishing services -0.277 -0.246 0.109	0.12
67 Film video & TV etc -0.175 -0.152 0.114	0.122
68 Broadcasting -0.168 -0.145 0.127	0.135
69 Telecommunications -0.15 -0.126 0.152	0.161
70 Computer services -0.252 -0.222 0.136	0.147
71 Information services -0.199 -0.171 0.16	0.171
72 Financial services -0.071 -0.051 0.181	0.189
73 Insurance & pensions -0.082 -0.064 0.142	0.148
74 Auxiliary financial services -0.269 -0.239 0.114	0.125
75 Real estate - own 0.075 0.086 0.211	0.215
76 Imputed rent 0.173 0.175 0.204	0.205
77 Real estate - fee or contract -0.168 -0.143 0.144	0.153
78 Legal activities -0.217 -0.188 0.154	0.164
79 Accounting & tax services -0.253 -0.221 0.157	0.169
80 Head office & consulting services -0.278 -0.247 0.114	0.126
81 Architectural services etc -0.218 -0.19 0.141	0.152
82 Research & development -0.382 -0.342 0.116	0.13
83 Advertising & market research -0.181 -0.154 0.163	0.173
84 Other professional services -0.177 -0.152 0.141	0.15
85 Veterinary services -0.208 -0.178 0.166	0.176
86 Rental and leasing services -0.11 -0.089 0.154	0.161
87 Employment services -0.344 -0.306 0.127	0.14
88 Travel & related services -0.115 -0.1 0.072	0.077
89 Security & investigation -0.419 -0.376 0.129	0.144
	0.45
90 Building & landscape services -0.284 -0.25 0.138	0.15

92	Public administration & defence	-0.266	-0.236	0.106	0.116
93	Education	-0.454	-0.408	0.124	0.14
94	Health	-0.308	-0.275	0.108	0.12
95	Residential care	-0.293	-0.257	0.16	0.172
96	Social work	-0.429	-0.384	0.136	0.152
97	Creative services	-0.314	-0.281	0.101	0.112
98	Cultural services	-0.347	-0.31	0.113	0.126
99	Gambling	-0.066	-0.048	0.166	0.173
100	Sports & recreation	-0.303	-0.27	0.111	0.123
101	Membership organisations	-0.282	-0.251	0.118	0.13
102	Repairs - personal and household	-0.234	-0.207	0.109	0.119
103	Other personal services	-0.154	-0.129	0.166	0.175
104	Households as employers	-0.485	-0.435	0.145	0.162

Table 1.7.2: Differences Type II and SAM Output Multiplier

1.7.3 Appendix C

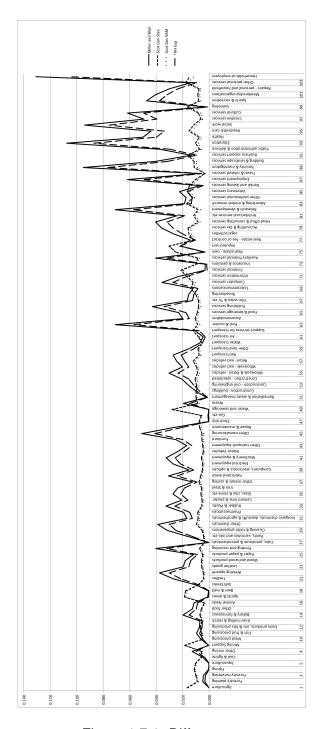


Figure 1.7.1: Differences

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