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Bakshi, BR, Ziv, G and Lepech, MD (2015) Techno-Ecological Synergy: A Framework for Sustainable Engineering. Environmental Science and Technology Letters, 49 (3). 1752 - 1760.

https://doi.org/10.1021/es5041442

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Techno-Ecological Synergy: A Framework for Sustainable Engineering

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Abstract

Even though the importance of ecosystems in sustaining all human activities is well-known, 5 methods for sustainable engineering fail to fully account for this role of nature. Most methods 6 account for the demand for ecosystem services, but almost none account for the supply. Incom-7 plete accounting of the very foundation of human well-being can result in perverse outcomes from 8 decisions meant to enhance sustainability and lost opportunities for benefiting from the ability 9 of nature to satisfy human needs in an economically and environmentally superior manner. This 10 paper develops a framework for understanding and designing synergies between technological 11 and ecological systems to encourage greater harmony between human activities and nature. This 12 framework considers technological systems ranging from individual processes to supply chains 13 and life cycles, along with corresponding ecological systems at multiple spatial scales ranging 14 from local to global. The demand for specific ecosystem services is determined from informa-15 tion about emissions and resource use, while the supply is obtained from information about 16 the capacity of relevant ecosystems. Metrics calculate the sustainability of individual ecosystem 17 services at multiple spatial scales and help define necessary but not sufficient conditions for local 18 and global sustainability. Efforts to reduce ecological overshoot encourage enhancement of life 19 cycle efficiency, development of industrial symbiosis, innovative designs and policies, and eco-20 logical restoration, thus combining the best features of many existing methods. Opportunities 21 for theoretical and applied research to make this framework practical are also discussed. 22

²³ 1 Introduction

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Increasing interest in sustainability has resulted in several approaches for considering the broader environmental impact of industrial processes and products [1]. These activities aim to enhance efficiency and reduce impact across the entire life cycle. Resulting methods include eco-efficiency [2], carbon [3] and water [4] footprints, life cycle assessment [5, 6], and cradle to cradle design [7], which are widely used for guiding decisions, managing supply chains, and designing products and processes. These efforts have mainly focused on resource use and emissions, and their impact

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on people and the environment. The role of ecosystems in sustaining all human activities has
 been mostly ignored, until recently.

Ecosystems provide goods such as grains, biomass, water, and genetic resources; regulate 32 the climate, pests, floods, and air and water quality; support other services via photosynthesis, 33 pollination, and biogeochemical cycles; and are of cultural, spiritual and aesthetic value. Their 34 importance for sustainability is undeniable not just physically but also monetarily [8, 9]. The 35 Millennium Ecosystem Assessment identified 80% of global ecosystem services as degraded [10], 36 while Rockstrom et al. [11] claim that anthropogenic activities already exceed the "safe operating" 37 zone" in services associated with carbon and nitrogen cycles, and biodiversity loss. These studies 38 point toward the urgent need to consider the status of ecosystem services in engineering decisions, 39 and to devise ways of encouraging ecosystem restoration. 40

Almost all eco-efficiency and life cycle oriented methods ignore the essential role of ecosystems 41 42 in sustaining human activities and well-being. Some methods do consider the demand of selected ecosystem services, but all ignore the capacity of ecosystems to supply individual services. LCA 43 accounts for the impact of human activities on some ecosystem services associated with water, 44 soil carbon, biomass, land use, and biodiversity [12, 13], as do some thermodynamic methods 45 [14, 15]. However, these methods only consider the demand of these services and not their 46 locations and availability. Ecological footprint does account for biocapacity [16] but in a highly 47 aggregated manner that is blind to individual services. As a result, decisions based on these 48 existing methods could unintentionally increase reliance on scarce or degraded ecosystem services 49 or destroy ecosystems entirely. 50

Quantifying the role of ecosystem services has received attention in the last few years, and has 51 resulted in many models, frameworks and tools [17]. Industrial efforts have been led by organiza-52 tions such as Business for Social Responsibility (BSR), World Business Council for Sustainable 53 Development (WBCSD), and the Natural Capital Coalition (NCC). Nonprofit environmental 54 groups have also initiated projects for assessing corporate reliance on ecosystem services [18]. 55 Often these tools quantify nature's services in monetary terms to enable policy and corporate 56 use. However, a gap exists between efforts and methods for assessment of ecosystem services 57 and design of sustainable systems [19]. 58

This paper describes a new framework for assessing and engineering interconnected technological-59 ecological systems by explicitly accounting for the demand that technological systems place on 60 ecosystems and the supply of ecosystem services that nature can provide to a process or product 61 at multiple spatial scales. We call this approach Techno-Ecological Synergy (TES) to reflect its 62 emphasis on establishing mutually beneficial or synergistic relationships between technological 63 and ecological systems, with the ultimate goal of achieving harmony between human activities 64 65 and nature. The ecosystem services demanded by the technological system are quantified by information about resource use and emissions, while the supply is quantified by knowledge of 66 ecosystems, their biogeochemical functioning, and the services and benefits they provide. Unlike 67 eco-efficiency or ecosystem evaluation measures which focus on minimizing the impact of techno-68 logical systems on natural ecosystems, TES metrics are developed to determine and reduce the 69 demand overshoot for each ecosystem service with regard to available and maximum possible 70 ecosystem service provision. This approach combines the best features of existing methods such 71 as life cycle assessment, cradle to cradle design, and ecosystem service assessment. It encourages 72 improving process efficiency as in traditional engineering, enhances life cycle efficiency as done 73 by life cycle and footprint methods, encourages closing of material cycles as in industrial sym-74 biosis and cradle-to-cradle design, and encourages ecosystem restoration as done by ecosystem 75 service assessment methods. 76

In the rest of this article, the next section provides a brief overview of relevant methods,
followed by two sections that define the techno-ecological system, and the methodology of technoecological synergy. An illustrative example follows, closing with an outlook of challenges that
need to be met for this framework to be practical.

$\mathbf{2}$ Background

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Numerous methods and approaches have been proposed to better align engineered technological 82 systems with environmental sustainability goals. Such efforts range from basic guidelines and 83 checklists for "green" design [20, 21, 22, 23] to comprehensive analysis and design tools for full 84 accounting of social, environmental, and economic impacts. The latter are reviewed in [24], and 85 include Cradle to Cradle design [7], Design for Environment (DfE) [25], and fully integrated LCA 86 design software [26, 27]. These and other sustainable engineering methods have paid limited 87 attention to the dependence and impact of engineering activities on ecosystems. As reviewed in 88 [28], methods such as water footprint [4], human appropriation of net primary productivity [29], 89 90 and some aspects of LCA do consider the demand for some ecosystem services. Ecologicallybased LCA (Eco-LCA) quantifies the demand for ecosystem services in physical units of mass, 91 exergy and emergy [30], including the role of some biogeochemical cycles [31, 32]. Life cycle 92 characterization factors are being developed to quantify the impact of land use on ecosystems 93 [33, 34]. However, life cycle methods consider mainly the impact on ecosystems at the life cycle 94 scale, and none of these methods consider the supply of specific ecosystem services at multiple 95 spatial scales. Most existing methods encourage continuous improvement by doing "less bad," 96 [35], which need not translate into keeping human activities within ecological constraints. 97

Ecosystem service assessment and modeling is an active area of research and includes efforts 98 for understanding the role of ecosystems in supporting and enhancing human well-being [8, 36], 99 developing models and software that quantify ecosystem services [37, 38], and frameworks for 100 classifying them [10, 39, 40, 41]. There have been numerous initiatives to build links between ecosystem service evaluation at local, regional, and national levels [42, 43, 44, 45, 46, 47] along 102 with characterizing ecosystem services as flows [48], budgets [49], and land management tools 103 [50, 51]. These efforts have provided much clarity about the role of ecosystems for enabling 104 105 human activities, and focused attention on their irreplaceable role in supporting economic and social activities. 106

Some work has considered supply and demand for specific ecosystem services such as water 107 for particular scales [52] or across spatial scales [53] but these do not connect with sustainable 108 engineering. One of the most active areas of research around ecosystem service is in assessing 109 their value to the economy or society. Building on neo-classical natural resource economics, a 110 111 number of methods have been suggested to value ecosystems using direct or indirect valuation [43, 54, 40]. However, as with sustainable engineering methods, current ecosystem service meth-112 ods fall short of enabling sustainable engineering. This is due to either their narrow focus on 113 quantification of ecosystem service supply thus ignoring the demand or consumption of such 114 services, or their narrow focus on monetary valuation thus being unable to capture potential 115 deficits of ecosystem service provision. 116

3 Methodology 117

The Techno-Ecological Synergy (TES) framework attempts to quantify the demand and supply 118 119 for ecosystem services at multiple spatial scales, and compare alternatives based on the extent to which the demand for an ecosystem service differs from the supply. The system and flows 120 considered in the TES approach are depicted in Figure 1. As shown, at a selected spatial scale, 121 technological systems rely on inputs from ecosystems within and outside the selected boundary. 122 Ecosystems may utilize some waste products from technological systems, and those that cannot 123 be utilized appear as pollutants in the environment. For example, a forest can take up emissions 124 such as oxides of nitrogen, sulfur, and carbon from manufacturing, while providing oxygen 125 and biomass to the process. These flows do not necessarily traverse in pipes and conveyors, 126 and can be augmented with "natural" transport, for example, carbon dioxide emitted into the 127 atmosphere and carbon dioxide sequestered elsewhere from the atmosphere. TES strives toward 128 understanding and enhancing such synergies, with the goal of closing material loops at multiple 129 spatial scales, as described below. Such an approach explicitly accounts for whether a human 130

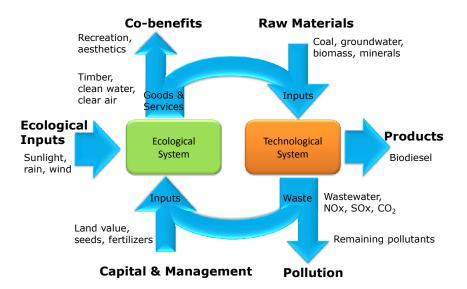


Figure 1: Flows considered in Techno-Ecological Synergy at a selected scale.

activity is within the regenerative capacity of the biosphere at the spatial scales impacted by the activity.

¹³³ 3.1 Defining the System

TES involves defining two types of boundaries: technological and ecological. The former in-134 volves choosing the human activities to be evaluated, which could be a single process, life cycle, 135 or economic network, while the latter involves specifying geographical regions according to the 136 nature of the ecosystem service being considered. For TES assessment of a specific manufactur-137 ing process, this process could represent the smallest technological scale. This could be followed 138 by considering the supply chain and important processes in the life cycle, added as small-scale 130 systems at the appropriate geographic location. The challenges of developing a comprehensive 140 life cycle network model based on such process information are well-known in the LCA litera-141 ture. A common way of considering a large boundary while avoiding challenges of a large and 142 intractable network is to integrate process models with more aggregate models. In such hybrid 143 models, each of the processes is nested within processes at larger scales, which can include their 144 regional, national, and global economies [55, 56]. 145

As depicted in Figure 2, technological models at each scale may be represented by $T_{i,j}$ which 146 consists of the i-th technological process at the j-th scale. Each technological system is nested 147 within ecosystems in its vicinity, $E_{i,j}$. Thus, if the smallest technological scale includes manu-148 facturing processes, then the smallest ecological scale could be the plant site or the corporate 149 campus; if the technological system is a residence, the smallest ecological scale could be the 150 yard around the house [57]. Such a technological system could be assessed by quantifying its 151 dependence on ecosystem services at multiple spatial scales, or by including its interaction with 152 other technological processes in the life cycle and corresponding ecosystems. As shown, $T_{1,1}$, 153 $T_{2,1}, T_{3,1}$ represent technological processes at the finest scale, j = 1. These could be individual 154 production processes. Technological systems at a coarser scale, j = 2 are shown as $T_{1,2}$, $T_{2,2}$, and 155 $T_{3,2}$. These could be average processes, say within a supply chain, whose information is obtained 156 from a life cycle inventory database, as discussed in Section 3.3. Ecosystems supporting these 157 technological systems are shown in Figure 2 as $E_{1,2}$, $E_{2,2}$ and $E_{3,2}$. A finer scale process may be 158 nested inside a process at a coarser scale, as shown for $T_{3,1}$ and $T_{2,2}$. All of these technological 159 systems are inside a system at the coarsest scale shown as $T_{1,3}$ in Figure 2. This could represent 160 aggregated models such as economic sectors in an environmentally extended input-output model 161 [58, 59]. A final, even coarser scale could represent the global economy. In a given problem, 162

E _{1,3}	Scale, j	Typical $T_{i,j}$	Typical $E_{i,j}$
E _{2.2} T _{1.3} E _{1.2}	1	Buildings	Surrounding campus
	1	Manufacturing site	-
T _{3.2}	2	Corn produc- tion in region	Regional ecosystems
E ₃₂	3	Economic activities in country	Ecosystems at national scale

Figure 2: Technological and Ecological Scales

technological scales are chosen based on factors such as data availability, and scales at which changes can be influenced. As depicted in the figure, each technological scale is nested within an ecosystem scale, with the global biosphere being the largest ecological scale. How these scales are defined depends on the system being studied and user preferences, as illustrated in Section 4.

The largest ecological scale that should be considered depends on the ecosystem service 168 being analyzed. A service such as carbon sequestration is global in nature because of the 169 global flow of CO₂, which means that for closing the carbon loop, global and smaller scales 170 should be considered. Thus, carbon sequestration in any part of the world can be relevant to 171 CO_2 emissions and satisfy the demand for this service anywhere on the planet. In contrast, a 172 service such as pollination is local and determined by the range covered by pollinators. Thus, 173 this service is not relevant at larger geographic scales. The largest scales of some ecosystem 174 services are listed in Table 1. This is analogous to the concept of "servicesheds" in ecosystem 175 services literature, namely the total land area that contributes service consumed or enjoyed by 176 a particular beneficiary, be it a village or a plant. For some ecosystem services, we will need 177 to specify the smallest and largest allowable scale to ensure proper interpretation of the TES 178 metrics as described in Section 3.5. 179

180 Through technological means, it has become possible to expand the spatial scale or serviceshed of some ecosystem services. For example, the use of domesticated bees that are trucked 181 to different regions expands the spatial scale at which these services are available. Such options 182 should be considered within a design, however for the sake of consistent methodology with re-183 gards to spatial scale, TES emphasizes natural ecosystem services, so these enhancements of 184 ecosystem services are treated as separate technological systems. Thus, for example, a dam 185 and reservoir will be another fine scale $T_{i,j}$ system, with its direct contributing area being the 186 associated ecological system. 187

¹⁸⁸ 3.2 Demand and Supply of Ecosystem Services

After defining the system, the demand and supply of ecosystem services must be quantified. 189 Generally speaking, the demand for each ecosystem service may be determined by specific 190 emissions and resource use of the relevant technological systems, while supply may be estimated 191 from knowledge about relevant ecosystems at the selected ecological scale. As summarized in 192 Table 1, the demand for many ecosystem services is the quantity released into or withdrawn from 193 the environment. For example, the demand for carbon sequestration is the mass of CO₂ emitted, 194 whereas its supply is the mass of CO_2 sequestered from the atmosphere by plants, trees, oceans 195 etc. The demand for water provisioning is the volume of water withdrawn, while the availability 196

Ecosystem Service	Quantifying Demand	Quantifying Supply	Largest ecological scale		
Carbon Sequestra- tion	$\rm CO_2 \ emissions$	Capacity of ecosys- tems to sequester carbon	Global		
Pollination Pollinators needed for full production		Pollinators available in local ecosystems	Local		
Nutrient Retention	Nutrient runoff	Capacity to absorb nutrients	Watershed		
Water Provisioning	Water withdrawal	Water from rain, rivers, lakes	Watershed		
Air Quality Regula- tion	Air pollutants	Cleaning capacity of trees, wind	Regional		
Water Quality Regu- lation	Water pollutants	Cleaning capacity of rivers, wetlands	Regional		

Table 1: Demand, supply and largest scale of some ecosystem services.

of water provisioning depends on features in the watershed such as rivers, rate of groundwater replenishment, rain, degree of surface imperviousness, etc. For regulating services, the demand can be quantified based on the allowed or acceptable level of risk, for example the return interval of flooding events, whereas hydrological models can predict how ecosystems modify that risk. Additional exemplar ecosystem services, along with the quantification of supply and demand, are shown in Table 1

While the ecosystem services listed in Table 1 are typical for small-scale technological sys-203 tems, more services need to be considered when going to larger scales. For example, at the city 204 scale there is demand for services such as nature recreation, and at the national scale for main-205 taining biodiversity. The supply of these can be measured by counting visitors or monitoring 206 species populations, or modeled using environmental and geospatial data. Even for small-scale 207 overshoot analysis, it is important to include these services, as otherwise services that are not 208 "material" at small scales would seem to have zero demand as discussed in Section 3.5. To ensure 209 consideration of all relevant services, one can take advantage of initiatives such as the Euro-210 pean Common International Classification of Ecosystem Services (CICES) framework, which 211 produced a hierarchical classification of ecosystem services [39]. 212

3.3 Inventory and Models

As described in Section 3.1, TES requires information at multiple spatial scales about technolog-214 215 ical systems and the ecological systems on which they depend. Information about technological systems at various scales and levels of aggregation is available from many sources. At the finest 216 scales are engineering models or data of manufacturing processes. Such models or data can 217 be very detailed and relatively accurate, and are commonly used in engineering design. At 218 coarser scales, life cycle inventory data of typical processes represents average processes in a 219 selected geographical region [60]. Such data is usually empirical, is commonly used for life cycle 220 assessment, and is likely to be less accurate than models at the process scale. At even coarser 221 scales is data about flows associated with economic sectors. Such data are often available from 222 public sources and correspond to hundreds of sectors in national economies. Such data along 223 with economic input-output models have been used for developing environmentally extended 224 input-output models and for LCA at national [58, 59] and global [61, 62, 63] scales. These 225 sources of life cycle inventory data usually do not contain information about ecosystems, and 226 cannot be used directly for TES. However, such data may be combined with models and data 227

about ecosystems at multiple scales, as described here.

To obtain information about ecosystem services at multiple scales, various models and 229 databases are available. Models of ecosystem services at the local scale include the i-Tree 230 suite [64] to quantify ecosystem services provided by urban trees. These include air quality 231 regulation by taking up pollutants such as carbon monoxide, sulfur oxides, nitrogen oxides and 232 volatile organic compounds along with modeling reduction in water run-off, etc. Models such as 233 CENTURY, DNDC, EPIC, and APEX simulate the capacity of soil to provide various ecosys-234 tem services according to the type of land use. Models of natural and treatment wetlands are 235 also available [65] to quantify the water quality regulation service and other ecosystem services 236 provided by wetlands. Other models, such as SWAT and HEC can be used to model hydrological 237 processes and associated services such as baseflow regulation and flood protection. Such models 238 require detailed input about local ecological conditions such as species of trees, soil quality, etc. 239

240 Several efforts are developing more user-friendly models that require less information than the detailed ecological models mentioned previously. One example is Integrated Valuation of 241 Environmental Services and Trade-Offs (InVEST) [66]. This software contains a suite of models 242 that are less information intensive and more approximate. Such models have been used for 243 estimating the supply of ecosystem services over large regions, and can benefit from increasing 244 availability of data from remote sensing and geographical information systems [67]. Examples 245 of studies about regional ecosystem services include information about water availability and 246 demand [68], flood regulation [69], carbon sequestration capacity [70], and pollination services 247 [71]. These models are comprehensive and easy to use, but less accurate than the models 248 described in the previous two paragraphs. 249

At larger scales, ecosystem services are often represented by aggregating information from 250 251 smaller scales, which is analogous to how technological data are aggregated for inclusion in life cycle inventory databases. As data and models become available to quantify the supply of 252 ecosystem services, they should be incorporated in life cycle inventory databases and environ-253 mentally extended input-output models to permit wider and easier application of TES. Recent 254 work has quantified the contribution of the carbon sequestration ecosystem service in the Eco-255 LCA model of the U.S. [31]. Other efforts include assessments of environmental damage costs 256 resulting from a company's direct and indirect emissions to calculate the "true cost" of corporate 257 activities in monetary terms [72]. This approach relies on conventional economic tools such as 258 marginal damage costs, abatement costs, environmental taxes and productive losses. 259

²⁶⁰ 3.4 Allocation

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A challenge in the proposed approach, particularly at larger scales, is due to the fact that an ecosystem service available at a selected scale is likely to be demanded by many different activities. Assessing the sustainability of alternatives requires ways of determining the correct share of an ecosystem service among multiple users. If there are multiple users of water in a watershed, the water provisioning service in the watershed needs to be allocated to each user. Similarly, the carbon sequestration ecosystem service from ecosystems on public land in a city would need to be partitioned between the activities that emit CO₂.

A similar challenge arises in life cycle assessment and footprint methods when a process produces multiple products. Examples of such situations include production of stover and corn from corn farming, or desired mineral and tailings from mining operations. In such systems, if the goal is to determine the emissions or resource use for each product, then these flows need to be allocated between the products.

Two possible ways of allocating the supply of ecosystem services between users are as follows.

• Proportional allocation. The ecosystem service available in a region could be partitioned between users in proportion to impact or value. For example, the carbon sequestration service from vegetation on city land could be allocated in proportion to the mass of CO₂ emitted by each activity in the city, monetary value of each activity, or some other quantity. The idea underlying this approach is similar to allocation in LCA, and will face the same challenge of determining the correct basis for allocation, and the results could change with

the allocation method. Such allocation could also take the form of a market for ecosystem services that functioned at the scale of service provision.

- Avoid allocation. This approach would not allocate ecosystem services between multiple users, but instead consider its total supply and total demand at the selected ecological spatial scale. If the total demand exceeds the total supply, then all activities that rely on this ecosystem service at that scale will be considered to be overshooting that service. This approach will require calculation of the total ecosystem service supply and demand at the selected ecological scale, and not just for the selected technological system(s).
- How the allocation method can affect decisions is discussed in the next subsection.

3.5 Impact Assessment and Metrics

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The basic results from TES will consist of pairs of numbers $\{D_{i,j,k}, S_{i,j,k}\}$ representing demand, D and supply, S for each techno-ecological system, i = 1, ..., I, at each ecological scale, j = 1, ..., J, for each ecosystem service, k = 1, ..., K. Note that, as discussed in Section 3.1 and shown in Table 1, the largest scale will depend on the type of ecosystem service. These demand and supply numbers may be used to define sustainability metrics to compare alternatives, and as objectives for designing sustainable systems.

Ecological sustainability. Sustainability of the *i*-th system at the *j*-th scale and for the k-th ecosystem service may be defined as,

$$V_{i,j,k} = \frac{S_{i,j,k} - D_{i,j,k}}{D_{i,j,k}}$$
(1)

Negative of $V_{i,j,k}$ may be interpreted as representing ecological overshoot. A necessary, but not sufficient condition for absolute sustainability may be written as,

$$V_{i,J,k} \ge 0, \ \forall i, \forall k \tag{2}$$

Thus, for each ecosystem service, the demand cannot exceed the supply at the largest scale, j = J. This condition is based on the common understanding that exceeding nature's carrying capacity is undesirable for sustainable development. This is a condition for absolute, as opposed to relative sustainability because it is based on comparison with an absolute quantity, the carrying capacity for the k-th ecosystem service [73]. In contrast, relative sustainability metrics involve comparison with alternatives, and not with any absolute limits. Other characteristics of these metrics are discussed near the end of this subsection.

The condition given by Equation 2 is not sufficient for sustainability since other factors 307 such as dynamics, complexity, social, and economic aspects also matter but are not captured 308 in the current framework. In addition, the "wicked" nature of sustainable development makes 309 it difficult to define a necessary and sufficient condition. If demand does exceed supply, that 310 is, if $V_{i,J,k} < 0$ then it means that the ecosystem service is being used at a rate faster than its 311 rate of replenishment, and the human activity is exceeding nature's regenerative capacity. Such 312 a situation usually results in symptoms such as depletion of ground water and fossil resources, 313 accumulation of CO_2 in the atmosphere, or of nutrients in water bodies. 314

The criterion given by Equation 2 may also be applied at any scale. Thus, if

$$V_{i,j,k} \ge 0 \tag{3}$$

then, it means that dependence on the k-th ecosystem service is *locally* sustainable at scale j. It could happen that Equation 3 is satisfied, while Equation 2 is not. For example, a system may emit less CO₂ than can be sequestered by its surroundings to be locally sustainable, but the electricity it buys from outside its boundary may emit more CO₂ than can be sequestered by the ecosystems at the larger scale. Satisfaction of Equation 3 represents an "island of sustainability." As discussed in Section 3.6, TES metrics may encourage the development of such islands, and ultimately satisfying Equation 2.

If the available ecosystem service in a single serviceshed is allocated between multiple users in 323 proportion to the demand created by each user for the selected service, as discussed in Section 324 3.4, then Equation 1 will result in identical values of $V_{i,j,k}$ for all users. If allocation is in 325 proportion to quantities other than demand or if servicesheds overlap, then it could result in 326 different values of $V_{i,j,k}$ at each scale, j. If allocation is avoided then the overshoot should be 327 calculated for scales including the largest scale. In this case, if $V_{i,j,k} < 0$ then all activities that 328 rely on this ecosystem service at this or smaller scale are considered to be globally unsustainable. 329 Thus, according to this criterion, any activity that demands the water provisioning ecosystem 330 service by withdrawing water from the watershed is sustainable only if the total water withdrawal 331 by all activities in the watershed does not exceed the available renewable water. 332

In the proposed TES framework, it is important to prevent analyses that appear beneficial 333 by omitting critical ecosystem services because they are beyond the scale of the technical sys-334 335 tem being considered or are not of interest to the system owner. For example, a decision about replacing a natural area such as a wetland by a parking lot will have a negative impact on 336 ecosystem services such as flood regulation, pest regulation, or natural aesthetic beauty. How-337 ever, since this technological activity does not demand these services, D = 0, the corresponding 338 value of V will tend to infinity, even when the supply is reduced. This is a perverse result since 339 the negative impact of the decision on ecosystem services at larger scales may not be detected. 340 To prevent such outcomes, the notion of "materiality," or "materially important" ecosystem 341 services must be included within TES. 342

Materiality is a foundational principle of financial accounting and recognizes that some in-343 formation is important to the fair presentation of conditions and performance. Under US law, 344 materiality is information presenting a substantial likelihood that the disclosure of the omitted 345 fact would have been viewed by the reasonable individual as having significantly altered the 346 "total mix" of information made available [74]. As such, the range of ecosystem services, k, that 347 must be considered in TES should include any services that all stakeholders in an ecosystem 348 find important and relevant. For services that are material to a TES analysis, but at scales 349 larger than the scale of the system being assessed, this larger scale should be considered for 350 calculation of the metrics. 351

Aggregate Metrics. The metrics proposed so far provide a measure of ecological sustain-352 ability for each ecosystem service at multiple scales. These metrics may be compared for multiple 353 products and the product with larger $V_{i,j,k}$ may be preferred. However, the high dimensionality 354 of the sustainability metrics is likely to result in conflicts between ecosystem services making 355 it difficult to choose between alternatives. Such challenges are common in sustainability anal-356 ysis, and various approaches for comparing systems in multiple dimensions have been explored 357 such as techniques for multi-criteria decision making. Methods may also be devised to reduce 358 dimensionality by using weights, $w_{i,j,k}$ that represent the relative importance of each ecosystem 359 service. Then the aggregated overshoot at scale, j may be calculated as, 360

$$V_j = \sum_i \sum_k w_{i,j,k} F_k\left(V_{i,j,k}\right) \tag{4}$$

where, $F_k(V_{i,j,k})$ could be $F_k(V_{i,j,k}) = V_{i,j,k}$ resulting in a linear weighted sum. Alternatively, 361 $F_k(V_{i,j,k}) = \mathcal{H}(V_{i,j,k})$, where \mathcal{H} represents a Heaviside or step function. The latter representation 362 tation could incorporate information about ecological thresholds in determining the Heaviside 363 function. These metrics at individual scales may be further aggregated by combining metrics at 364 365 all scales resulting in a single metric. Weights, $w_{i,i,k}$ may require subjective input from individuals and society at large. Many recent efforts have focused on monetary valuation of ecosystem 366 services, and approaches to combine them into aggregated metrics, including notions such as 367 "shadow prices" [75, 76]. These efforts may be useful for determining the proposed weights for 368 aggregation. 369

Interpretation of Metrics. The proposed metrics quantify the gap between the supply and demand of selected ecosystem services. Interpretation of the metrics and further steps will be in the following two categories.

• If supply of ecosystem services is greater than its demand, $V_{i,j,k} > 0$, then the selected 373 human activity is operating within nature's carrying capacity, and as indicated by Equation 374 3, the system may be considered to be sustainable at the selected scale and ecosystem 375 services. This situation indicates strong sustainability since each ecosystem service is 376 considered separately. If only $V_i > 0$ but some individual $V_{i,i,k} < 0$, then it indicates weak 377 sustainability at the selected scale. In these cases, efforts may be directed at maintaining 378 this sustainable situation. As schemes for "payment for ecosystem services" are developed, 379 systems in this category may be able to benefit monetarily due to the "value addition" 380 that they provide to society at large. 381

• If supply is less than the demand, $V_{i,j,k} < 0$ then the k-th ecosystem is unable to satisfy the demand posed by technological systems. In this case, human activities are likely to result in harm to society and the environment. This damage may be quantified with the help of methods developed for assessing the environmental and human impact of pollution and resource use by methods such as those in life cycle impact assessment [77] or for monetization of damages due to pollution [78].

Despite the popularity of such aggregation schemes for ecosystem services and the ease of making decisions with aggregate metrics, they should be used only when absolutely necessary, and certainly not in a manner that the underlying physical information is lost or ignored. This is because of known disadvantages of aggregation such as the assumption of substitutability and the resulting weak sustainability criteria [79]. Monetary valuation of ecosystem services is also not without its risks of providing perverse decisions [80]. A hierarchy of metrics may be defined to get the best of disaggregate and aggregate quantities.

395 **3.6** Improvement and Design

TES aims to encourage engineering and human activities to be within ecological constraints. 396 Satisfying this goal means making changes such that $V_{i,j,k} \ge 0, \forall \{i, j, k\}$. This may be achieved 397 by enhancing technological efficiency to reduce the demand for ecosystem services, or by restor-398 ing and protecting ecological systems to increase the supply of ecosystem services. This is an 399 important feature of TES as compared to other methods for assessing and designing sustainable 400 systems. Since these methods do not consider the supply of ecosystem services, their improve-401 ment efforts are often limited to technological aspects. An equally important feature of TES is 402 the explicit recognition of the inherent interdependencies between technological and ecological 403 systems. Such recognition enables a better understanding of the resiliency of coupled techno-404 ecological systems during any enhancement of technological efficiency or restoration of ecological 405 service provision. 406

The multiscale nature of TES presents improvement and design opportunities at each spa-407 tial scale considered. Typically, changes are likely to be easiest at the smallest scale, such as a 408 manufacturing process. If there are emissions that cannot be absorbed or mitigated by ecosys-409 tems, then it will be impossible for $V_{i,j,k} \ge 0$ for some values of i, j, and k. Examples include 410 processes that emit molecules that do not occur in nature such as chlorofluorocarbons, various 411 synthetic polymers, many pharmaceutical molecules, etc. For such molecules, the only way to 412 satisfy the TES objective of $V_{i,i,k} \ge 0$ is by technological changes. One approach is to treat such 413 molecules as "technological nutrients" and like biological nutrients, to recycle in technological 414 systems [35]. 415

⁴¹⁶ Nonrenewable resources will invariably result in values of $V_{i,j,k} < 0$. Therefore, seeking ⁴¹⁷ TES will discourage their extraction and encourage their reuse and recycling by efforts such as ⁴¹⁸ industrial symbiosis.

419 4 Illustrative Example

This section illustrates the type of results and insight that TES can provide by application to a biodiesel manufacturing process. All the data needed for the TES analysis of this process

	Without TES			With Local TES		With Local & Regional TES				
k	Ecosystem	Local,	Regional,	Global,	Local,	Regional,	Global,	Local,	Regional,	Global,
	Service	$V_{1,1,k}$	$V_{1,2,k}$	$V_{1,3,k}$	$V_{1,1,k}$	$V_{1,2,k}$	$V_{1,3,k}$	$V_{1,1,k}$	$V_{1,2,k}$	$V_{1,3,k}$
1	Air Quality Regulation	$\ll 0$	< 0	NA	≈ 0	< 0	NA	≈ 0	≈ 0	NA
2	C sequestra- tion	$\ll 0$	$\ll 0$	$\ll 0$	< 0	$\ll 0$	$\ll 0$	< 0	< 0	≪ 0
3	Water Quality Regulation	< 0	< 0	NA	≈ 0	< 0	NA	≈ 0	≈ 0	NA
4	Nonrenewable energy	-1	-1	≪ 0	≪ 0	-1	≪ 0	≪ 0	$\ll 0$	≪ 0

Table 2: TES at local and regional scales for conventional biodiesel manufacturing. Note that $V_{i,j,k}$ is bounded between -1 and ∞ and larger values are more desirable.

are not yet available, so this example is to illustrate some characteristics of TES and identify research needs.

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The problem considered is as follows. A biodiesel manufacturer is assessing its operation, and would like to identify ways of making its manufacturing more sustainable. Existing engineering methods can help make the process more efficient, and existing sustainable engineering methods can account for broader impacts in the life cycle and help in reducing them. Such approaches rely on indicators of relative sustainability, as discussed in Section 3.5, and focus on doing "less bad."

TES considers the same technological systems, along with the role of ecosystems at multiple scales. At the smallest scale, TES considers only the biodiesel manufacturing process and its surroundings. This technological system, $T_{1,1}$ is considered to be within its immediate surroundings of the manufacturing site, $E_{1,1}$, which is within a region, $E_{1,2}$, and the planet, $E_{1,3}$. For illustration purposes, we consider the ecosystem services of air quality regulation, water quality regulation, carbon sequestration, and nonrenewable energy resources. Design alternatives are considered at local and regional scales.

Without TES, all services are likely to be unsustainable at local, regional and global scales, 437 as indicated in the third to fifth columns of Table 2. Based on these results, the company may 438 start with local options for enhancing its sustainability. Enhancing technological efficiency is one 439 option to reduce the demand for ecosystem services. This "classical" solution, however, does not 440 leverage potential benefits of supporting ecosystems. The easiest TES option is for the company 441 to restore ecosystems on its own land and establish synergies between these ecosystems and the 442 manufacturing activities. In this situation, the results of TES are likely to show improvement 443 over the base case without TES, particularly at the local scale, j = 1, as shown in the sixth to 444 eighth columns of the Table 2. Relevant ecosystems in this case could be trees on the corporate 445 campus, which could take up emissions such as nitrogen and sulfur oxides, particulate matter, 446 and reduce ground level ozone formation. These trees could also replace some of the fossil 447 energy used in manufacturing by using wood as fuel. In addition, for water quality regulation, 448 a treatment wetland on the manufacturing site could treat the wastewater and produce water 449 that could be reused in the process. Also, the biomass from the wetland could be harvested 450 and used as fuel in the plant. These local changes may enable an island of sustainability at the 451 corporate scale but it may push impacts to larger scales. 452

After implementing local options, the company may consider a regional TES option, which could involve investment in a regional nutrient cap-and-trade market, reducing the levels of downstream pollutants by affecting agricultural runoff from upstream farmers. The company can also consider purchase of carbon credits from voluntary markets such as California's Carbon Market, REDD+, as carbon sequestration supply is attributed to the company's global direct impact. For other services, such as air quality, TES would encourage collaborative consideration of emission reductions within the "serviceshed," which for this example encompasses the area where air pollutants emitted to the atmosphere affect city-dwellers' health. Metrics in the last three columns indicate improvement at the regional scale. TES may be further extended to include processes in the life cycle and to a hybrid life cycle model that includes national and international flows. Encouraging such activities at multiple scales is a unique feature of TES and goes well beyond the features of existing sustainable engineered methods.

465 5 Outlook

The framework of techno-ecological synergy expands the reach of sustainable engineering beyond 466 the current techno-centric approach by including the pivotal role of ecosystems. It can be applied 467 at multiple scales ranging from an individual process to the entire life cycle, and encourages 468 reduction of the impact of technological systems along with restoring the ability of ecosystems 469 470 to provide goods and services. Practical application of this framework requires use of models and data from engineering, life cycle assessment, ecological modeling, geographical information 471 systems, and advances in other disciplines including policy, economics, and law. This presents 472 many opportunities for theoretical and applied research across disciplines. 473

474 Author Information

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476 Acknowledgments

Financial support for this work was provided by the National Science Foundation through grantCBET-1336872.

479 **References**

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- Dara O'Rourke. The science of sustainable supply chains. Science, 344(6188):1124–1127, 2014.
 - [2] World Business Council for Sustainable Development. Eco-efficiency: Creating more value with less impact. http://www.wbcsd.org/web/publications/eco_efficiency_ creating_more_value.pdf, 2000.
- [3] Carbon Trust. PAS 2050 : 2008 -Specification for $_{\mathrm{the}}$ assessment of 485 the life greenhouse gas emissions of cycle goods and services. http: 486 487 //www.bsigroup.com/Standards-and-Publications/How-we-can-help-you/ Professional-Standards-Service/PAS-2050, 2008. 488
- [4] A. Y. Hoekstra. The water footprint of modern consumer society. Routledge, London, UK., 2013.
- [5] Jeroen B. Guinée, editor. Handbook on Life Cycle Assessment: Operational Guide to the
 ISO Standards. Springer, 2002.
 - [6] M. A. Curran, editor. *Life Cycle Assessment Handbook*. Scrivener, 2012.
 - [7] William McDonough and Michael Braungart. Cradle-to-cradle. North Point Press, 2002.
- [8] R. Costanza, R. d'Arge R, R. de Groot, S. Farber, M. Grasso, B. Hannon, K. Limburg,
 S. Naeem, R. V. O'Neill, J. Paruelo, R. G. Raskin, P. Sutton, and M. van den Belt. The
 value of the world's ecosystem services and natural capital. *Nature*, 387(6630):253-260,
 1997.

[9] A. Balmford, A. Bruner, P. Cooper, R. Costanza, S. Farber, R. E. Green, M. Jenkins, 499 P. Jefferiss, V. Jessamy, J. Madden, K. Munro, N. Myers, S. Naeem, J. Paavola, M. Ray-500 ment, S. Rosendo, J. Roughgarden, K. Trumper, and R. K. Turner. Economic reasons for 501 conserving wild nature. Science, 297(5583):950–953, 2002. 502 [10] MA. 2005 Millennium Ecosystem Assessment (MEA), Ecosystems and Human Well-being: 503 Synthesis, Island Press, 2005. www.maweb.org, Accessed December 23, 2013. 504 [11] J. Rockstrom, W. Steffen, K. Noonel, A. Persson, F. S. Chapin, E. F. Lambin, T. M. 505 Lenton, M. Scheffer, C. Folke, H. J. Schellnhuber, B. Nykvist, C. A. de Wit, T. Hughes, 506 S. van der Leeuw, H. Rodhe, S. Sörlin, P. K. Snyder, R. Costanza, U. Svedin, M. Falken-507 mark, L. Karlberg, R. W. Corell, V. J. Fabry, J. Hansen, B. Walker, D. Liverman, 508 K. Richardson, P. Crutzen, and J. A. Foley. A safe operating space for humanity. Na-509 ture, 461(7263):472-475, 2009. 510 [12] Thomas Koellner, Laura Baan, Tabea Beck, Miguel Brando, Barbara Civit, Mark Goed-511 koop, Manuele Margni, LlorenMil Canals, Ruedi Mller-Wenk, Bo Weidema, and Bastian 512 Wittstock. Principles for life cycle inventories of land use on a global scale. The Interna-513 tional Journal of Life Cycle Assessment, pages 1–13, 2012. 514 [13] Roland Geyer, David Stoms, and James Kallaos. Spatially-explicit life cycle assessment of 515 sun-to-wheels transportation pathways in the u.s. Environmental Science & Technology, 516 517 47(2):1170-1176, 2013.[14] J. L. Hau and B. R. Bakshi. Expanding exergy analysis to account for ecosystem products 518 and services. Environmental Science & Technology, 38(13):3768–3777, 2004. 519 [15] H. T. Odum. Environmental Accounting: EMERGY and environmental decision making. 520 Wiley, 1996. 521 [16] Michael Borucke, David Moore, Gemma Cranston, Kyle Gracey, Katsunori Iha, Joy Larson, 522 Elias Lazarus, Juan Carlos Morales, Mathis Wackernagel, and Alessandro Galli. Accounting 523 for demand and supply of the biosphere's regenerative capacity: The national footprint 524 accounts' underlying methodology and framework. Ecological Indicators, 24(0):518 – 533. 525 2013.526 [17] Benjamin Burkhard, Franziska Kroll, Stoyan Nedkov, and Felix Müller. Mapping ecosystem 527 service supply, demand and budgets. Ecological Indicators, 21(0):17 – 29, 2012. Challenges 528 of sustaining natural capital and ecosystem services Quantification, modelling & amp; val-529 uation/accounting. 530 [18] The Nature Conservancy and Dow Chemical Company. The Nature Conservancy -531 Dow Collaboration: 2012 Progress Report. http://www.dow.com/sustainability/pdf/ 532 2012-collaboration-report.pdf, 2013. 533 [19] D.J. Abson, H. von Wehrden, S. Baumgärtner, J. Fischer, J. Hanspach, W. Härdtle, 534 H. Heinrichs, A.M. Klein, D.J. Lang, P. Martens, and D. Walmsley. Ecosystem services as 535 a boundary object for sustainability. Ecological Economics, 103(0):29 - 37, 2014. 536 [20] S. W. Peck and M. Kuhn. Design guidelines for green roofs. Ontario Association of Archi-537 tects, 2003. 538 [21] G. A. Keoleian, J. E. Koch, and D. Menerey. Life cycle design framework and demonstra-539 tion projects. Technical Report EPA/600/R-95/107, Environmental Protection Agency, 540 Cinicnnati, 1995. 541 [22] P. T. Anastas and J. B. Zimmerman. Peer reviewed: design through the 12 principles of 542 green engineering. Environmental science & technology, 37(5):94A-101A, 2003. 543 C. Luttropp and J. Lagerstedt. Ecodesign and the ten golden rules: generic advice for [23]544 merging environmental aspects into product development. Journal of Cleaner Production, 545 14:1396-1408, 2006. 546 [24] M. D. Bovea and V. Pérez-Belis. A taxonomy of ecodesign tools for integrating envi-547 ronmental requirements into the product design process. Journal of Cleaner Production, 548 20(1):61-71, 2012.549

- [25] T. E. Graedel and B. R. Allenby. *Industrial ecology*. Prentice Hall, 2003.
- 551 [26] Simapro. www.pre.nl.

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- 552 [27] www.gabi-software.com.
- [28] Y. Zhang, S. Singh, and B. R. Bakshi. Accounting for ecosystem services in life cycle
 assessment, part I: A critical review. *Environmental Science & Technology*, 44(7):2232–
 2242, 2010.
 - [29] Fridolin Krausmann, Karl-Heinz Erb, Simone Gingrich, Helmut Haberl, Alberte Bondeau, Veronika Gaube, Christian Lauk, Christoph Plutzar, and Timothy D. Searchinger. Global human appropriation of net primary production doubled in the 20th century. *Proceedings* of the National Academy of Sciences, 2013.
 - [30] Y. Zhang, A. Baral, and B. R. Bakshi. Accounting for ecosystem services in life cycle assessment, part II: Toward an ecologically based LCA. *Environmental Science & Technology*, 44(7):2624–2631, 2010.
 - [31] Shweta Singh and Bhavik R. Bakshi. Accounting for emissions and sinks from the biogeochemical cycle of carbon in the u.s. economic input-output model. *Journal of Industrial Ecology*, 18(6):818–828, 2014.
 - [32] S. Singh and B. R. Bakshi. Accounting for the biogeochemical cycle of nitrogen in inputoutput life cycle assessment. *Environmental Science & Technology*, 47(16):9388–9396, 2013.
 - [33] Laura de Baan, Christopher L. Mutel, Michael Curran, Stefanie Hellweg, and Thomas Koellner. Land use in life cycle assessment: Global characterization factors based on regional and global potential species extinction. *Environmental Science & Technology*, 47(16):9281–9290, 2013.
 - [34] Thomas Koellner, Laura de Baan, Tabea Beck, Miguel Brandão, Barbara Civit, Manuele Margni, Llorenç Mila à i Canals, Rosie Saad, DanielleMaia de Souza, and Ruedi Müller-Wenk. Unep-setac guideline on global land use impact assessment on biodiversity and ecosystem services in lca. The International Journal of Life Cycle Assessment, 18(6):1188– 1202, 2013.
 - [35] Michael Braungart, William McDonough, and Andrew Bollinger. Cradle-to-cradle design: creating healthy emissions - a strategy for eco-effective product and system design. *Journal* of Cleaner Production, 15(13-14):1337 – 1348, 2007.
 - [36] G. C. Daily, editor. *Nature's Services*. Island Press, 1997.
 - [37] Natural Capital Project. Integrated valuation of environmental services and tradeoffs. http://www.naturalcapitalproject.org/InVEST.html. accessed, February 2, 2013.
 - [38] Artificial intelligence for ecosystem services. ariesonline.org. accessed January 30, 2012.
 - [39] Roy Haines-Young and Marion Potschin. Proposal for a common international classification of ecosystem goods and services (CICES) for integrated environmental and economic accounting (v1). Technical report, European Environmental Agency, 2010.
 - [40] Rudolf S de Groot, Matthew A Wilson, and Roelof M.J Boumans. A typology for the classification, description and valuation of ecosystem functions, goods and services. *Ecological Economics*, 41(3):393 – 408, 2002.
 - [41] Web-accessible materials on ecological valuation developed by or for the sab committee on valuing the protection of ecological systems and services (c-vpess), 2008. Retrieved July 4, 2014.
 - [42] S. Comello, M. Lepech, and B. Schwegler. Project-level assessment of environmental impact: Ecosystem services approach to sustainable management and development. Journal of Management in Engineering, 28(1):5–12, 2012.
- [43] Kenneth Arrow, Gretchen Daily, Partha Dasgupta, Simon Levin, Karl-Göran M aler, Eric
 Maskin, David Starrett, Thomas Sterner, and Thomas Tietenberg. Managing ecosystem
 resources. Environmental Science & Technology, 34(8):1401–1406, 2000.

[44] Richard T. Carson. Contingent valuation: A user's guide. Environmental Science & Tech-599 nology, 34(8):1413–1418, 2000. 600 [45] Rebecca L. Goldman, Barton H. Thompson, and Gretchen C. Daily. Institutional incentives 601 for managing the landscape: Inducing cooperation for the production of ecosystem services. 602 Ecological Economics, 64(2):333 – 343, 2007. Special Section - Ecosystem Services and 603 Agriculture Ecosystem Services and Agriculture. 604 [46] H. Scott Matthews and Lester B. Lave. Applications of environmental valuation for deter-605 mining externality costs. Environmental Science & Technology, 34(8):1390–1395, 2000. 606 [47] S. Pagiola. How much is an ecosystem worth?: assessing the economic value of conservation. 607 World Bank Publications, 2005. 608 [48] Amy M. Villamagna, Paul L. Angermeier, and Elena M. Bennett. Capacity, pressure, 609 demand, and flow: A conceptual framework for analyzing ecosystem service provision and 610 delivery. Ecological Complexity, 15(0):114 - 121, 2013. 611 [49] A.P.E. Van Oudenhoven, K. Petz, R. Alkemade, L. Hein, and R.S De Groot. Framework for 612 systematic indicator selection to assess effects of land management on ecosystem services. 613 Ecological Indicators, 21:110–122, 2012. 614 [50] Alison G. Power. Ecosystem services and agriculture: tradeoffs and synergies. Philosophical 615 Transactions of the Royal Society B: Biological Sciences, 365(1554):2959–2971, 2010. 616 [51] Rogier P.O. Schulte, Rachel E. Creamer, Trevor Donnellan, Niall Farrelly, Reamonn Fealy, 617 Cathal O'Donoghue, and Daire O'hUallachain. Functional land management: A framework 618 for managing soil-based ecosystem services for the sustainable intensification of agriculture. 619 Environmental Science & Policy, 38(0):45 - 58, 2014. 620 [52] Charles J. Vörösmarty, Pamela Green, Joseph Salisbury, and Richard B. Lammers. Global 621 water resources: Vulnerability from climate change and population growth. Science, 622 289(5477):284-288, 2000.623 [53] L. Boithias, V. Acuna, L. Vergonos, G. Ziv, Marce R., and S. Sabater. Assessment of 624 the water supply: demand ratios in a mediterranean basin under different global change 625 scenarios and mitigation alternatives. Science of the Total Environment, 470:567–577, 626 2014.627 [54] Nancy E. Bockstael, A. Myrick Freeman, Raymond J. Kopp, Paul R. Portney, and V. Kerry 628 Smith. On measuring economic values for nature. Environmental Science & Technology, 629 34(8):1384-1389, 2000.630 [55] Sangwon Suh, Manfred Lenzen, Graham J. Treloar, Hiroki Hondo, Arpad Horvath, Gjalt 631 Huppes, Olivier Jolliet, Uwe Klann, Wolfram Krewitt, Yuichi Moriguchi, Jesper Munks-632 gaard, and Gregory Norris. System boundary selection in life-cycle inventories using hybrid 633 approaches. Environmental Science & Technology, 38(3):657-664, 2004. 634 [56] Manfred Lenzen and Robert Crawford. The path exchange method for hybrid LCA. Envi-635 ronmental Science & Technology, 43(21):8251-8256, 2009. 636 [57] R. A. Urban and B. R. Bakshi. Techno-ecological synergy as a path toward sustainability 637 of a North American residential system. Environmental Science & Technology, 47(4):1985-638 1993, 2013. 639 [58] L.B. Lave, E. Cobas-Flores, C.T. Hendrickson, and F.C. McMichael. Using input-output 640 analysis to estimate economy-wide discharges. Environ. Sci. Technol., 29(9):420-426, 1995. 641 [59] N. U. Ukidwe and B. R. Bakshi. Thermodynamic accounting of ecosystem contribution to 642 economic sectors with application to 1992 US economy. Environmental Science & Technol-643 ogy, 38(18):4810-4827, 2004.644 [60] Swiss Centre for Life Cycle Inventories. Ecoinvent life cycle inventory database. www. 645 ecoinvent.ch. accessed January 18, 2013. 646

[61] Y. Yu, K. Hubacek, K. Feng, and D. Guan. Assessing regional and global water footprints 647 for the UK. Ecological Economics, 69:1140–1147, 2010. 648 [62] Edgar G. Hertwich and Glen P. Peters. Carbon footprint of nations: A global, trade-linked 649 analysis. Environmental Science & Technology, 43(16):6414–6420, 2009. 650 [63] M. Lenzen, D. Moran, K. Kanemoto, and A Geschke. Building EORA: A global multi-651 region input-output database at high country and sector resolution. Economic Systems 652 Research, 25(1):20-49, 2013. 653 [64] i-Tree: Tools for assessing and managing community forests. accessed November 3, 2014. 654 [65] R. H. Kadlec and S. D. Wallace. Treatment Wetlands. CRC Press, second edition, 2009. 655 [66] Natural capital project. www.naturalcapitalproject.org. Accessed on February 10, 656 2012.657 [67] Erik Nelson, Heather Sander, Peter Hawthorne, Marc Conte, Driss Ennaanay, Stacie Wolny, 658 Steven Manson, and Stephen Polasky. Projecting global land-use change and its effect on 659 ecosystem service provision and biodiversity with simple models. PLoS ONE, 5(12):e14327, 660 12 2010. 661 [68] UNEP/GRID-Arendal Maps and Graphics Library. Increased global water stress. http: 662 //maps.grida.no/go/graphic/increased-global-water-stress, 2009. accessed May 663 15, 2011. 664 [69] Julia Stürck, Ate Poortinga, and Peter H. Verburg. Mapping ecosystem services: The 665 supply and demand of flood regulation services in europe. *Ecological Indicators*, 38(0):198 666 -211, 2014.667 [70] David J Nowak and Daniel E Crane. Carbon storage and sequestration by urban trees in 668 the USA. Environmental pollution, 116(3):381–9, January 2002. 669 [71] C.J.E. Schulp, S. Lautenbach, and P.H. Verburg. Quantifying and mapping ecosystem 670 services: Demand and supply of pollination in the european union. Ecological Indicators, 671 36(0):131 - 141, 2014.672 [72] Trucost plc - taking the environment into account. http://www.trucost.com/what-we-do. 673 accessed July 4, 2014. 674 [73] N. Faber, R. Jorna, and Van Engelen J. The sustainability of "sustainability" - a study 675 into the conceptual foundations of the notion of "sustainability". Journal of Environmental 676 Assessment Policy and Management, 7(1):1–33, 2005. 677 [74] TSC Industries vs. Northway, Inc. http://supreme.justia.com/cases/federal/us/ 678 426/438/, 1976. 426 U.S. 438. 679 [75] Kenneth J. Arrow, Partha Dasgupta, Lawrence H. Goulder, Kevin J. Mumford, and Kirsten 680 Oleson. Sustainability and the measurement of wealth. Environment and Development 681 Economics, 17:317-353, 6 2012. 682 [76] Geoffrey Heal. Valuing ecosystem services. *Ecosystems*, 3(1):24–30, 2000. 683 [77] Jane C Bare, Patrick Hofstetter, David W Pennington, and Helias A Udo Haes. Midpoints 684 versus endpoints: The sacrifices and benefits. The International Journal of Life Cycle 685 Assessment, 5(6):319–326, 2000. 686 [78] Nicholas Z. Muller, Robert Mendelsohn, and William Nordhaus. Environmental accounting 687 for pollution in the United States economy. American Economic Review, 101:1649–1675, 688 2011.689 [79] B. R. Bakshi, A. Baral, and J. L. Hau. Thermodynamic methods for resource accounting. 690 In B. R. Bakshi, T. G. Gutowski, and D. P. Sekulic, editors, Thermodynamics and the 691 Destruction of Resources. Cambridge University Press, 2011. 692 [80] Kent H. Redford and William M. Adams. Payment for ecosystem services and the challenge 693 of saving nature. Conservation Biology, 23(4):785–787, 2009. 694