

Sustainable benchmarking of supply chains: the case of the food industry

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Long-term organisational viability and competitiveness should not be evaluated solely in terms of financial measures. Investors, policy makers and other stakeholders increasingly seek to evaluate performance with respect to sustainability – the environmental, social and economic performance of an organisation. But measuring and improving the sustainability performance of supply chains is challenging. Using one of the world's most critical supply chains, the food supply chain, we introduce and apply a multi-stage procedure to help analytically evaluate supply chains' sustainability performance. The method involves development of sustainability indicators, data collection, data transformation using rescaling and determining of importance ratings using the Analytical Hierarchy Process (AHP). The proposed methodology demonstrates how quantitative statistical data can be combined with expert opinion to construct an overall index of sustainability. Stakeholders can use the index to evaluate and guide sustainability performance of supply chains. Strengths and opportunities, as well as limitations of the methodology are discussed, and sensitivity analysis is performed.

Keywords: sustainability; supply chain management, performance measurement, analytic hierarchy process, food supply chain

1. Introduction

There is a growing desire in business and industry to expand the boundaries of performance benchmarking beyond financial parameters and demonstrate contribution towards sustainability. Corporate stakeholders increasingly demand organisations to consider and account for sustainability implications of operations beyond the organisation and across a supply chain context. Although there are notable developments in the field of sustainability benchmarking to account for lifecycle influences of products and processes, there is still considerable room for tools and methodologies to effectively measure and benchmark multi-dimensional sustainability performance of supply chain operations (New 1997, Kärnä and Heiskanen 1998, Hervani *et al.* 2005, Seuring and Müller 2008). One of the major challenges for sustainability benchmarking across supply chains is to account for the multi-dimensional nature of sustainability encompassing economic, social and environmental implications of business and supply chain operations (Bai and Sarkis 2010).

The current paper develops a methodology to measure and benchmark sustainability performance of supply chains through an integrated index that is achieved through application of the Analytical Hierarchy Process (AHP). The present paper addresses several major aspects of sustainability benchmarking: first – by developing indicators that reflect three dimensions of sustainability – environmental, social and economic following a concept of triple-bottom line; second – by applying sustainability indicators to various supply chain stages from production to retail; third – by incorporating strategic sustainability target setting through scaling indicators according to desirability of sustainability performance; fourth – by determining relative importance between indicators across sustainability dimensions and supply chain stages.

The current paper demonstrates the proposed methodology by applying it to benchmarking sustainability of food supply chains. The food supply chain serves as a useful example because sustainability implications of food production and consumption are critical for many food organisations, policy makers and other stakeholders, who are highly concerned with sustainability effects of food supply chain operations (Marsden *et al.* 1999). The proposed methodology can be used by industry, managers, monitoring and consumers' organisations, and policy makers to

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45 access and compare sustainability of supply chain operations and review contributions of individual elements within
the supply chain towards the overall sustainability index.

The current paper starts with the review of literature on benchmarking and sustainability and then provides
an overview of sustainability concerns in the food supply chain. We explain our methodology for benchmarking
sustainability in the supply chain through detailed exposition of sustainability indicators development and scoring
50 for the food supply chain. The proposed framework is evaluated using data for potato and chicken supply chains
in the United Kingdom (UK). Further, we introduce weighting schemes using AHP and describe the results of
a sensitivity analysis. Finally, the discussion and conclusions section outlines the implications of the proposed
sustainability benchmarking framework and discusses future work.

2. Benchmarking and sustainability

55 Benchmarking is a process of evaluation of organisational products, services, and processes in relation to the best
practice (Camp 1995, McNair and Leibfried 1995). The term is often associated with efforts undertaken by
individual firms to identify and imitate best practices within their own industry. Benchmarking has been frequently
cited as an important tool used for continuous improvement of organisational performance, total quality
management and competitive advantage (McNair and Leibfried 1995, Simatupang and Sridharan 2004, Manning
60 *et al.* 2008). Benchmarking has gained considerable popularity in business and industry (Camp 1995, Zairi and
Youssef 1995a, Wever *et al.* 2007) and has been well reviewed in practitioner-oriented literature (Zairi and Youssef
1995b, 1996, Sarkis 2001a). In this paper, we approach benchmarking as the process of defining operational
measures of performance and appraising firms (or supply chains) with respect to selected measures.

Effective benchmarking requires data analysis. Dozens of tools for benchmarking have been developed, they
65 include flowcharts, cause-and-effect diagrams, radar/spider charts and Z charts (Camp 1995), the European
Foundation for Quality Management (EFQM) business excellence model, the balanced scorecard, service quality
(SERVQUAL) framework, gap analysis, AHP, scatter diagrams (Ahmed and Rafiq 1998), computational geometry
(Talluri and Sarkis 2001), data envelopment analysis (DEA) (Zhu 2002) and the Operational Competitiveness
Ratings Analysis (OCRA) (Oral 1993, Parkan 1994, Jayanthi *et al.* 1999). A distinct advantage of AHP among these
70 tools its ability to consider multiple attributes and factors, which is a key characteristic of sustainability
measurement, and utilisation of both qualitative and quantitative data, which is highly beneficial when considering
sustainability issues (Chan 2003).

2.1 Supply chain performance measurement

Benchmarking typically focuses on a single link – or even a single process within a link – rather than the entire
75 supply chain (Shepherd and Gunter 2006). There are significant challenges for performance measurement across
supply chains to facilitate benchmarking. For example, Gunasekaran *et al.* (2001) identify a variety of financial and
non-financial metrics that firms can use to evaluate different dimensions of performance at the strategic, tactical,
and operational levels. Although this type of work can help to construct standardised measures which may result in
improved performance, it does not result in a supply-chain wide measure and does not offer opportunities for
80 benchmarking. Application of AHP to supply chain benchmarking has been a recommended and favoured
approach (Min and Galle 1996, Chan, 2003). We follow in that process, and extend it to sustainability.

2.2 Sustainability benchmarking

Given new industry pressures, sustainability is placed highly in the agenda of industry and other stakeholders to
benchmark supply chain performance. In the current paper we introduce sustainability as part of the triple bottom
85 line concept recommending that firms measure and report their success according to economic, social and
environmental performance criteria (Elkington 1997). Although there are examples when the three dimensions of
sustainability (economic, social and environmental) have been incorporated to measure supply chain performance
(New 1997, Kärnä and Heiskanen 1998, Sarkis 2001b), the majority of frameworks usually evaluate two dimensions
of sustainability (economic and environmental) and very rarely embrace all three dimensions (Veleva *et al.* 2003,
90 Seuring and Müller 2008, Bai and Sarkis 2010).

95 There has been an emergent set of investigations related to benchmarking and performance measurement in relation to sustainability (Sarkis 2010). Most of this research, however, is oriented toward improvement of individual firms or processes rather than toward analysis of entire supply chains. There have been attempts to measure sustainability; however, most of these efforts focus on firm- or product-level performance. Furthermore, there is a strong emphasis on environmental performance. Thus, there is a significant need to measure broader sustainability across the supply chain.

2.3 Benchmarking the food supply chain

100 The food supply chain is critically important to society (Fine *et al.* 1996, Barrett *et al.* 1999, Marsden *et al.* 1999). This paper adopts a definition, utilised by the UK Department for Environment, Food and Rural Affairs (DEFRA 2006), of the food supply chain that consists of the stages of agricultural production, food processing, food wholesaling, food retailing and food catering.

105 Food accounts for a significant share of modern production and consumption and its supply has considerable implications for economic growth, employment, health, development, communities and the natural environment (Marsden *et al.* 1999, Hinrichs and Lyson 2008, Roth *et al.* 2008). Growing environmental and ethical concerns about effects of food supply chain on the natural environment have led to an increased pressure from a variety of stakeholders to improve sustainability performance of product lifecycles from 'farm to folk' (Hughes 2001, Courville 2003, Weatherell *et al.* 2003, Ilbery and Maye 2005).

110 The food industry was amongst the first to look into aspects of sustainability, including pollution, labour standards, ethics in supplier relations and waste issues (Fritz and Schiefer 2008). Looking at regional, sector and firm levels, various frameworks have been developed to study effects of the food sector – notably, lifecycle sustainability impacts, farm economic costing, food miles, energy accounting in product lifecycles, footprint analysis, mass balance and farm sustainability indicators (Linstead and Ekins 2001, Gerbens-Leenes *et al.* 2002, Carlsson-Kanayama *et al.* 2003, Garnett 2003, Heller and Keoleian 2003, Biffaward 2005, Pretty *et al.* 2005, Collins and Fairchild 2007). These studies have been successful in highlighting problems areas in food production and consumption.

115 Most importantly, the food sector is constantly innovating with alternative strategies to decrease burdens on the natural environment and improve social and ethical issues in supply chain through various production, marketing, labelling, accreditations schemes and initiatives (Weatherell *et al.* 2003, Ilbery and Maye 2007). However, no formal modelling approach to benchmarking the sustainability of food supply chains exists.

120 3. A methodology for sustainability benchmarking or supply chains

We propose a formal methodological framework to benchmark supply chains according to sustainability performance that consists of four major stages:

- (1) Identification of sustainability indicators.
- (2) Raw data gathering and data transformation using performance rescaling.
- 125 (3) Data gathering and adjustment using AHP.
- (4) Sensitivity analysis of results.

130 This section outlines the first three stages and the case study section will illustrate the last two stages of the methodology in detail. We use data for general industrial level analysis (e.g. potatoes or flowers or other general agricultural products) rather than for specific organisational product level (e.g. Schvaneveldt 2003). Although strategic information for product and process design practices can be gleaned from product-level benchmarking for improved environmental performance (Boks and Stevels 2003, Wever *et al.* 2007), we use a higher-level perspective for our analysis for increased cooperation within the industry toward sustainability improvement.

3.1 Development of sustainability indicators

135 The first stage of the framework is to identify a range of indicators to be considered in the sustainability assessment for benchmarking of supply chains. In this paper, we consider stages of agriculture (farming), food processing, food wholesale, food retail and food catering in the assessment of the food supply chain. Our framework aims to

Table 1. Sustainability indicators for the food supply chain.

Supply chain stage	Environmental	Social	Economic
Agriculture/ Food processing/ Food wholesale/ Food retail/ Food catering	<ul style="list-style-type: none"> • Energy consumption • Water consumption • Waste arising 	<ul style="list-style-type: none"> • Employment • Wages • Employment gender ratio 	<ul style="list-style-type: none"> • Labour productivity • Market concentration • Import dependency

Source: Adapted from Yakovleva and Flynn (2004).

incorporate three dimensions of sustainability: economic, social, and environmental. Firstly, objectives of sustainable development applicable to the industry level and specifically for the food sector have been selected from the objectives of sustainable development outlined for the industry by United Nations Conference on Sustainable Development (UNCSD 1998) and those stated in Agenda 21 (United Nations 1992). The following objectives have been considered for the assessment: (1) within the economic dimension: promotion of economic growth, encouragement of open and competitive economy, and changing consumption patterns; (2) within the social dimension: creation of productive employment, achieving equality; and (3) within the environmental dimension: reduction of resource use and protection of natural environment. Then, appropriate criteria for measuring the progress towards an objective were selected and followed by the choice of a final indicator. An attempt was made to select indicators that apply to all stages in the food supply chain in order to compare the sustainability performance between the stages. The indicators in this study are purposefully fairly generic, which enables comparison between the stages and between different food products.

For example, the sequence for selection of an indicator within the economic dimension could be demonstrated as follows. Promotion of economic growth is an important objective of sustainable development within the economic dimension. Within industry, it could be measured by productivity. A specific indicator is selected to measure productivity, such as Gross Value Added per worker, data for which are ready available with statistical services. Potential users of this framework may choose industry specific sustainability objectives and indicators that are crucial for demonstrating progress towards sustainable development.

Initially, over 50 indicators were drawn for five stages of the supply chain (Yakovleva and Flynn 2004); however, due to data limitations and to help exemplify the methodology proposed in this paper, a final set of nine indicators is selected for the framework, three per dimension. Thus, we have a total of 45 indicators (nine sustainability indicators for each of the five stages) for the framework, which are reported in Table 1.

3.2 Data gathering and transformation

The framework in the current study uses data from potato and chicken food supply chains in the UK. Chickens and potatoes represent different production processes within the food supply chain (chicken is the most popular meat category, and potato is the most popular vegetable). The data for these supply chains were collected for 2002 (see Table 2).

3.2.1 Data gathering

Since we are focusing on UK food supply chains, statistical information is collected from two different organisations within the British Government: DEFRA collects information on the agricultural sector, whereas the Office for National Statistics (ONS) collects information on the production industries including the food sector.

3.2.2 Data Transformation using Performance Rescaling and Normalisation

In order to analyse and compare the data for various stages in the supply chain and between two products, the indicators are normalised. The UK economy average or food supply chain average values are used as a benchmark for the development of normalised scores. Indicators are allocated scores on a scale of 1–6. The 0 score stands for no available information, a score of 1 reflects a low benefit to sustainability and a score of 6 a high level of

Table 2. Sustainability indicators for the chicken and potato supply chains (data for 2002)¹.

Stage of the food supply chain/ <i>Dimension of sustainability</i> /Indicators					
Agricultural production	Units	Chicken	Potato	Agriculture	Total UK economy
<i>Economic indicators</i>					
Number of enterprises		725	4,581	142,840	1,619,195
Total output	£'000	821,000	544,000	15,508,000	1,948,458,000
Total output	'000 tonnes	1,202	6,663	n/a	n/a
Output per enterprise	£'000	1,132	118	108	1,203
Output per enterprise	'000 tonnes	1.65	1.45	n/a	n/a
GVA	£'000	n/a	n/a	7,137,000	926,275,000
Labour productivity (GVA per workforce)	£	n/a	n/a	12,976	35,600
Large enterprises	%	12% ²	16% ³	14% ⁴	2% ⁵
Imported products vs. domestic	%	0.007%	9%	38%	n/a
<i>Social indicators</i>					
Total employment, average per year	people	9200	n/a	550,000	26,000,000
Employee per enterprise	people	12.7	n/a	3.8	16.1
Average gross wages per employee (min)	£per year	n/a	n/a	15,735 ⁶ /3,467 ⁷	21,685
Male vs. female employment full time labour	%	n/a	n/a	n/a	63%
<i>Environmental indicators</i>					
Purchase of energy for own consumption per enterprise	£'000	n/a	n/a	n/a	n/a
Purchase of water for own consumption per enterprise	£'000	n/a	n/a	n/a	n/a
Cost of sewage and waste disposal per enterprise	£'000	n/a	n/a	n/a	n/a
<hr/>					
Food processing	Units	Poultry	Potatoes	Food & drink manufacturing	Total UK industry
<i>Economic indicators</i>					
Number of enterprises		107	60	7,535	164,366
Total output	£'000	2,063,000	1,400,000	67,576,000	531,081,000
Total output	'000 tonnes	1,314	1,940	n/a	n/a
Output per enterprise	£'000	19,280	23,333	896	3,238
Output per enterprise	'000 tonnes	12.28	32.33	n/a	n/a
GVA	£'000	467,000	585,000	19,643,000	179,061,000
Labour productivity (GVA per workforce)	£	23,350	53,182	40,252	45,160
Large enterprises, turnover £5 m+	%	37%	27%	15%	7%
Imported products vs. domestic	%	9%	7%	15%	26%
<i>Social indicators</i>					
Total employment, average per year	people	20,000	11,000	488,000	3,965,000
Employee per enterprise	people	186.92	183.33	64.76	24.1
Average gross wages per employee	£per year	16,800	19,273	18,193	20,635
Male vs. female employment full time labour	%	73%	62%	70%	63%
<i>Environmental indicators</i>					
Purchase of energy for own consumption per enterprise	£'000	794	1,535	634	484
Purchase of water for own consumption per enterprise	£'000	121	208	67	27
Cost of sewage and waste disposal per enterprise	£'000	257	299	133	43
<hr/>					
Food wholesaling	Units	Poultry	Potatoes	Agri-food wholesale	Total UK wholesale
<i>Economic indicators</i>					
Number of enterprises		586	880	17,218	113,812
Total output	£'000	1,345,500	2,245,700	70,032,000	388,989,000
Output per enterprise	£'000	2,296	2,552	4,067	3,412

(continued)

Table 2. Continued¹.

Stage of the food supply chain/ <i>Dimension of sustainability</i> /Indicators					
Food wholesaling	Units	Poultry	Potatoes	Agri-food wholesale	Total UK wholesale
GVA	£'000	165,300	349,400	7,678,000	52,643,000
Labour productivity (GVA per workforce)	£	24,309	47,216	34,124	42,834
Large enterprises, turnover £5 m+	%	9%	13%	7%	7%
Imported products vs. domestic	%	22%	21%	38%	n/a
<i>Social indicators</i>					
Total employment, average per year	people	6,800	7,400	225,000	1,229,000
Employee per enterprise	people	11.6	8.4	13.1	10.8
Average gross wages per employee	£per year	16,452	13,888	16,876	19,129
Male vs. female employment full time labour	%	83%	71%	73%	73%
<i>Environmental indicators</i>					
Purchase of energy for own consumption per enterprise	£'000	161	75	21	161
Purchase of water for own consumption per enterprise	£'000	13	5	1	8
Cost of sewage and waste disposal per enterprise	£'000	40	18	3	16
Food retailing	Units	Chicken	Potatoes	Food and drink retail	Total UK retail
<i>Economic indicators</i>					
Number of enterprises		1,800	1,400	66,703	207,513
Total output	£'000	2,742,000	3,415,000	71,000,000	265,211,000
Total output	'000 tonnes	1,414 ⁸	3,338	n/a	n/a
Output per enterprise	£'000	1,523	2,439	1,064	1,275
Output per enterprise	'000 tonnes	0.79	2.38	n/a	n/a
GVA	£'000	144,500	86,800	17,510,000	53,185,000
Labour productivity (GVA per workforce)	£	17,000	12,765	13,820	17,285
Large enterprises, turnover £5 m+	%	0.3%	0.2%	1%	1%
Imported products vs. domestic	%	22%	21%	38%	n/a
<i>Social indicators</i>					
Total employment, average per year	people	8,500	6,800	1,267,000	3,077,000
Employee per enterprise	people	4.7	4.9	18.9	14.8
Average gross wages per employee	£per year	6,538	4,840	7,812	8,798
Male vs. female employment full time labour	%	75%	54%	54%	50%
<i>Environmental indicators</i>					
Purchase of energy for own consumption per enterprise	£'000	15	13	477	173
Purchase of water for own consumption per enterprise	£'000	1	1	32	13
Cost of sewage and waste disposal per enterprise	£'000	3	2	28	12
Food catering (non-residential)	Units	Chicken	Potatoes	Non-residential catering	Total UK economy
<i>Economic indicators</i>					
Number of enterprises		2,062	8,500	107,739	1,619,195
Total output	£'000	488,000	700,000	46,436,000	1,948,458,000
Total output	'000 tonnes	255	3,141	n/a	n/a
Output per enterprise	£'000	236	82	431	1,203
Output per enterprise	'000 tonnes	0.12	0.36	n/a	n/a
GVA	£'000	234,000	324,000	18,002,000	926,275,000

(continued)

Table 2. Continued¹.

Stage of the food supply chain/ <i>Dimension of sustainability</i> /Indicators					
Food catering (non-residential)	Units	Chicken	Potatoes	Non-residential catering	Total UK economy
Labour productivity (GVA per workforce)	£	12,251	12,226	12,221	32,200
Large enterprises, turnover £5 m+	%	1%	1%	1%	2%
Imported products vs. domestic	%	22%	21%	38%	n/a
<i>Social indicators</i>					
Total employment, average per year	people	19,100	26,500	1,473,000	26,000,000
Employee per enterprise	people	9.3	3.1	13.7	16.1
Average gross wages per employee	£per year	6,327	6,327	6,327	21,685
Male vs. female employment full time labour	%	49%	49%	49%	63%
<i>Environmental indicators</i>					
Purchase of energy for own consumption per enterprise	£'000	124	124	124	n/a
Purchase of water for own consumption per enterprise	£'000	22	22	22	n/a
Cost of sewage and waste disposal per enterprise	£'000	15	15	15	n/a
Total food supply chain	Units	Chicken	Potatoes	Food and drink	Total UK economy
<i>Economic</i>					
Number of enterprises		5,280	15,421	342,035	1,619,195
Total output	£'000	7,459,500	8,304,700	270,552,000	1,948,458,000
Total output	'000 tonnes	1,698	6,479	n/a	n/a
GVA	£'000	1,010,800	1,345,200	69,950,000	926,275,000
Labour productivity (GVA per workforce)	£	15,887	26,019	17,474	32,200
Large enterprises	%	12%	11%	7%	2%
Imported products vs. domestic	%	17%	16%	30%	n/a
<i>Social</i>					
Total employment, average per year	people	63,624	51,700	4,003,000	26,000,000
Average gross wages per employee	£per year	9,223	8,866	9,842	21,685
Male vs. female employment full time labour	%	70%	59%	61%	63%
<i>Environmental</i>					
Purchase of energy for own consumption per enterprise	£'000	274	437	314	n/a
Purchase of water for own consumption per enterprise	£'000	39	59	30	n/a
Cost of sewage and waste disposal per enterprise	£'000	79	83	45	n/a

Source: Adapted from Yakovleva (2007).

Notes: ¹This work contains statistical data from ONS which is Crown copyright and reproduced with the permission of the controller of HMSO and Queen's Printer for Scotland. The use of the ONS statistical data in this work does not imply the endorsement of the ONS in relation to the interpretation or analysis of the statistical data.

²Holdings with more than 100,000 and over broilers are classified as large.

³Potato holdings with 20 ha of land and over.

⁴Agricultural holdings with 100 ha of land and over (data from *Agriculture in the UK 2002*).

⁵Enterprises with a turnover of more than £5 m.

⁶Average wages per person per year, full-time labour.

⁷Average wages per person per year, gross wages in agriculture divided by total employment in agriculture in 2002.

⁸The calculation of physical outputs in food retailing and non-residential catering is based on proportions that 15% of chickens are sold via food service and 85% via retail (Baxter 2003).

Table 3. Scoring sustainability indicators.

Indicators	0	1	2	3	4	5	6
<i>Mark</i>	n/a	Very poor	Poor	Fair	Average	Good	Excellent
Productivity (GVA per workforce, thousand pounds)	n/a	0	12.0	24.0	36.0	48.0	60
Market concentration (% of large enterprises)	n/a	40	32.0	24.0	16.0	8.0	0
Trade importance (import dependency, %)	n/a	100	80.0	60.0	40.0	20.0	0
Employment (employees per enterprise, number of people)	n/a	0	4.0	8.0	12.0	16.0	20
Wages (average gross wages per employee per annum, thousand pounds)	n/a	0	5.4	10.8	16.2	21.6	27
Gender balance (male vs. female employment full time labour, %)	n/a	100	90.0	80.0	70.0	60.0	50
Energy use (purchase of energy for own consumption per enterprise, thousand pounds)	n/a	1000	800.0	600.0	400.0	200.0	0
Water use (purchase of water for own consumption per enterprise, thousand pounds)	n/a	80	64.0	48.0	32.0	16.0	0
Waste (cost of sewage and waste disposal per enterprise, thousand pounds)	n/a	100	80.0	60.0	40.0	20.0	0

Note: 0-information not available, 1-lowest score, 6-highest score.

Source: Adapted from Yakovleva (2007).

sustainability benefit (the ranges could be adjusted depending on what level of granularity is sought for comparison purposes; six levels and a non-reporting/value level were seen as appropriate for discrimination in performance).

175 The scale for each indicator was developed based on general notions of maximum and minimum desirable sustainability benefit or value and unacceptable or undesirable sustainability values. Then there was a linear interpolation on the six levels based on maximum and minimum scores. This approach is one example of linear normalisation, additional assumptions or characterisations (e.g. non-linearity along scales or expert evaluation of minimum and maximum scores) could be used. The indicator scores are defined in Table 3. It must be noted that
180 three indicators were chosen for each dimension of sustainability (economic, social and environmental) in the final scoring system (see Yakovleva 2007). The actual scores for each supply chain stage and food type are reported in Table 4.

3.3 Adjusting the benchmarked scores using AHP

185 This is the most intricate stage of the proposed methodological framework and will be demonstrated in detail using the case of food supply chains.

The values in Table 4 represent an adjusted score based on ranges as defined in Table 3. But, this rough estimate may not be adequate since it does not take into consideration the relative importance of each of these factors with respect to each other. To further this methodology we introduce a weighting scheme based on expert opinion to more accurately represent the performance of these actual supply chains. We complete this portion of the
190 methodology by introducing a multi-attribute rating scheme, AHP.

AHP allows for a set of complex issues, factors and relationships, which have an impact on an overall objective, to be compared with the importance of each issue relative to its impact on the solution of the problem (Saaty 1980). Other approaches that can define the factor utilities and how well each of the alternatives may rank on the various factors may also be used. For example, the Analytic Network Process (ANP) is a more general form of AHP which could also
195 be used in this context. In brief, ANP does not require the same strict hierarchical structure between elements as AHP and can accommodate feedback and interdependencies among various elements. However, ANP typically requires much greater effort for comparison of additional linkages. It may also be disadvantageous to decision makers who wish to understand the technique, the complexities of ANP may not allow for this ease of understanding and transparency. For example, a simple decision model presented by Saaty (1996) with three alternatives
200 compared with respect to four criteria requires a minimum of 12 pairwise comparisons for AHP, but over 600

Table 4. Indicator cores for each stage of supply chain and food type.

Supply Chain Stage/Food Type	Indicators								
	Economic			Social			Environmental		
	A	B	C	D	E	F	G	H	I
<i>Agriculture</i>									
Chicken	0.00	4.50	6.00	4.18	0.00	0.00	0.00	0.00	0.00
Potato	0.00	4.00	5.55	0.00	0.00	0.00	0.00	0.00	0.00
Benchmark: Food	2.08	4.25	4.10	1.95	1.64	0.00	0.00	0.00	0.00
<i>Food processing</i>									
Chicken	2.95	1.38	4.90	6.00	4.11	3.70	2.03	1.00	1.00
Potato	5.43	2.63	5.65	6.00	4.57	4.80	1.00	1.00	1.00
Benchmark: Food and drink	4.35	4.13	5.25	6.00	4.37	4.00	2.83	1.81	1.00
<i>Food wholesale</i>									
Chicken	3.03	4.88	4.90	3.90	4.05	2.70	5.20	5.19	4.00
Potato	4.93	4.38	4.95	3.10	3.57	3.90	5.63	5.69	5.10
Benchmark: Agro-food wholesale	3.84	5.13	4.10	4.28	4.13	3.70	5.90	5.94	5.85
<i>Food retail</i>									
Chicken	2.42	5.96	4.90	2.18	2.21	3.50	5.93	5.94	5.85
Potato	2.06	5.98	4.95	2.23	1.90	5.60	5.94	5.94	5.90
Benchmark: Food and drink	2.15	5.88	4.10	5.73	2.45	5.60	3.62	4.00	4.00
<i>Food catering</i>									
Chicken	2.02	5.88	4.90	3.32	2.17	6.00	5.38	4.63	5.25
Potato	2.02	5.88	4.95	1.78	2.17	6.00	5.38	4.63	5.25
Benchmark: Non-residential catering	2.02	5.88	4.10	4.42	2.17	6.00	5.38	4.63	5.25

Notes: A = Labour productivity (GVA per workforce). B = Large enterprises, turnover £5 m +. C = Imported products vs. domestic. D = Employees per enterprise. E = Average gross wages per employee. F = Male vs. female employment full time labour. G = Purchase of energy for own consumption per enterprise. H = Purchase of water for own consumption per enterprise. I = Cost of sewage and waste disposal per enterprise

comparisons for an ANP model that accounts for all possible dependencies. Thus, we chose AHP for this application because it is easy to understand and implement. Future research will benefit from possible application of ANP.

AHP utilises a decision-making framework that assumes a unidirectional hierarchical relationship among decision levels. Thus, the first major step in the AHP process is to define the decision hierarchy, which would include overall objective, factors, subfactors (if necessary) and alternatives.

The second major step in the AHP process is to elicit the preferences through pairwise comparisons of the various factors. This step is completed by asking a series of questions that compare the relative importance or influence of one factor (technique) when compared to another factor (technique) on a 'controlling' factor. Saaty (1980) suggests that the comparisons of the factors be made in the range 1/9 to 9. A 9 indicates that one factor is extremely more important than the other, a 1/9 indicates that one factor is extremely less important than the other, and a 1 indicates equal importance. These pairwise comparisons are summarised in a matrix, and one matrix is used for each controlling variable. One pairwise comparison matrix will be formed for the comparisons of the categories on each of the factors.

The third step in the AHP process is to complete the evaluations of the factors and alternatives relative importance weights by determining a local priority vector is computed as the unique solution to:

$$Aw = \lambda_{\max} w, \quad (1)$$

where λ_{\max} is the largest eigenvalue of A , the pairwise comparison matrix of the factors under consideration. Saaty (1980) provides several algorithms for approximating w , the final relative importance weights of the factors. We used Web HIPRE3+ (Mustajoki and Hämäläinen 1999), an Internet, interactive software decision support tool available for decision analysis (<http://www.hipre.hut.fi/>), to compute the eigenvalues and relative importance weights for our study.

The final stage in the overall benchmarking methodology is the sensitivity analysis which will be described fully at the end of the case example.

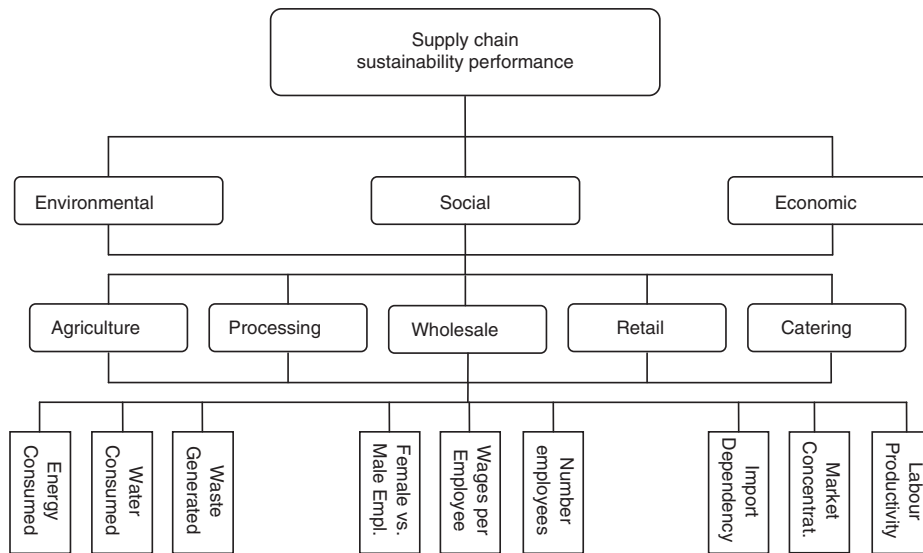


Figure 1. Supply chain sustainability hierarchy.

4. Case study: applying the methodology to food supply chains

We now apply the AHP process described above to the chicken and potato supply chains in the UK. The first step is to define the hierarchy, illustrated for this study in Figure 1. The top level of our hierarchy consists of these three corresponding dimensions: environmental, social and economic dimensions. These are only exemplary dimensions, other dimensions may be used to define sustainability; however, these three are generally accepted as the primary factors. The hierarchy is further decomposed into various sub-elements. The food supply chain itself, represented by five distinct stages, is the next level. The stages include agriculture, processing, wholesale, retail, and catering. Again, one could argue that there should be more stages or fewer stages. We feel that a five-stage model captures the essence of the supply chain, including an appropriate level of detail. The third and final level of the hierarchy is made up of the specific measures used to evaluate the sustainability of the supply chain stages. These measures are the indicators summarised in Table 3, which include labour productivity, number of employees, cost of waste disposal and so on.

4.1 Expert opinion

For the current study, we surveyed a small group of food supply chain experts to determine relative importance weights of chosen indicators in the supply chain. Experts who specialise in chicken and potato production and distribution and have an in-depth knowledge of food supply chain operations at the national level with significant work experience at a specific link the supply chain (agricultural production, food manufacturing, food wholesale, food retail and industry association) have been approached to participate in the study. All the experts were previously interviewed on the subject of sustainability in the food supply chain and were determined to be key managers in operations of highly concentrated chicken and potato supply chains in the UK. Out of the 18 experts approached for the study, five responded by filling in the questionnaire; for this study we selected four fully completed questionnaire responses from the actual respondents. Experts whose responses were used for the AHP development include: (1) a potato expert who is a senior manager at a national industry association with marketing expertise and 30 years work experience in food retailing; (2) a chicken expert who is a senior manager within a national industry association with expertise in food safety and food technology and 13 years work experience in the food industry; (3) retail expert 1 is a senior manager at a large supermarket chain with expertise in product development and quality assurance and 15 years work experience in food retail; and (4) retail expert 2 is a senior manager at a large supermarket chain with expertise on technical development with 17 years work experience in the food industry.

Table 5. Pairwise comparisons and ratings of sustainability dimensions by potato expert.

Dimension	<i>Environmental</i>	<i>Social</i>	<i>Economic</i>	Importance Rating
<i>Environmental</i>	1	$\boxed{1}$	$\boxed{1/5}$	0.177
<i>Social</i>	1	1	$\boxed{1}$	0.304
<i>Economic</i>	5	1	1	0.519

Table 6. Pairwise comparisons and ratings of sustainability dimensions by chicken expert.

Dimension	<i>Environmental</i>	<i>Social</i>	<i>Economic</i>	Importance Rating
<i>Environmental</i>	1	$\boxed{1/7}$	$\boxed{1/3}$	0.085
<i>Social</i>	7	1	$\boxed{1/9}$	0.215
<i>Economic</i>	3	9	1	0.700

As part of this weight elicitation process, a questionnaire was developed. The initial portions of the questionnaire provided some definitions of the factors to be evaluated. These definitions are important to help respondents be more consistent in their evaluations. An excerpt from the full questionnaire is shown in Appendix A. All of the questions in the questionnaire are formulated as pairwise comparisons and are used to construct the pairwise comparison matrices. For this hierarchy we needed responses to 88 pairwise comparison questions. Respondents were asked to make a series of pairwise comparisons for each level of the hierarchy discussed above. For example, with respect to the top level, the following three questions were posed:

- How significant are *environmental factors* when compared to *economic factors*?
- How significant are *environmental factors* when compared to *social factors*?
- How significant are *social factors* when compared to *economic factors*?

The responses were represented on a 1–9 Likert-type scale with a ‘1’ response representing the $1/9$ value, meaning *extremely less important*, and a ‘9’ response meaning *extremely more important*. Table 5 reports the importance ratings derived from the responses of a potato supply chain expert. The numbers listed in boxes reflect the responses to the three groupings of questions above. The diagonal elements of the matrix are 1s, by definition, since they represent the comparison of an item with itself. Once the importance of one factor with respect to a second is given, then the importance of the second factor with respect to the first is the reciprocal. This process is how the remaining elements of the matrix are derived. In this way, the three questions completely characterise the nine pairwise comparisons of the environmental, social, and economic factors. Using these numbers as inputs, AHP determines the relative importance scores of each of the factors. These importance rating scores, reported in the last column of Table 5, represent the relative weight that this expert places on each top-level dimension (note that the values sum to 1). These results show that this expert felt the environmental issues were of less significance than both social and economic issues in the potato supply chain.

Similarly, Table 6 reports the results of the pairwise comparisons based on the responses of a chicken supply chain expert. As expected, different responses to the survey questions yield different importance ratings. It is interesting to note, however, that although the ratings are different, the rank orderings correlate perfectly, i.e. *environmental* has the lowest weight and *economic* has the highest weight for both experts.

This process of eliciting responses is repeated for each level of the hierarchy, comparing each stage of the supply chain with respect to each dimension of sustainability and then comparing each indicator (such as labour productivity) with respect to each stage of the supply chain. A similar process was used to obtain ratings from the retail experts for each level of the hierarchy (to conserve space, the ratings are not reported here).

4.2 Computing the overall sustainability index

Once the responses to all of the questions have been elicited, AHP is used to compute the relative adjustment ratings. The final output is a set of importance ratings for each expert for all of the indicators at the bottom of the hierarchy illustrated in Figure 1. The final AHP output for one potato expert is displayed in Table 7. The relative importance weighting from Table 6 for the potato expert’s environmental sustainability dimension (0.177), appear as ‘local’ importance ratings, the second column, for the environmental factor in Table 7. The relative importance rating for the impact of each of the supply chain stages is shown in the fourth column of Table 7. For example, the agricultural stage of the potato supply chain has the highest (local) relative importance rating (0.535) in its influence on the environmental sustainability dimension. The (local) relative importance of each of the sustainability indicators for a given sustainability dimension and supply chain stage appears in the sixth column of Table 7. The environmental

Table 7. AHP final output – global importance ratings for potato expert.

Sustainability Dimension	Importance Rating	Supply Chain Stage	Importance Rating	Sustainability Indicator	Importance Rating	Global Importance Rating
Environmental	0.177	Agriculture	0.535	Energy consumed	0.567	0.05369
Environmental	0.177	Agriculture	0.535	Water consumed	0.323	0.03059
Environmental	0.177	Agriculture	0.535	Waste generated	0.110	0.01042
Environmental	0.177	Food Processing	0.264	Energy consumed	0.319	0.01491
Environmental	0.177	Food Processing	0.264	Water consumed	0.460	0.02149
Environmental	0.177	Food Processing	0.264	Waste generated	0.221	0.01033
Environmental	0.177	Food Wholesale	0.035	Energy consumed	0.778	0.00482
Environmental	0.177	Food Wholesale	0.035	Water consumed	0.111	0.00069
Environmental	0.177	Food Wholesale	0.035	Waste generated	0.111	0.00069
Environmental	0.177	Food Retail	0.134	Energy consumed	0.333	0.00790
Environmental	0.177	Food Retail	0.134	Water consumed	0.333	0.00790
Environmental	0.177	Food Retail	0.134	Waste generated	0.333	0.00790
Environmental	0.177	Food Catering	0.032	Energy consumed	0.333	0.00189
Environmental	0.177	Food Catering	0.032	Water consumed	0.333	0.00189
Environmental	0.177	Food Catering	0.032	Waste generated	0.333	0.00189
Social	0.304	Agriculture	0.233	Employment	0.715	0.05064
Social	0.304	Agriculture	0.233	Wages/employee	0.218	0.01544
Social	0.304	Agriculture	0.233	Gender Ratio	0.067	0.00475
Social	0.304	Food Processing	0.342	Employment	0.460	0.04783
Social	0.304	Food Processing	0.342	Wages/employee	0.221	0.02298
Social	0.304	Food Processing	0.342	Gender Ratio	0.319	0.03317
Social	0.304	Food Wholesale	0.041	Employment	0.742	0.00925
Social	0.304	Food Wholesale	0.041	Wages/employee	0.203	0.00253
Social	0.304	Food Wholesale	0.041	Gender Ratio	0.055	0.00069
Social	0.304	Food Retail	0.218	Employment	0.633	0.04195
Social	0.304	Food Retail	0.218	Wages/employee	0.304	0.02015
Social	0.304	Food Retail	0.218	Gender Ratio	0.063	0.00418
Social	0.304	Food Catering	0.166	Employment	0.701	0.03538
Social	0.304	Food Catering	0.166	Wages/employee	0.204	0.01029
Social	0.304	Food Catering	0.166	Gender Ratio	0.095	0.00479
Economic	0.519	Agriculture	0.078	Labour productivity	0.701	0.02838
Economic	0.519	Agriculture	0.078	Market Concentration	0.202	0.00818
Economic	0.519	Agriculture	0.078	Import Dependency	0.097	0.00393
Economic	0.519	Food Processing	0.302	Labour productivity	0.429	0.06724
Economic	0.519	Food Processing	0.302	Market Concentration	0.143	0.02241
Economic	0.519	Food Processing	0.302	Import Dependency	0.429	0.06724
Economic	0.519	Food Wholesale	0.033	Labour productivity	0.685	0.01173
Economic	0.519	Food Wholesale	0.033	Market Concentration	0.234	0.00401
Economic	0.519	Food Wholesale	0.033	Import Dependency	0.080	0.00137
Economic	0.519	Food Retail	0.466	Labour productivity	0.685	0.16567
Economic	0.519	Food Retail	0.466	Market Concentration	0.234	0.05659
Economic	0.519	Food Retail	0.466	Import Dependency	0.080	0.01935
Economic	0.519	Food Catering	0.121	Labour productivity	0.726	0.04559
Economic	0.519	Food Catering	0.121	Market Concentration	0.198	0.01243
Economic	0.519	Food Catering	0.121	Import Dependency	0.076	0.00477

Note: Global importance ratings may not sum to 1 due to rounding error.

sustainability dimension at the agricultural stage has energy consumed as the most important of the three sustainability indicators with a local score of 0.567 (when compared with water consumed, 0.323, and waste generated, 0.110). The global importance rating is determined by taking the product of each of the local scores for a given row. For example, for the energy consumed by the agriculture supply chain stage’s environmental sustainability dimension, the global importance rating is the product of $(0.567) * (0.535) * (0.177) = 0.05369$. The mathematical expression is simply:

$$GIR_{ijk} = SD_i * SCS_j * SI_k \tag{2}$$

Table 8. Overall sustainability index based on potato expert.

	Economic			Social			Environmental			Total
	Labour Prod. (A)	Market Concen. (B)	Import Depend. (C)	Employment (D)	Wages/Emp. (E)	Gender Ratio (F)	Energy Usage (G)	Water Usage (H)	Waste Generated (I)	
Agriculture	0.000	0.033	0.022	0.000	0.000	0.000	0.000	0.000	0.000	0.055
Food processing	0.365	0.059	0.380	0.287	0.105	0.159	0.015	0.021	0.010	1.402
Food wholesale	0.058	0.018	0.007	0.029	0.009	0.003	0.027	0.004	0.004	0.157
Food retail	0.341	0.338	0.096	0.094	0.038	0.023	0.047	0.047	0.047	1.071
Food catering	0.092	0.073	0.024	0.063	0.022	0.029	0.010	0.009	0.010	0.332
Total	0.856	0.521	0.528	0.472	0.175	0.214	0.099	0.081	0.070	3.016

Note: Sustainability index is the sum of indicator scores times global important ratings = 3.016.

Table 9. Overall sustainability index based on chicken expert.

	Economic			Social			Environmental			Total
	Labour Prod. (A)	Market Concen. (B)	Import Depend. (C)	Employment (D)	Wages/Emp. (E)	Gender Ratio (F)	Energy Usage (G)	Water Usage (H)	Waste Generated (I)	
Agriculture	0.000	0.038	0.087	0.000	0.000	0.000	0.000	0.000	0.000	0.137
Food processing	0.633	0.142	0.146	0.072	0.034	0.021	0.032	0.003	0.002	1.085
Food wholesale	0.072	0.104	0.019	0.035	0.017	0.006	0.024	0.002	0.005	0.285
Food retail	0.221	0.544	0.064	0.084	0.041	0.031	0.041	0.003	0.018	1.049
Food catering	0.093	0.082	0.105	0.194	0.061	0.081	0.014	0.003	0.001	0.635
Total	1.019	0.911	0.422	0.396	0.154	0.139	0.111	0.012	0.026	3.178

Note: Sustainability index is the sum of indicator scores times global important ratings = 3.178.

where GIR_{ijk} = global relative importance rating for Sustainability Indicator k of Supply Chain Stage j , Sustainability Indicator I , SD_i = local relative importance rating for the Sustainability Dimension I , SCS_j = local relative importance rating for the Supply Chain Stage j and SI_k = local relative importance rating for the Sustainability Indicator k .

An overall sustainability index is computed by weighting the indicator scores reported in Table 4 by the global ratings of Table 7. The index is simply the sum of the indicator scores multiplied by the global ratings. Table 8 shows the results for one potato expert. The overall sustainability of the potato supply chain, based on the data in Table 4 and the opinions in Table 7, is 3.016. Each element of the table equals the indicator score times the global importance rating. For example, the value for labour productivity (the first economic dimension) for the retail link in the potato supply chain is computed as $(0.166) \times (2.06) = 0.341$, where 0.166 is the global relative importance rating for the labour productivity indicator (Table 7) and 2.06 is the indicator score for the retail link of the potato supply chain (Table 4). Similar computations are performed for each sustainability indicator and supply chain link combination; these products are then summed to get the total index of 3.016.

This methodology is also applied to the chicken supply chain, using the data reported in Table 2 and the evaluations of a chicken supply chain expert (see Table 6 for the top-level ratings). Translating the opinions into numerical importance ratings and multiplying the indicator scores by these ratings yields an overall sustainability index of 3.178, as reported in Table 9. The overall score shows that based on the expert opinions of relative importance and the baseline performance numbers we arrive at a higher overall rating for the chicken supply chain's sustainability index. Although data collected for calculation of indicators (especially at the stage of agriculture) are not complete, this result would mean that in comparison with the potato supply chain, the chicken supply chain is closer to achieving sustainability objectives within three dimensions: economic, social and environmental.

An advantage of the scoring and the weighting scheme is that we can arrive at a single sustainability index score for the overall supply chain as well as scores for each individual stage, thus helping to inform decision making at the strategic, tactical and operational levels by organisations inside and outside of the supply chain. For example, the processing stage of both supply chains has the largest influence on sustainability when aggregated and weighted, as shown in Tables 8 and 9. From a strategic perspective, large food retailer could use these results as incentive to build partnerships with food processors, for example, with the aim of increasing overall supply chain sustainability. This retailer could also observe that the retail stage itself is a major factor in overall sustainability; therefore, its own tactics and operations play an important role. The ratings can help guide firms' decisions about the use of recycled and less energy intensive materials as well. From a tactical and operational perspective, an individual processing firm could use these results as an impetus to study and model operational practices of other processing firms. Policy makers seeking to understand and improve sustainability can examine what aspects of the processing stage make it more sustainable for the potato supply chain than the chicken supply chain, even though the chicken supply chain has a higher overall sustainability score. The analysis could also examine the various sustainability dimensions and their scoring.

Thus, the results can be used at different levels and by different actors inside and outside of the supply chain. In the absence of these benchmarks, a firm has little objective guidance to direct its efforts towards increasing sustainability. And, as will be demonstrated in the next section, sensitivity analyses can be performed to evaluate how robust the specific numbers are with respect to variations in different inputs, giving decision-makers confidence in the final results.¹

Next, we examine the sustainability scores with respect to the retail experts' opinions. The retail experts do not have in-depth knowledge of specific supply chains and were not asked to evaluate the potato or chicken supply chains specifically; therefore, we use their opinions to complement the area experts. Specifically, we first computed global importance ratings for each retail expert for each supply chain using the same process described above. We then computed an average global importance rating for the potato supply chain using the potato expert and the two retail experts. The average was computed as a weighted geometric mean, as is usual when combining separate ratings of individual experts (Forman and Peniwati 1998). Since the potato supply chain expert has more detailed knowledge of this chain, we placed a weight of 0.5 on his/her ratings and placed a weight of 0.25 on the ratings of each of the retail experts (for a total weight of 1.0). Various other weighting schemes were examined – including equal weights for all experts – and each produced similar results. Combining the ratings in this way recognises the experts' area knowledge while reducing the possibility of extreme bias. The average global importance rating was then used to compute the overall sustainability index (as described above), yielding an average overall result of 2.859 for the potato supply chain. Using the same process for the chicken supply chain yields an average overall sustainability index of 3.004. To further understand the robustness of these results and to attain additional insights, we perform a sensitivity analysis.

4.3 Sensitivity analysis

The final stage of our overall benchmarking methodology is the sensitivity analysis stage. We seek to determine the overall robustness of the sustainability numbers to perturbations in the data. That is, if other experts were asked to rate the importance of different supply chain dimensions and indicators, how much would the final results change? The sensitivity analysis also shows the tradeoffs that are implicitly assumed by the various experts. Some tradeoffs have greater marginal implications for experts and supply chains. This type of trade-off analysis is critical to identify potential stakeholder responses to various valuations as well as implications to performance of stages and overall supply chain sustainability. Sensitivity analysis is also useful in providing insights due to the dynamics of sustainability perceptions and importance over time. To demonstrate some of these issues, we perform sensitivity analysis on the economic dimension of the top-level hierarchy for both the potato and chicken supply chains. We chose this dimension because the area expert for each supply chain gave it the highest weight, but the process discussed below could be used for any dimension or link. Based on the questionnaire responses from the potato supply chain expert, the economic dimension has a weight of 0.519, the social dimension has a weight of 0.304, and the environmental dimension has a weight of 0.177. To understand how sensitive the overall sustainability index is to changes in the weight on the economic dimension, we vary this weight from 0 to 1, while keeping the ratio of the other two dimensions the same. The ratio of social to environmental is currently 0.632 ($= 0.304 / [0.304 + 0.177]$), and

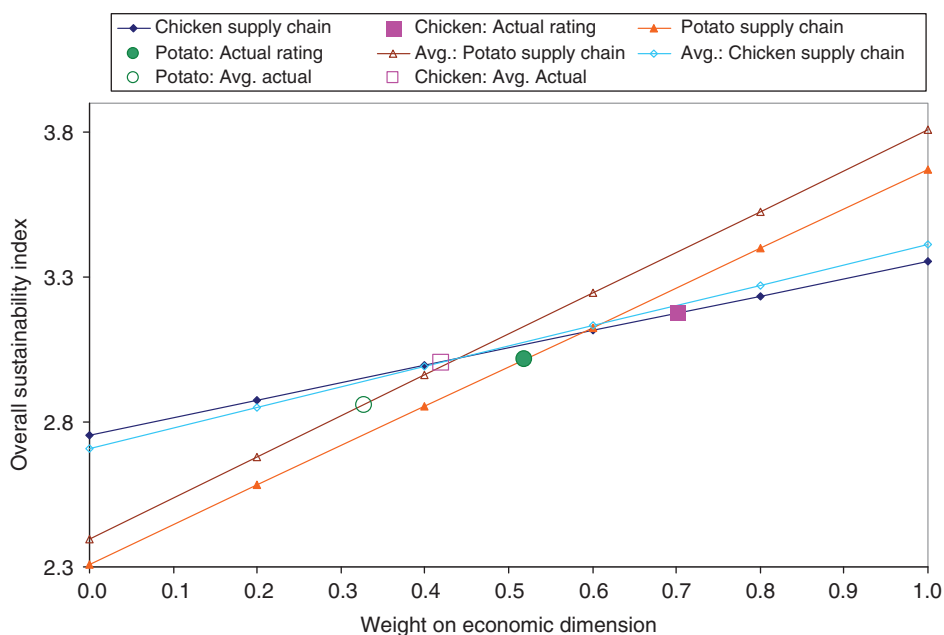


Figure 2. Changes in overall sustainability index as a function weight placed on economic dimension of hierarchy.

370 the ratio of environmental to social is currently 0.368 ($= 0.177/[0.304 + 0.177]$). Thus, if the economic dimension has
a score of 0, then the social dimension will have a score of 0.632 and the environmental dimension will have a score
of 0.368, maintaining the same ratios. If the economic dimension has a score of 0.2, then social dimension will have
a score of 0.506 ($= 0.632 * [1 - 0.2]$) and the environmental dimension will have a score of 0.294 ($= 0.368 * [1 - 0.2]$).
375 Changing the top-level weights will also change the global importance ratings and yield a different overall
sustainability index. Figure 2 illustrates how the overall sustainability index changes as the weight on the economic
dimension changes. The same process was used to generate results for the chicken supply chain and for the average
indices computed using the retail experts' opinions. All of the results are shown in Figure 2, along with the actual
(original) scores.

In Figure 2 there are four sensitivity ranges (lines) and four original points identified. The four include: (1) The
380 chicken supply chain sensitivity of the chicken expert only; (2) The average chicken supply chain sensitivity that is
the weighted average for the chicken expert and the two retail experts; (3) The potato supply chain sensitivity of the
potato expert only; and (4) The average potato supply chain sensitivity that is the weighted average for the potato
expert and the two retail experts.

As the figure indicates, the sustainability index of potato supply chain is more sensitive than that of the chicken
385 supply chain to changes in the weight on the economic dimension (this result is true for the basic potato supply chain
and the averaged potato supply chain). Although the index for potato chain ranges from 2.3–3.7, the index for the
chicken chain only ranges from approximately 2.8–3.3. Similarly, the averaged sustainability index for the potato
supply chain ranges from approximately 2.4–3.8, and the averaged sustainability index for the chicken supply chain
ranges from approximately 2.7–3.4. The data in Table 4 suggest that the potato supply chain performs better than
390 the chicken supply chain in terms of the economic indicators. It is likely that the improved performance in one area
is coming at the expense (trading-off) of other areas. The potato chain is less sustainable overall, according to the
experts and the proposed measures. In any case, this situation illustrates how focus on a single dimension may miss
the mark in terms of evaluating the overall health and sustainability of the supply chain and the importance of the
consideration of tradeoffs within and between factors. Another general observation is that each of the overall
395 sustainability scores tends to increase for each supply chain based on the increasing importance of economic factors.
Sensitivity analyses were carried out for both of the other two factors (to conserve space, the details have
been omitted), and their overall sustainability scores decrease due to their lesser weighted importance than the
economic factor.

5. Discussion and conclusion

400 One effective way for managers and policy makers to improve the sustainability of supply chains is to complete a benchmarking exercise to determine how well specific supply chains perform. To complete such evaluation of sustainability performance we have introduced a methodology that can help benchmark supply chains based on sustainability factors. We introduced this technique using real world data and expert opinion for the food supply chain.

405 The results show that experts give considerably different relative weights to various elements of sustainability in the supply chain. Selected industry experts generally give higher weight to economic indicators as oppose to environmental and social indicators. Indeed, we acknowledge that all experts approached in this study belong to the industrial sector, whilst experts from civil society and public policy organisations may differ in their opinion on importance ratings of sustainability indicators. Potential users of the framework may wish to consult various stakeholder groups during the entire process of sustainability index creation: (1) during the selection of sustainability indicators to be included in the assessment as suggested by Courville (2003); (2) consult them on what would be those desirable sustainability performance targets before ranging the indicators from 1–6; and (3) determine importance ratings of indicators in the framework.

410 The calculated sustainability indices show that according to experts' opinion the chicken supply chain has a higher sustainability index than the potato supply chain. Although we have data shortages for the stage of agriculture, judging from the results we can state that the chicken supply chain is closer to achieving sustainability objectives within economic, social and environmental dimensions according to industry expert opinion. Industry experts provide higher weights to the economic dimension as the most significant contributor to sustainability, and chicken performs higher in these economic terms as compared to the potato supply chain.

420 Alternative weighting schemes and a more comprehensive analysis by completing a 'what-if' analysis would see a shift in the results. Also, the relative importance of sustainability factors will tend to shift over time. This shift is becoming even more pronounced as governments and communities are seeking ways to reduce environmental burdens while maintaining or improving social benefits. A benchmarking methodology such as the one proposed here can help to more effectively manage these trade-offs.

425 Social investors, consumers and environmental organisations, customers and policy makers can use the developed framework of assessment to inform their decisions. The developed framework can be useful for policy makers to measure sustainability performance across various supply chains (major commodities and products). Focal companies within food supply chains such as food manufacturers and supermarket retailers may adopt this framework to assess the sustainability performance of their products and compare within the sector. Sustainability scorecard development, becoming more common in commercial products, can be enhanced by more effectively considering and integrating multiple dimensions and scores. The framework can be used to make relative comparison between various commodities, but most importantly can be applied for comparison of various methods of production (e.g. organic and conventional) for the same product or products produced by different supply chains (companies or retailers). If applied to a company level, the developed benchmarking framework could assist consumers to evaluate sustainability performance of equivalent product lines and inform their purchasing behaviour. Thus, strategic, tactical and operational considerations for a variety of stakeholders can be evaluated with the results of this sustainability methodology.

430 Since we construct and range indicators between 1 and 6, where 6 is the desirable sustainability performance or sustainability target, we can say that the closer the overall sustainability score of the supply chain the closer the supply chain is conforming to sustainability objectives or targets. Potential users of the framework (such as policy makers and individual companies) can set the maximum score as a desired target for sustainability performance (either policy target or individual corporate performance target) and using the framework can measure how the supply chains are performing in accordance with set targets. The higher the score the closer the supply chain overall in achieving sustainability targets within the three dimensions: economic, social and environmental.

445 This framework concentrates on food products produced within boundaries of a nation, and therefore does not specifically address the concept of food miles or the impacts associated with imported goods. Food supply chains are becoming increasingly globalised, and the reflection of the environmental and social burdens associated with importing products from abroad could be incorporate through including specific indicators to reflect carbon emissions associated with all stages of the supply chain (agricultural production, food manufacturing, food wholesale [including food imported from abroad], food retail and food catering).

450

Rating of sustainability indicators on 1–9 scale requires detailed expert knowledge on operations and impacts of specific supply chains. As different experts were used for two different supply chains, experts may be biased and their opinion may affect the final scores. In the current study we decided to place more weight on the opinion of product specialists, but equal or other combinations for distributing the weights of expert opinions may be utilised. Perhaps, in order for companies to improve the sustainability performance, which is often interpreted by organisational stakeholders, companies and policy makers need to incorporate stakeholders in determining relative weights of indicators. Integrating more experts from various stakeholder groups (not just industry) may provide more evidence of what types of tradeoffs are willing to be made. A broader perspective, incorporating additional stakeholders can be completed using the geometric weighting scheme proposed in this study. The relative importance of these various stakeholders will also need to be established. Finding common footing may actually occur. Further negotiation on weighting schemes with sensitivity analysis will allow for a more complete picture of supply chain sustainability.

AHP, with its advantages, does have certain disadvantages. Consideration of interdependent relationships amongst the factors can provide a more realistic assessment of the situation. Thus, more complex models such as ANP and multiple-methodological linkages to optimisation tools such as goal programming may be useful extensions to this approach and require further investigation.

In the monitoring of the supply chain we focused primarily on the forward logistics stages. Although reverse logistics in the food supply chain has not had as much investigation as other supply chains (e.g., food may be easily and environmentally disposed of through composting practices), the inclusion of reverse logistics stages may be useful to get a more complete picture of the food supply chain. It may be dependent on the type of food, e.g. less perishable foods such as processed foods, may be more conducive to reverse logistics planning. And it may also depend on the supply chain stage, e.g. reverse logistics is of growing importance to supermarkets (Kumar 2008).

Broader application, studies and developing better data acquisition systems and performance measurement systems in the future may address these limitations. We provide one of the few studies to actually benchmark entire supply chains. More importantly, however, the proposed methodology, along with the case example, provides a strong foundation upon which to build.

Note

1. To ensure a fair comparison, when one supply chain is missing a value for an indicator (Table 4), the corresponding value for the other supply chain is also set to 0. This process only affects one indicator (employees per enterprise in the Agriculture stage). Including the original, non-zero value for this indicator would make the overall sustainability index higher for the chicken supply chain.

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595 **Appendix A: questionnaire excerpt**

Definitions:

Sustainability – Sustainable development involves the simultaneous pursuit of economic prosperity, environmental quality and social equity. Companies aiming for sustainability need to perform not against a single, financial bottom line but against the triple bottom line.

600 Agriculture – includes processes that involve growing of plants (e.g. food crops, vegetables, fruit, etc) and crops combined with farming of animals; farming of birds and animals (poultry, cattle, sheep, goats, horses, asses, mules, hinnies and swine); and agricultural services activities.

Food processing – includes processes that involve production and preserving of meat, poultry (including slaughtering of birds and animals); processing and preserving fish and vegetables; manufacture of food products and drinks.

605 Food wholesale – includes processes that involve wholesale of agricultural raw materials, live birds and animals; wholesale of food, beverages and tobacco; and wholesale of grain, seeds and animal foods.

Food retail – includes processes that involve retail sale of food products, drinks and tobacco to consumers in specialised food stores shops and non-specialised stores.

610 Food catering – includes processes that involve preparation and distribution of food products and drinks to consumers in hotels, hostels, camping sites, restaurants, cars and canteens.

Energy use – includes use of petrol, diesel, electricity, gas, etc.

Water use – include use of water for industrial purposes.

Waste – includes sewage and waste.

How much more important are **food retail activities** when compared to **food catering activities**?

3 *In terms of their SOCIAL IMPACT*

A How much more important are **agricultural activities** when compared to **food processing activities**?

B How much more important are **agricultural activities** when compared to **food wholesale activities**?

C How much more important are **agricultural activities** when compared to **food retail activities**?

D How much more important are **agricultural activities** compared to **food catering**?

E How much more important are **food processing activities** when compared to **food wholesale activities**?
