Appraising Agricultural Greenhouse Gas Mitigation Potentials: Effects of Alternative Assumptions

Uwe A. Schneider* Assistant Professor Research Unit Sustainability and Global Change Center for Marine and Climate Research Hamburg University Bundesstrasse 55 D-20146 Hamburg, Germany *schneider@dkrz.de* 49-40-428386593

Research Associate Forestry Project International Institute of Applied Systems Analysis (IIASA) Schlossplatz 1 A-2361Laxenburg, Austria

> Bruce A. McCarl Regents Professor Department of Agricultural Economics Texas A&M University 2124 TAMU College Station, TX 77843-2124 *mccarl@tamu.edu* 1-979-845-1706

Working Paper FNU-81

Hamburg, Germany, July 2005

* Corresponding Author

Abstract

There is interest in society in general and in the agricultural and forestry sectors concerning a land based role in greenhouse gas mitigation reduction. Numerous studies have estimated the potential supply schedules at which agriculture and forestry could produce greenhouse gas offsets. However such studies vary widely in critical assumptions regarding economic market adjustments, allowed scope of mitigation alternatives, and region of focus. Here, we examine the effects of using different assumptions on the total emission mitigation supply curve from agriculture and forestry in the US. To do this we employ the US based Agricultural Sector and Mitigation of Greenhouse Gas Model and find that variations in such factors can have profound effects on the results. Differences between commonly employed methods shift economic mitigation potentials from –55 to +85 percent. The bias is stronger at higher carbon prices due to afforestation and energy crop plantations which reduce supply of traditional commodities. Lower carbon prices promote management changes with smaller impacts on commodity supply.

Key words: greenhouse gas emission mitigation, Agriculture, forestry, economic potential,

1 2 3

Appraising Agricultural Greenhouse Gas Mitigation Potentials: Effects of Alternative Assumptions

4 Carbon sequestration in agricultural and forest soils as well as in standing trees has received 5 substantial attention within the policy, energy, and agriculture and forestry (AF) communities. 6 This attention has arisen due to: 7 1. The widely accepted link between greenhouse gas (GHG) emissions and projected 8 climate change (Petit et al. 1999). 9 2. The global dialogue over GHG emission reductions including the emergence of emission 10 reducing agreements such as the Kyoto Protocol (Bolin 1998, Najam, Huq, and Sokona 11 2003). 12 3. Projected high-costs for GHG emission offset production in some sectors of the economy 13 (Viguier, Babiker and Reilly, 2003) coupled with projected low costs from some agricul-14 tural sources (Richard and Stokes, 2004, Pautsch et al. 2001). 15 4. Co-benefits of GHG emission reduction activities with other AF-related societal goals 16 like soil conservation, pollution control, improved water quality (Lal et al. 2004) and 17 farm income support (Schneider and McCarl, 2003, Schneider and McCarl, 2005), and 18 5. Emergence of GHG offset markets (Johnson and Heinen, 2004, Hasselknippe, 2003). 19 This interest is beginning to stimulate policy action. In the U.S. bills have been introduced 20 into Congress and discussions are being held in both environmental and agricultural agencies 21 regarding policy and/or program design. Many factors need to be considered in formulating 22 appropriate GHG emission reduction policy and programs. Substantial literature is emerging 23 regarding soil science and forest management aspects of and potential for carbon sequestration 24 (Lal 1998, Marland et al., 2004, Johnson and Curtis 2001). However, depending on the 25 appraisals' scope and methods, the true competitive potential may be much smaller than 26 estimated through the appraisal (McCarl and Schneider 2001). Thus, the political interest may 27 often be founded in engineering based estimates of per hectare net GHG emission estimates times 28 an estimate of the applicable acreage without regard to the cost of generating such emissions or 29 any market implementation issues (Lal 1998, Dendoncker et al. 2004, Neufeldt 2005). In this

paper we will explore the impact of methodological differences on the magnitude of the GHG
 emission mitigation potential in the AF sectors of the US.

3 **Agriculture and Forestry GHG Emission Reduction: Concepts** 4 Before comparing various methods and assumptions for the estimation of emission 5 mitigation potential, let us briefly review the mechanisms through which AF can participate. 6 Following the arguments in McCarl and Schneider (1999, 2000), AF may mitigate GHG 7 emissions by 8 • creating or expanding sinks to enhance terrestrial absorption of atmospheric GHGs 9 (carbon sequestration); 10 • reducing emissions generated during AF operations; and 11 • providing products such as biofuel feedstocks that ultimately substitute for GHG emission 12 intensive products and thereby displace emissions. 13 Each of these options will be discussed below. 14 **Carbon Sequestration** 15 Atmospheric CO2 (CO₂) buildup is the most prevalent GHG (Schlesinger 2001; North 2001). 16 Terrestrial carbon sequestration offers a possible way of reducing atmospheric CO₂ 17 concentrations. CO₂ is exchanged continuously between the terrestrial biosphere and the 18 atmosphere. Chlorophyllic plants absorb it through photosynthesis and use the contained carbon 19 to build organic matter. Thus, carbon directly accumulates as plants grow. At the end of plant life, 20 most of the organic carbon is quickly released to the atmosphere through oxidization, microbial 21 decomposition and/or combustion. However, some of the carbon enters other terrestrial pools

22 (humus, wood products, etc.).

23 Scientists estimate that about 80 percent of global carbon is stored in soils or forests (IPCC 2000)

and that a substantial proportion of the carbon originally contained in soils and forests has been

25 released due to past AF activities and deforestation. Collectively, these facts imply that there is

26 substantial potential for AF activities to sequester carbon (Lal et al. 1998).

There are two fundamental physical processes through which carbon sequestration can be enhanced: increasing the amount of carbon accumulated in soils or trees and decreasing microbial decomposition and combustion (Paustian et al. 2001). Management actions that increase carbon 1 inputs to soils and trees include expansion of forested areas, delay of the time of forest harvest,

2 increase in forest growth rates through enhanced silvicultural practices, adoption agricultural

3 practices that minimize soil disturbance and erosion, increasing retention of crop or logging

4 residue, and maximization of water- and nutrient-use efficiency of crop production.

5 <u>Emission Reductions</u>

6 The IPCC (1996) estimates that on a global basis, agriculture emits about 50 percent of all 7 Methane (CH_4), 70 percent of all nitrous oxide (N2O), and 20 percent of all CO2. Methane is 8 emitted in AF through enteric fermentation of ruminant animals, anaerobic livestock manure 9 decomposition, rice cultivation, and termites. Possible abatement strategies include altering crop 10 choice, livestock herd size, livestock feeding and rearing practices, and manure management. 11 N₂O emissions arise from manure, legumes, and fertilizer use and can be abated by reducing livestock herd size and changing crop mixes and fertilization practices. CO₂ is emitted from fossil 12 13 fuel usage, oxidization of soil organic matter, deforestation, and biomass decomposition or 14 burning. Emissions can be reduced by decreasing fossil fuel use; changing the allocation of land 15 among crops, pasture, grass lands, and forests; increasing forest harvest intervals; improving crop 16 residue management; and restoring degraded land. Forest management practices that reduce 17 emissions include diminished deforestation or logging, protection of forest reserves, and 18 improved disturbance management with respect to fire and pest outbreaks. 19 The relative magnitude of these emission sources varies substantially across countries, with 20 the greatest differences occurring between developing and developed countries. Deforestation and 21 land degradation mainly occur in developing countries while developed countries slightly 22 increase their forest base (FAO 1997). Developed country agriculture generally uses more

23 capital-intensive production systems¹, resulting in higher fossil-fuel-based emissions.

24 Product Substitution

AF biomass products may replace fossil fuel intensive products such as electrical power and liquid fuels. The use of biomass energy mitigates CO2 emissions because most of the carbon released at combustion time is recycled carbon. Kline, Hargrove, and Vanderlan (1998), for example, estimate that only 5 percent of the carbon emitted through poplar-fed electrical power

¹ Aggregate estimates of tractor inventory show developed countries using about three times as many tractors as developing countries on an agricultural area that is 40 percent smaller (FAO 1999)

plants pertains to fossil fuels. The remaining 95 percent pertains to carbon photosynthetically
absorbed from the atmosphere during biomass growth. Use of pure fossil fuel products, on the
other hand, increases atmospheric CO2 concentrations by 100 percent of the contained CO2 plus
emissions related to extraction and processing of these fuels.

5 Forestry products also can be used as substitutes for fossil-fuel-intensive steel and concrete 6 in construction (Marland and Schlamadinger 1997, Brown 1999, and Brown et al. 1996 elaborate 7 on this point). Finally, there may be gains from substituting cotton and other fibers for petroleum-8 based synthetics.

9

GHG Emission Mitigation Potential: Appropriate Appraisal Scope

10 Emission mitigation efforts may be complimentary (profitable) or competitive (costly) with 11 traditional agricultural and forest business. However, in a world where for a long time emissions 12 have not imposed a direct cost to businesses, it is safe to assume that the majority of truly 13 complimentary options have already been adopted voluntarily and evolved into common business 14 strategies while the majority of truly competitive options have been idle. For example, while 15 many farmers have employed intensive tillage methods which led to lower soil organic matter 16 levels, they have prevented soil organic carbon levels from becoming too low and used humus-17 increasing measures such as manure applications or cover crops to reap the benefits of higher soil 18 productivities. Consequently, the mitigation options "left to implement" are generally those 19 which for economic reasons have not been adopted in the past. This implies that appraisals of 20 realistic AF-generated mitigation potentials should incorporate the cost of mitigation. 21 Particularly, we believe that an appropriate appraisal should entail four important economic 22 matters. These include 23 • factors that would cause an AF producer to adopt a strategy,

- regional scope and market feedbacks
- competition across alternative strategies, and
- multi-gas trade-offs.
- 27 A brief discussion of these matters follows below.

28 <u>Factors Causing Strategy Adoption by Agricultural and Forestry Producers</u>

While policymakers and others may desire certain AF GHG offset practices, the farm or forest operator ultimately controls the practices employed. Farmers and foresters adopt those 1 practices that maximize their well-being. Well-being, however, is complex involving many

- 2 dimensions, such as
- 3 practice profitability,
- risk exposure,
- 5 time availability of resources required to use the practice,
- amount of training and/or learning required to employ the practice,
- willingness to adopt the degree of management required to employ the practice,
- 8 consistency of the practice with existing machinery,
- willingness and ability to invest in new machinery required to employ the practice,
- desire for environmental stewardship coupled with the environmental attributes of
 practice, and
- necessity to perform in compliance with imposed regulations.

Some practices currently used by farmers and foresters are desirable from a GHG emission mitigation point of view. In such cases, the operator has judged the practice superior to other alternatives, even in the absence of adoption incentives. However, in other cases the desired practices are not used. To convince farmers to adopt such practices, regulations or incentives are needed. The incentives may be a mixture of direct instruments (such as carbon-related payments) and indirect instruments (such as sequestration shortfall insurance, investment subsidies, and training programs).

20 Consider for example the adoption of no-till farming as opposed to conventional moldboard 21 plowing. Discussions with farmers (see Bennett 1999) reveal reservations about the adoption of 22 no-till due to factors such as

- potential yield losses due to slower warming of untilled soils during cool spring planting
 seasons;
- potential yield reductions due to other factors;
- potential cost increases, particularly for weed and insect control;
- need to acquire new expensive equipment;
- critical reliance on the effectiveness of chemical weed control compounds and the need
 for continued efficacy of weed control;
- learning time to effectively employ the practice; and
- willingness on behalf of older farmers to switch practices.

All of these factors affect the magnitude of the financial incentives required to stimulate adoption. A lower bound on the needed incentive could be calculated as the foregone net income due to average yield loss (note yield gains are possible) plus the net value of any cost change. In developing efficient policies, however, incentives above and beyond lost income may be needed to overcome other barriers to adoption. Pautsch et al. (2001), for example, indicate that nominally profitable practices may not always result in full adoption.

8 Regional scope and market feedbacks

9 Economic potential can be appraised at the field, farm, regional, or sector level. Farm-level 10 assessments examine the incentives needed to induce participation on individual farms or 11 relatively detailed farm type classes (Pautsch et al. 2001, de Cara and Javet 2000). However, such 12 appraisal results are typically based on assumed exogenous and fixed prices and thus may be 13 misleading. The following calculation will illustrate why AF GHG mitigation efforts might 14 substantially impact market prices for traditional AF commodities. U.S. cropland amounts to 15 approximately 325 million acres (132 million hectares). The literature suggests an annual 16 maximum potential for agricultural carbon sinks of around one and a half tons of carbon per acre 17 of cropland through afforestation (Newell and Stavins 2000). Food will still need to be produced 18 so it is inconceivable that more than half of the acreage could convert. As a result, the total 19 annual agricultural-cropland-based contribution to carbon storage may be bounded at about 250 20 million metric tons. The annual U.S. provisions if it complied with the Kyoto Protocol would be 21 in the neighborhood of 600-700 million metric tons. If a strong GHG emission mitigation 22 program diverted almost half of US cropland, that would imply similar reductions in crop 23 production, leading to higher market prices. Higher market prices for traditional AF commodities 24 would raise the opportunity cost of mitigation strategies and thus make AF mitigation more 25 expensive the more cropland is involved. To account for these complex interactions, a sector-26 level approach that simultaneously analyzes mitigation impacts and impacts on the traditional 27 agricultural sector is needed.

28 <u>Competition Across Alternative Strategies</u>

The potential of certain AF GHG emission mitigation strategies is not independent of the level of other strategies. For example, the more cropland farmers allocate to biofuels, the less

1

cropland is available for establishing permanent forests or adopting GHG emission friendly
tillage practices. Complementary relationships also emerge; farmers may supply corn for ethanol
processing and at the same time sequester soil carbon through minimum tillage and offset
emissions by reducing fossil fuel usage. Thus, simultaneous consideration of potential strategies
rather than independent appraisal would appear to be appropriate.

6 <u>Multiple Gas Trade-offs</u>

7 AF enterprises contribute to emissions of multiple GHGs. A crop-livestock farm releases 8 CO2 when combusting the fuel necessary to operate field machinery, emits N2O through fertilizer 9 applications, releases CH4 through enteric fermentation from ruminant animals or as a manure 10 by-product, but possibly augments the soil carbon stock by using reduced tillage. Trade-offs 11 between these emissions may occur if, for example, more fertilizer is needed under reduced 12 tillage or if usage of growth hormones for animals alters the required acreage to produce feed. 13 Multiple gases can be considered using the global warming potential (GWP) concept. The 14 GWP compares the radiative force of the various GHGs relative to CO2 over a given time (IPCC 15 1996). The one-hundred-year GWP for CO2 equals 1. Higher values for CH4 (23) and N2O (298) reflect a greater per ton heat-trapping ability. Thus, multiplying an emission quantity by the GWP 16 17 forms a "carbon equivalent" measure after factoring in an adjustment for the molecular weight of 18 carbon in CO2.

19

Mitigation Potential: Empirical Findings

20 Now we turn our attention to empirical estimates of mitigation potential. Numerous 21 appraisals have estimated the GHG emission mitigation potential from agriculture and forestry in 22 recent years (Richards and Stokes 2004, McCarl and Schneider 2000). The estimated mitigation 23 potentials however differ considerably between appraisals. These differences may partially be 24 due to different data but they are also due to different methods related to market design, strategy 25 scope, regional scope, and emission reduction incentives. Large methodological differences have 26 several negative consequences. First, they lead to different results and thus increase the 27 uncertainty of mitigation potentials. Second, they make comparisons across different studies 28 difficult. Third, they adversely influence policy decisions who give equal weight to many 29 different studies. Here, we want to alleviate some of these drawbacks and facilitate the 30 interpretation and comparison of different AF mitigation appraisals.

1 We will use the Agricultural Sector and Mitigation of Greenhouse Gas (ASMGHG) model of 2 the United States (Schneider 2000). This model features many of the characteristics advocated 3 above but does not fully account for the disincentives that are not profit related. Previously, the 4 model has been used to compute the competitive economic potential of major AF strategies in the 5 US at various incentive levels (McCarl and Schneider 2001). In this study, we will extent the 6 analysis and examine how the emission potential changes as different appraisal specifications are 7 used related to strategy interactions, interregional trade, and market feedbacks. Because the 8 alternative assumptions are examined with the same model, a consistent data set is implied.

9 The Agricultural Sector and Mitigation of Greenhouse Gas Model²

10 The ASMGHG model is an expansion of the U.S. Agricultural Sector Model (ASM) (Chang 11 et al. 1992, Chen and McCarl 2000). It is a mathematical programming based, price-endogenous 12 sector model of the agricultural sector, modified to include GHG emission accounting by 13 Schneider (2000). ASMGHG also includes data on forestry production based on the FASOM 14 model (Alig, Adams, and McCarl 1998). ASMGHG depicts production, consumption, and 15 international trade in 63 U.S. regions for 22 traditional and 3 perennial energy crops, 29 animal 16 products, 6 forest products and more than 60 processed agricultural products. Management 17 choices include tillage, irrigation, fertilization, manure treatment, and animal feeding alternatives. 18 Environmental accounts include levels of net GHG emission for CO₂, CH₄, and N₂O₂: 19 surface, subsurface, and groundwater pollution for nitrogen and phosphorous; and soil erosion. 20 ASMGHG simulates the market and trade equilibrium in agricultural markets of the United States 21 and major foreign trading partners. Domestic and foreign supply and demand conditions are 22 considered, as are regional production conditions and resource endowments. The market 23 equilibrium reveals commodity and factor prices, levels of domestic production, export and 24 import quantities, GHG emission management strategy adoption, resource usage, and 25 environmental impacts.

26 <u>Alternative Assumptions</u>

Appraisals of agriculture and forestry based GHG emission mitigation potentials encompass
 interdisciplinary research involving many natural scientists but also many economists. Market

² The Appendix provides details on the mathematical structure of ASMGHG and the scope of portrayed AF producer choices, regions, mitigation strategies, and other environmental accounts.

1 feedbacks tend to be ignored by natural scientists and some economists who use detailed farm 2 level models with constant commodity prices. To address alternative market design assumptions, 3 we use alternative specifications of ASMGHG's objective function and producer constraints. Four 4 cases are distinguished. The first case represents the basic ASMGHG setup, where commodity 5 prices are endogenous and crop and livestock producers are able to alter crop and animal choices 6 as well as their management. Second, we portray price-exogenous appraisals by modifying 7 ASMGHG's objective function. In particular, all downward sloping demand functions are 8 converted to infinitely elastic, (horizontal) demand functions. Similarly, all upward-sloping factor 9 supply functions are replaced by perfectly elastic (horizontal) supply functions. Moreover, export 10 and import quantities are fixed as well.

11 A third market design specification represents appraisals with constant prices, constant crop 12 shares, constant livestock numbers, and constant trade volumes. This type of appraisal is 13 frequently called budgeting. It resembles GIS based geographic appraisals, where economic 14 potentials are computed as so-called cost landscapes. To implement this market design, we 15 modified the ASMGHG's objective function as in case two. In addition, we imposed regional 16 crop area and livestock constraints, which forced the total crop area and the animal population to 17 stay at the level of the base solution. Thus, possible producer adaptations were limited to 18 management changes involving tillage, fertilization, irrigation, livestock manure treatment, and 19 feed diet changes. Fourth, we setup a market design case, where prices are endogenous as in case 20 one but crop acres and livestock numbers are fixed as in case three. This design represents 21 appraisals where market price adjustments are considered but only one or few crops are included 22 in the model.

23 Another important difference between existing appraisals of mitigation potentials concerns 24 the scope of considered strategies. Frequently, only one or a subset of all strategies is assessed 25 (Faaij et al. 1998, de Cara, Houzé, and Jayet 2005). One reason may be that researchers or whole 26 research teams are sometimes exclusively devoted to particular options, i.e. certain energy crop 27 options, agricultural tillage systems, forest management alternatives, or non-CO₂ opportunities. 28 Such appraisals neglect competitive or complimentary effects with other strategies. To address 29 this issue, we design five alternative scenarios were we only permit particular strategies to be 30 eligible for a combined tax/subsidy policy. First we made all greenhouse gas accounts eligible 31 (see Appendix for a list). In turn we specified scenarios where the policy affects only a) fossil

fuel emissions and biofuel offsets, b) sequestration from afforestation, c) sequestration from soil
 carbon changes through either tillage or land-use changes, and d) N2O and CH4 emissions.

3 Existing appraisals reveal also a large variation in regional scope. Some studies portray only 4 a relatively small region in the first place (Neufeldt 2005). Others consider several countries or 5 the whole globe but their estimates are simple summations of many independent country or sub-6 country appraisals (Makundi and Sathaye 2003). Very few studies appraise multinational or 7 global potentials with individual regions assessed simultaneously (Reilly et al. 1999). The first 8 two approaches are likely to overstate mitigation potentials due to emission leakage. Emission 9 intensive activities are exported out of the small appraisal regions. To emulate the effects of 10 different regional scopes, we consider 10 major regions in US (see Appendix). For each of the 10 11 regions, we construct models that reflect policy being active only in one macro-region at a time. 12 As basic setup, we impose the carbon price simultaneously on all regions in ASMGHG.

13 Finally, different mitigation incentives are implemented by specifying 32 different carbon 14 price levels ranging from \$0 to \$500 per metric ton of carbon equivalent (mtce). These carbon 15 prices are imposed on different greenhouse gas accounts depending on the chosen assumption 16 about the strategy and region scope. For N2O and CH4 emissions when eligible, the carbon price 17 was inflated by the 100-year global warming factor of those gases relative to CO2 divided by the 18 conversion rate from carbon to CO2 (3.667). The use of several carbon prices is a common 19 approach in the literature to address the uncertainty of future carbon prices and to trace out an 20 emission reduction supply curve. In the context of this study, we employ a wide range of carbon 21 prices also to find out whether the impacts of regionality, strategy, and market assumptions differ 22 across different incentive levels.

Combining 32 carbon price levels, 4 market and producer adjustment designs, 5 strategy
 scope options, and 11 regional specifications yields 7040 potential ASMGHG runs that would
 require about half a year of computing time on a standard computer. To make our analysis less
 computer time demanding, we solve ASMGHG only for a subset of the above combinations.
 Particularly, we investigate the following combinations of assumptions:

- 28
- 29

• Regionally independent appraisals with simultaneous strategy implementation and full producer and market price adjustments,

30 31 • Regionally independent appraisals with individual strategy implementation and full producer and market price adjustments,

1	•	National appraisals with simultaneous strategy implementation for all four producer
2		and market adjustment options,
3	•	National appraisals with independent strategy implementation and full producer and
4		price adjustment,
5	•	National appraisals with independent strategy implementation, full producer adjust-
6		ment but constant market prices
7	•	National appraisals with simultaneous strategy implementation and ignorance of all
8		costs, and
9	•	National appraisals with independent strategy implementation and ignorance of all
10		costs.

11 Measuring the Magnitude and Bias of Alternative Appraisals

12 To empirically illustrate the effect of different GHG mitigation appraisal specifications, we 13 focus on the national estimates of total mitigation potential in the US. Our first exercise is to 14 distinguish economic and technical potentials. This is shown in Figure 1. There are two technical 15 potentials estimates represented by vertical lines. These estimates are obtained by changing 16 ASMGHG's objective function from welfare maximization to a pure maximization of GHG 17 mitigation. Mitigation costs and carbon prices do not enter the model and therefore do not affect 18 the computed potential. The competitive economic potential is far less than the technical 19 potential. Even at a relatively high carbon price of \$100/mtce, it amounts only to about 50 percent 20 of the simultaneous technical potential. The competitive potential is also substantially lower than 21 the geographic potential, where price effects and strategy interactions have been ignored. The 22 highest overstatement is given however by the sum of independent technical potentials. The 23 overstatement results from a combination of cost negligence and permission to use land several 24 times for options which are mutually exclusive in reality.

The impact of different market and producer adjustment specifications is illustrated in Table 1 and Figure 2. The line labeled "endogenous acres and prices" represents our reference mitigation function where the fully endogenous ASMGHG version is used to compute the economic potential of AF in the US. This reference function takes into account agricultural market adjustments as well as full adaptations for crop and livestock producers. All three alternative specifications show substantial deviations from the reference function. Particularly, the assumption of constant prices leads to large overstatements of the economic potential. 1 Restricted adaptation on the other hand underestimates the economic potential. Moreover,

2 deviations are generally larger at higher mitigation incentive levels.

3 The direction and magnitude of the estimated deviations can be understood by reviewing the 4 nature of the multi strategy equilibrium as discussed in McCarl and Schneider 2001. Therein we 5 found that at small incentive levels strategies are pursued which are close to existing cropping 6 practices and land allocations, i.e. adoption of reduced or zero tillage, and which exhibit 7 relatively small GHG emission mitigation rates. At higher incentives, strategies are pursued that 8 yield higher rates of GHG emission mitigation but generally involve a strong deviation from 9 traditional production practices. Namely afforestation and perennial energy crop plantations 10 displace traditional crops and reduce the possible area for tillage based soil carbon sequestration. 11 Further, at lower incentive levels, all market specifications give similar results because market 12 adjustments are relatively minor. At higher incentive levels, the assumption of constant 13 commodity prices understates the rising opportunity cost for the diversion of traditional cropland 14 to energy crop plantation or forests. In other words, the more traditional cropland shrinks, the 15 more increase prices and revenues for traditional commodities lowering incentives for further 16 cropland conversions.

The assumption of constant crop acreage leads to the opposite effect because deviations from the current crop mix are prohibited and, more importantly, energy plantation and afforestation options are excluded. A combination of constant prices and restricted adaptation (case labeled: "constant prices and acres") introduces both a positive and a negative bias. While in our analysis the two opposite bias cancel at an incentive level of about \$100 per mtce, one should be aware that this effect is purely spurious should not be used to recommend the underlying simple appraisal method.

24 Next, we examine the impact of different appraisal scopes regarding mitigation strategy and 25 regions (Figure 3). As before, we use the fully endogenous ASMGHG with all regions and all 26 strategies as reference function. This function is labeled "comb. regions, comb. strategies" and is 27 computed based on 32 ASMGHG solutions for 32 different mitigation incentives. The second 28 line "indv. regions, comb. strategies" uses information from 320 ASMGHG solutions 29 representing specifications of 32 incentive levels and 10 regional models. Basically, at each 30 incentive level, ASMGHG is solved 10 times, each time imposing the mitigation policy in a 31 different US macro region. The national economic potential is then computed as sum of the 10 32 independently obtained regional economic potentials. Figure 3 shows that this method

substantially overstates the reference potential. Differences reflect the interregional emission
leakage within the US, which occurs especially at higher carbon prices because high mitigation
incentives promote afforestation and energy crop plantations. For example, at a carbon price of
\$100 per mtce, the sum of independently computed regional potentials exceeds the simultaneous
potential by about one third. At carbon prices below \$50 per mtce, the difference is smaller
(Table 1).

7 The third line in Figure 3 ("comb. regions, indv. strategies") uses information from 96 8 ASMGHG solutions representing specifications of 32 incentive levels and 4 independent strategy 9 appraisals as described in the previous section. The bias from summing independently obtained 10 strategy potentials versus appraising all strategies simultaneously reaches considerable 11 overstatements at high carbon prices. Overstatements result primarily from the ignored resource 12 competition between different AF mitigation strategies. Simply speaking, land diverted to 13 perennial energy grasses cannot be used for afforestation. This obvious fact is violated by 14 summing independent strategy potentials. However, the sum of independent strategy potentials 15 can also understate the joint mitigation potential if two strategies are complementary rather than 16 competitive. For example, the adoption of zero tillage does not only sequester soil carbon but 17 may also result in less fossil fuel use because the energy intensive plowing operation is cut out. 18 Thus, zero tillage may result in higher economic potentials under appraisals that consider both 19 fossil fuel reductions and soil carbon sequestration. Similarly, reduced nitrogen fertilization 20 reduces both embodied carbon emissions and N2O emissions on the field. More generally, 21 complementary GHG mitigation strategies in AF relate to crop management changes. The 22 underestimation from ignoring complementary relationships is however minor in comparison to 23 the overestimation from ignoring competitive relationships. For carbon prices at or below \$50 per 24 mtce, mitigation is primarily due to management changes but the economic potentials between 25 joint and independent appraisals are fairly close. 26 Finally, the line labeled "indy. regions, indy. strategies" represents the sum of independent

regional and independent mitigation strategy appraisals and uses information from 1280
ASMGHG solutions (32 carbon prices times 10 macro regions times 4 strategy classes). The
resulting economic potential bias is highest especially for high carbon prices with high strategy
competition and high leakage potential.

1

Concluding Remarks

2 Agriculture and forestry can mitigate a substantial quantity of greenhouse gases through 3 source emission reductions, biofuel offsets, and carbon sequestration via growing trees, land use 4 change, or tillage change. Numerous studies have tried to quantify the emission abatement 5 potentials of these options. Wide differences have been revealed between technical and economic 6 potential estimates with the latter being substantially lower. This study shows that estimates of 7 economic potentials may also differ greatly among themselves depending on the scope of the 8 associated appraisal. Assumptions about producer adaptations, market adjustments, strategy 9 competition, multi-GHG trade-offs, and the regional scope of the appraisal can considerably 10 affect the magnitude of the estimated economic potential.

Our findings can be summarized into a set of major points. First, when comparing economic potential estimates from different studies, one should carefully examine the underlying assumptions particularly in terms of market price response, regionality and scope of allowed mitigation alternatives. The few assessments cited in this study already illustrate diversity in such factors within appraisal methods.

16 Second, market feedbacks are important whenever GHG mitigation strategies notably alter 17 commodity supply. This is the case for perennial energy plantations and afforestation. It is also 18 true for crops that are primarily produced as input for biorefineries. Tillage changes, on the other 19 hand, have a very small impact on commodity supply. Thus, market feedbacks are important 20 when examining relatively strict GHG policies because perennial energy plantations and 21 afforestation need relatively large incentives to become attractive to AF producers. Small GHG 22 mitigation incentives, i.e. below \$50 per mtce, favor reduced tillage options and are not likely to 23 affect commodity prices a lot. The omission of market price adjustments overstates the economic 24 potential of strategies, which reduce traditional commodity supply. Alternatively, if a mitigation 25 strategy would increase traditional commodity supply, then omission of market price adjustments 26 could also understate the economic potential. Perhaps a long-lasting adoption of zero tillage 27 might lead to increased yields after a decade because enhanced soil organic matter increases a 28 soil's productivity and fertility. Current data, however, do not support strong positive yield 29 impacts from reduced tillage.

Third, economic potential estimates strongly depend on the degree to which the appraisal
 allows for AF producer adaptation. As shown by McCarl and Schneider (2001), the economic
 potential of carbon offsets from perennial energy crops is much higher when competing strategies

1 such as carbon sequestration are prohibited rather than simultaneously allowed. This study shows 2 that the bias from limited adaptation for the total economic potential across AF strategies can be 3 positive or negative. A negative bias, i.e. an understatement of the total economic potential occurs 4 because fewer options reduce the adaptability and flexibility of AF producers and thus virtually 5 increase the cost of mitigation. However, if the total economic potential is appraised as the sum 6 of different individual strategy assessments, it can lead to a large positive bias. This 7 overstatement is due to neglected strategy competition resulting in multiple allocations of the 8 same land to different strategies, which in reality are mutually exclusive. Thus, when examining 9 the strategy scope of an appraisal, one should not only verify the number of included strategies 10 but also check whether different strategies were assessed jointly or independently. 11 Fourth, many appraisals differ in regional scope. Limited regional representation in

12 appraisals with endogenous prices and trade volumes leads to an overstatement of the economic

potential because emission intensive production can be exported causing emission leakage.
 Regional appraisals may be appropriate if the represented mitigation policy is indeed

Regional appraisals may be appropriate if the represented mitigation policy is indeed implemented at regional level and emission leakage is a real consequence. On the other hand, if sub-national appraisals were used to assess a national policy, the estimated economic emission

17 mitigation potentials will be truly overstated. This issue is particularly relevant for ASMGHG.

18 While our economic potentials for the AF sectors in the US are derived from a nationwide policy $\frac{1}{2}$

implementation, other countries were left unregulated³. A unilateral mitigation policy in the US
is, however, almost opposite to current political realities.

21 Finally, we need to address the issue of methodological feasibility and limitations. Currently, 22 there is no "one does it all model" that can appropriately appraise the true economic greenhouse 23 gas emission mitigation potential from the AF sectors. The ASMGHG model used here is no 24 exception. Limitations include the absence of detailed AF production possibilities in foreign 25 countries, the absence of non-agricultural sectors of the economy, and the coarse regional and 26 technological resolution of AF production possibilities in the US relative to detailed regional farm 27 level models, which integrate often millions of observed farm data points. Limitations arise 28 because of computational and data deficiencies. On one hand, current computers are not able to 29 simulate globally active mitigation policies with a high regional and technological resolution. On 30 the other hand, data deficiencies and intellectual property rights practically restrict the 31 opportunity for building a "one does it all" model. However, while an integrated single model

³ This assumptions is relaxed in Lee et al.

1 may be infeasible for some time to come, an appropriately linked suit of different appraisals may be an efficient second best solution. For example, several regional farm level appraisals could 2 3 provide regional abatement functions accounting for profit and non-profit aspects as well as 4 heterogeneous soil, climate, and management conditions. These aggregated farm level response functions could be integrated in agricultural sector models such as ASMGHG. In turn, ASMGHG 5 6 or similar models could estimate and provide sector level response functions for global, multi-7 sector general computable equilibrium and/or Earth system models. The findings of this paper 8 demonstrate that such an approach would be by far better than a simple adding up of regionally 9 independent appraisals of individual mitigation strategies.

References

- Alig, R.J., D.M.Adams, and B.A. McCarl. 1998. "Impacts of Incorporating Land Exchanges Between Forestry and Agriculture in Sector Models." *Journal of Agricultural and Applied Economics* 30(2): 389-401.
- Bennett, J.F. 1999. "Commentary on Marland, G., B.A. McCarl, and U.A. Schneider, Soil Carbon: Policy and Economics." In *Carbon Sequestration in Soils: Science, Monitoring, and Beyond*, edited by N.J. Rosenberg, R.C. Izaurralde, and E.L. Malone, pp. 168-170. Proceedings of the St. Michaelis Workshop, St. Michaels, MD, December 3-5, 1998.
- Bolin, B. 1998. "The Kyoto Negotiations on Climate Change: A Science Perspective." *Science* 279(16 January 1998): 330-331
- Brown, S., J. Sathaye, M. Cannell, and P. Kauppi. 1996. "Management of Forests for Mitigation of Greenhouse Gas Emissions," chap. 24 in *Climate Change 1995—Impacts, Adaptations and Mitigation of Climate Change: Scientific-Technical Analyses*, edited by R.T. Watson, M.C. Zinyowera, and R.H. Moss. Cambridge and New York: Cambridge University Press.
- Brown, S.J. 1999. "Opportunities for Mitigating Carbon Emissions through Forestry Activities." Report prepared for the World Bank, Winrock International, Arlington, VA, March.
- Chang, C.C., B.A. McCarl, J.W. Mjelde, and J.W. Richardson. 1992. "Sectoral Implications of Farm Program Modifications." *American Journal of Agricultural Economics* 74: 38-49.
- Chen, C.C. 1999. "Development and Application of a Linked Global Trade-Detailed U.S. Agricultural Sector Analysis System." PhD Dissertation, Texas A&M University, May 1999.
- Chen, C.C. and B.A. McCarl. 2000. "The Value of ENSO Information to Agriculture: Consideration of Event Strength and Trade," *Journal of Agricultural and Resource Economics* 25 (2, 2000): 368-385.
- Dantzig, G.B. and P. Wolfe. 1961. "The Decomposition Algorithm for Linear Programs." *Econometrica* 29(1961):767-778. Appendix Reference
- De Cara S. and P.A. Jayet. 2000. "Emissions Of Greenhouse Gases from Agriculture: The Heterogeneity Of Abatement Costs In France" *Europ. Rev. Agr. Econ.* 27(3, 2000):281-303.
- De Cara, S., Houzé, M. and Jayet, P.-A. (2005). "Emissions of methane and nitrous oxide from agriculture in Europe: A spatial assessment of sources and abatement costs". *Environmental and Resource Economics* (forthcoming).
- Dendoncker, N., B. Van Wesemael, M.D.A. Rounsevell, C. Roelandt, S. Lettens. 2004. "Belgium's CO2 mitigation potential under improved cropland management." *Agriculture, Ecosystems and Environment* 103 (2004): 101–116
- Faaij, A., I. Steetskamp, A. van Wijk and W. Turkenburg. 1998. "Exploration of the land potential for the production of biomass for energy in the Netherlands." *Biomass and Bioenergy* 14, (5-6, 1998): 439-456

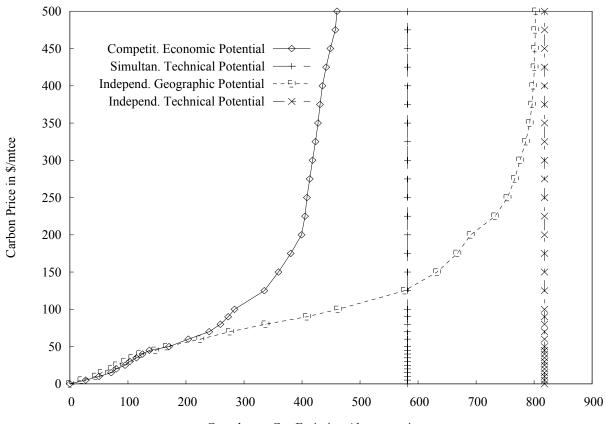
- Food and Agriculture Organization of the United Nations (FAO). 1997. "State of the World's Forests 1997." p. 16. Rome, Italy.
- Food and Agriculture Organization of the United Nations (FAO). 1999. FAOSTAT. Statistics database. http://apps.fao.org (accessed June 2001).
- Hasselknippe, H. 2003. "Systems for carbon trading: an overview." *Climate Policy* 3 (2, 2003):43-57
- Intergovernmental Panel on Climate Change (IPCC). 1996. Climate Change 1995—Impacts, Adaptations and Mitigation of Climate Change: Scientific-Technical Analyses, edited by R.T. Watson, M.C. Zinyowera, and R.H. Moss. Cambridge and New York: Cambridge University Press.
- Intergovernmental Panel on Climate Change (IPCC). 2000. Land Use, Land-Use Change, and Forestry. Cambridge and New York: Cambridge University Press.
- Johnson, D.W. and P.S. Curtis "Effects of forest management on soil C and N storage: meta analysis" *Forest Ecology and Management* 140 (2-3, 15 January 2001): Pages 227-238
- Johnson, E. and R. Heinen. 2004. "Carbon trading: time for industry involvement." *Environment International* 30 (2, 2004): 279-288
- Kline, D., T. Hargrove, and C. Vanderlan. 1998. "The Treatment of Biomass Fuels in Carbon Emissions Trading Systems." Prepared for the Center for Clean Air Policy's Greenhouse Gas Emissions Trading Braintrust, Washington, D.C., March. http://www.ccap.org/pdf/biopub.pdf.
- Lal, R., Griffin, M., J. Apt, L. Lave, and M.G. Morgan. (2004) "Managing Soil Carbon." *Science* 304(2004): 393
- Lal, R., J.M. Kimble, R.F. Follett, and C.V. Cole (1998). *The Potential of U.S. Cropland to Sequester Carbon and Mitigate the Greenhouse Effect*, pp. 128, Chelsea, MI: Sleeping Bear Press Inc.
- Lee, H.C., B.A. McCarl, U.A. Schneider, and C.C. Chen. "Leakage and Comparative Advantage Implications of Agricultural Participation in Greenhouse Gas Emission Mitigation." Forthcoming *Mitigation and Adaptation Strategies for Global Change*
- Makundi, W.R. and J.A. Sathaye. 2004. "GHG Mitigation Potential and Cost in Tropical Forestry – Relative Role for Agroforestry." *Environment, Development and Sustainability* 6(2004): 235–260.
- Marland, G., and B. Schlamadinger. 1997. "Forests for Carbon Sequestration or Fossil Fuel Substitution A Sensitivity Analysis." *Biomass and Bioenergy* 13(1997): 389-97
- Marland, G., C.T. Garten Jr., W.M. Post, and T.O. West. 2004. "Studies on enhancing carbon sequestration in soils." *Energy* 29(2004): 1643–1650

- McCarl, B. A. 1982 "Cropping Activities in Agricultural Sector Models: A Methodological Proposal." *American Journal of Agricultural Economics* 4. 64:768-772. – Appendix Reference
- McCarl, B. A. and T. H. Spreen. 1980. "Price Endogenous Mathematical Programming as a Tool for Sector Analysis." *Amer. J. Agr. Econ.* 62(1980):87-102. Appendix Reference
- McCarl, B.A. and U.A. Schneider. 2001. "Greenhouse Gas Mitigation in U.S. Agriculture and Forestry." *Science* (5551, 2001):2481-2482
- McCarl, B.A., and U.A. Schneider. 1999. "Curbing Greenhouse Gases: Agriculture's Role." *Choices*, First Quarter, pp. 9-12.
- McCarl, B.A., and U.A. Schneider. 2000. "Agriculture's Role in a Greenhouse Gas Emission Mitigation World: An Economic Perspective." *Review of Agricultural Economics* 22: 134-59.
- Najam, A., S. Huq, and Y. Sokona. 2003. "Climate negotiations beyond Kyoto: developing countries concerns and interests." *Climate Policy* 3(3, 2003): 221-231
- Neufeldt, H. 2005 "Carbon stocks and sequestration potentials of agricultural soils in the federal state of Baden-Württemberg, SW Germany." *J. Plant Nutr. Soil Sci* 168(2005): 202-211.
- Newell, R.G., and R.N. Stavins. 2000. "Climate Change and Forest Sinks: Factors Affecting the Costs of Carbon Sequestration." *Journal of Environmental Economics and Management* 40(3): 211-35.
- North, G. 2001. "Climate Change Over the Next Century." In *Global Climate Change: The Science, Economics, and Politics*. Edited by James M. Griffin. University of Chicago Press, Chicago.
- Önal, H. and B. A. McCarl. 1989. "Aggregation of heterogeneous firms in mathematical programming models." *European Review of Agricultural Economics* 4 (16, 1989):499-513. Appendix Reference
- Önal, H. and B. A. McCarl. 1991. "Exact aggregation in mathematical programming sector models." *Canadian Journal of Agricultural Economics* 2(39, 1991): 319-334. – Appendix Reference
- Paustian, K., Babcock, B., Kling, C., Hatfield, J.L., Lal, R., McCarl, B., Post, W., Mosier, A.R., Rice, C., & Robertson, G. (2001). Agricultural mitigation of greenhouse gases: Science and policy options. National Conference On Carbon Sequestration. Available on the World Wide Web: http://www.netl.doe.gov/publications/proceedings/01/carbon seq/4C2.pdf
- Pautsch, G. R., L. A. Kurkalova, B. Babcock, and C. L. Kling. 2001. "The Efficiency of Sequestering Carbon in Agricultural Soils." *Contemporary Economic Policy* 19(2001): 123– 134.
- Petit, J.R., J. Jouzel, D. Raynaud et al. 1999. "Climate and atmospheric history of the past 420,000 years from the Vostok ice core, Antarctica." *Nature* 399(1999): 429-436.

- Reilly, J., R. Prinn, J. Harnisch, J. Fitzmaurice, H. Jacoby, D. Kicklighter, J. Melillo, P. Stone, A. Sokolov, and C. Wang. 1999. "Multi-gas assessment of the Kyoto Protocol." *Nature* 401(07 Oct 1999): 549-555
- Richards, K.R. and C. Stokes. 2004. "A Review of Forest Carbon Sequestration Cost Studies: A Dozen Years of Research." *Climatic Change* 63(2004): 1–48.
- Schlesinger, W. 2001. "The Carbon Cycle: Human Perturbations and Potential Management Options." In *Global Climate Change: The Science, Economics, and Politics*. Edited by James M. Griffin. University of Chicago Press, Chicago.
- Schneider, U.A. 2000. "Agricultural Sector Analysis on Greenhouse Gas Emission Mitigation in the U.S." PhD Dissertation, Department of Agricultural Economics, Texas A&M University.
- Schneider, U.A. and B.A. McCarl. 2003. "Economic Potential of Biomass Based Fuels for Greenhouse Gas Emission Mitigation." *Environmental and Resource Economics*. 24(4): 291-312, April 2003.
- Schneider, U.A. and B.A. McCarl. 2005. "Implications of a Carbon-Based Energy Tax for U.S. Agriculture." *Agricultural and Resource Economics Review* 34(2, 2005) ****1–14
- Viguier, L.L. M.H. Babiker, and J.M. Reilly. 2003 "The costs of the Kyoto Protocol in the European Union." *Energy Policy* 31 (5, 2003): 459-481

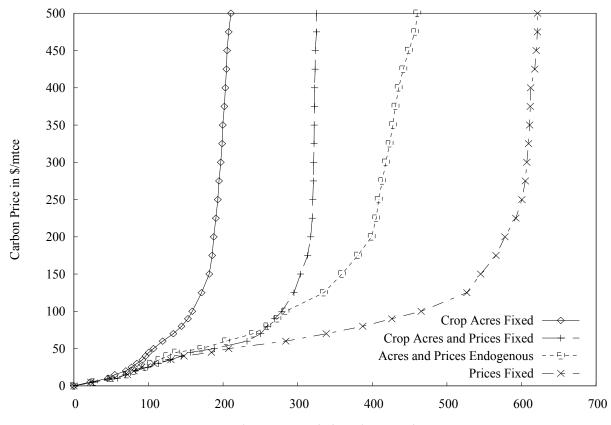
р.	F 1	a	11	al Assump		a	F 1	a .
Prices	Endog.	Const.	Endog.	Endog.	Endog.	Const.	Endog.	Const.
Regions	Simult.	Indep.	Indep.	Simult.	Indep.	Simult.	Simult.	Simult.
Strategies	Simul.	Indep.	Simult.	Indep.	Indep.	Simul.	Simult.	Simult.
Adaptation	Full	Full	Full	Full	Full	Mangmt.	Mangmt.	Full
Carbon	Potential	Bias Re	lative to C	ompetitive	e Economi	c Potentia	l (C-Econ	Column)
Tax	C-Econ	Geogr	I-Regs	I-Strats	I-RgStr	Budget	Fx-Acr	Fx-Price
\$/mtce	mmtce	%	%	%	%	%	%	%
5	27	-26.9	6.5	-0.2	-4.2	-2.1	-19.8	-17.2
10	50	-10.9	13.4	-4.1	3.4	16.4	-9.0	-2.8
15	71	-22.8	1.0	-4.8	-13.2	-2.6	-22.8	1.0
20	80	-9.7	22.0	-4.6	7.1	3.2	-12.7	0.7
25	95	-15.1	17.5	0.0	9.7	4.0	-18.8	-4.6
30	103	-7.8	22.5	3.2	15.5	9.6	-18.4	4.0
35	115	-6.2	21.8	6.3	17.4	13.1	-19.8	13.4
40	125	-3.2	22.8	5.2	16.7	15.2	-23.2	17.8
45	137	7.4	29.8	6.2	25.6	13.9	-26.7	34.5
50	171	-2.3	20.4	-0.2	25.1	10.2	-37.5	21.4
60	204	10.2	21.9	13.1	28.1	13.8	-41.7	39.3
70	240	14.8	20.5	27.4	31.7	4.2	-44.5	41.0
80	259	30.0	20.6	28.0	39.9	-0.1	-44.4	49.3
90	273	49.7	28.8	38.7	46.9	-1.4	-44.0	56.2
100	284	62.9	36.4	42.3	49.0	-1.7	-44.1	64.1
125	335	72.2	33.8	44.0	42.0	-12.0	-48.9	57.2
150	359	76.1	31.0	39.4	46.3	-15.5	-49.5	51.7
175	381	75.4	31.2	42.5	55.4	-17.7	-51.3	48.7
200	399	73.0	34.0	41.7	60.8	-20.5	-53.1	44.7
225	405	80.8	35.9	47.9	66.0	-21.1	-53.0	46.2
250	409	84.6	36.7	48.6	66.5	-21.6	-52.8	47.0
275	413	85.5	36.9	48.9	66.1	-22.3	-52.9	46.4
300	418	85.5	37.0	48.4	66.0	-23.1	-52.9	45.2
325	423	85.7	37.2	48.0	66.2	-23.9	-53.1	44.0
350	428	85.3	40.0	47.5	67.5	-24.7	-53.3	42.9
375	431	84.8	41.5	47.2	70.5	-25.2	-53.2	41.9
400	435	83.4	44.3	46.8	69.4	-25.9	-53.4	40.6
425	442	81.3	48.7	45.5	67.9	-26.8	-53.7	39.9
450	449	78.5	50.6	43.7	68.2	-27.9	-54.3	38.1
475	457	75.3	53.4	42.4	67.8	-28.9	-54.6	35.8
500	460	74.5	56.8	42.2	67.1	-29.3	-54.3	35.0

Table 1Impact of Alternative ASMGHG Appraisal Assumptions on GHG Mitigation
Potential from US Agriculture and Forestry



Greenhouse Gas Emission Abatement in mmtce

Figure 1 Economic impacts on potential on greenhouse gas emission mitigation potential from the AF in the US



Greenhouse Gas Emission Abatement in mmtce

Figure 2 Market scope impacts on the national economic potential for greenhouse gas emission mitigation in the US through AF.

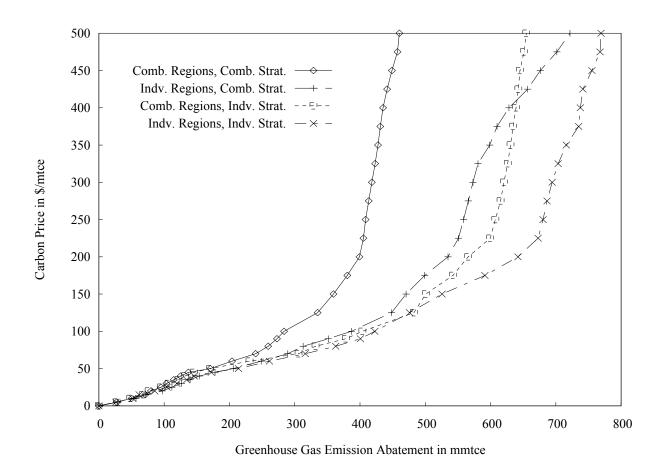


Figure 3 Impact of different region and strategy scope on greenhouse gas emission mitigation potential from the AF in the US.

Appendix

Appendix 1 Details on the Mathematical Structure of ASMGHG

This section documents the essential structure of the U.S. agricultural sector and mitigation of greenhouse gas (ASMGHG) model. Here, we focus on the general model structure, which is not affected by data updates or model expansion toward greater detail. Data and a GAMS version of a regionally aggregated ASMGHG version are available on the Internet. The aggregated model can be used to examine and verify the model structure and data and to qualitatively replicate the results presented in this article. In representing ASMGHG's mathematical structure, we will use summation notation because it corresponds very closely to the ASMGHG computer code.

ASMGHG is designed to emulate U.S. agricultural decision-making along with the impacts of agricultural decisions on agricultural markets, the environment, and international trade. To accomplish this objective, ASMGHG portrays the following key components: natural and human resource endowments, agricultural factor (input) markets, primary and processed commodity (output) markets, available agricultural technologies, and agricultural policies. Because of data requirements and computing feasibilities, sector models cannot provide the same level of detail as do farm level or regional models. Therefore, ASMGHG depicts only representative crop and livestock enterprises in 63 aggregated U.S. production regions rather than individual farms characteristics. International markets and trade relationships are portrayed in 28 international regions.

Agricultural technologies in the U.S. are represented through Leontief production functions specifying fixed quantities of multiple inputs and multiple outputs. Producers can choose among several alternative production technologies. Specifically, alternative crop production functions arise from combinations of 3 tillage alternatives (conventional tillage, conservation tillage, and zero tillage), 2 irrigation alternatives (irrigation, dryland), 4 alternative conservation measures (none, contour plowing, strip cropping, terracing), and 3 nitrogen fertilization alternatives (current levels, a 15 percent reduction, and a 30 percent reduction) specific to each U.S. region, land, and crop type⁴. Alternative livestock production functions reflect different production intensities, various manure treatment schemes, alternative diets, and pasture management for 11 animal production categories and 63 U.S. regions. Processing functions identify first or higher level processing opportunities carried out by producers.

ASMGHG is setup as mathematical programming model and contains more than 20,000 individual variables and more than 5,000 individual equations. These equations and variables are not entered individually but as indexed blocks. All agricultural production activities are specified as endogenous variables and denoted here by capital letters. In particular, the variable block CROP denotes crop management variables, LUTR = land use transformation, LIVE = livestock raising, PROC = processing, and INPS = production factor (input) supply variables. Additional variable blocks reflect the dissemination of agricultural products with DOMD = U.S. domestic demand, TRAD = U.S. interregional and international trade, FRXS = foreign region excess supply, FRXD = foreign region excess demand, EMIT = Emissions, and SEQU = Emission reduction or sequestration variables. WELF denotes total agricultural welfare from both U.S. and

⁴ We use representative crop production budgets for 63 U.S. regions, 20 crops (cotton, corn, soybeans, 4 wheat types, sorghum, rice, barley, oats, silage, hay, sugar cane, sugar beets, potatoes, tomatoes, oranges, grapefruits), 6 land classes (low erodible cropland, medium erodible cropland, highly erodible cropland, other cropland, pasture, and forest)

foreign agricultural markets. With the exception of WELF, all variables are restricted be nonnegative.

ASMGHG consists of an objective function, which maximizes total agricultural welfare (WELF) and a set of constraining equations, which define a convex feasibility region for all variables. Feasible variable levels for all depicted agricultural activities range from zero to an upper bound, which is determined by resource limits, supply and demand balances, trade balances, and crop rotation constraints⁵. Solving ASMGHG involves the task of finding the "optimal" level for all endogenous variables subject to compliance with all constraining equations. By means of ASMGHG's objective function, optimal levels of all endogenous variables are those levels which maximize agricultural sector based welfare, which is computed as the sum of total consumers surplus, producers surplus, and governmental net payments to the agricultural sector minus the total cost of production, transportation, and processing. Basic economic theory demonstrates that maximization of the sum of consumers' plus producers' surplus yields the competitive market equilibrium as reviewed by McCarl and Spreen (1980). Thus, the optimal variable levels can be interpreted as equilibrium levels for agricultural activities under given economic, political, and technological conditions.

To facilitate understanding of the ASMGHG structure, we will start with the description of the set of constraining equations and subsequently explain the objective function. Small letters represent matrix coefficients and right hand side values. Demand and supply functions are denoted in italic small letters. Equations, variables, variable coefficients, and right hand sight variables may have subscripts indicating indices with index c denoting the set of crops, f =production factors with exogenous prices (subset of index w), g = greenhouse gas accounts, h = processing alternatives, i = livestock management alternatives, j = crop management alternatives, k = animal production type, l = land transformation alternatives, m = international region (subset of index r), n = natural or human resource types (subset of index w), r = all regions, s = soil classes (subset of index n), t = years, u = U.S. region (subset of index r), w = all production factors, and y = primary and processed agricultural commodities. A list of individual set elements is available on the Internet or from the authors.

Supply and demand balance equations for agricultural commodities form an important constraint set in ASMGHG, which link agricultural activities to output markets. Specifically, the total amount of commodities disseminated in a U.S. region through domestic consumption (DOMD), processing (PROC), and exports (TRAD⁶) cannot exceed the total amount of commodities supplied through crop production (CROP), livestock raising (LIVE), or imports (TRAD). Equation block (1) shows the set of commodity supply and demand balance equations employed in ASMGHG. Note that equation block (1) is indexed over U.S. regions and commodities. Thus, the total number of individual equations equals the product of 63 U.S. regions times the 54 primary agricultural commodities.

(1)
$$-\sum_{c,s,j} \left(a_{u,c,s,j,y}^{CROP} \cdot CROP_{u,c,s,j} \right) - \sum_{k,i} \left(a_{u,k,i,y}^{LIVE} \cdot LIVE_{u,k,i} \right) - \sum_{r} TRAD_{r,u,y} + DOMD_{u,y} + \sum_{h} \left(a_{u,h,y}^{PROC} \cdot PROC_{u,h} \right) + \sum_{r} TRAD_{u,r,y} \le 0 \quad \text{for all } u \text{ and } y$$

⁵ Crop rotation constraints force the maximum attainable level of an agricultural activity such as wheat production to be equal or below a certain fraction of physically available cropland.

⁶ While the first index of the USSH and TRAD variables denotes the exporting region or country, the second denotes the importing region or country.

As shown in equation block (1), agricultural commodities can be supplied in each U.S. region through crop production activities (if cropping activity $\text{CROP}_{u,c,s,j} > 0$ with yield $a_{u,c,s,j,y}^{\text{CROP}} > 0$), livestock production activities (if activity variable $\text{LIVE}_{u,k,i} > 0$ with yield $a_{u,k,i,y}^{\text{LIVE}} > 0$), shipments from other U.S. regions (from U.S. region \tilde{u} to u if $\text{TRAD}_{\tilde{u},u,y} > 0$), or foreign imports (from foreign region m to U.S. region u if $\text{TRAD}_{m,u,y} > 0$). On the demand side, commodities can be used as an input for livestock production (if activity variable $\text{LIVE}_{u,k,i} > 0$ and with usage rate $a_{u,k,i,y}^{\text{LIVE}} < 0$), processed (if activity variable $\text{PROC}_{u,h} > 0$ with usage rate $a_{u,h,y}^{\text{PROC}} < 0$), directly sold in U.S. region u's market (if $\text{DOMD}_{u,y} > 0$), shipped to other U.S. regions (if $\text{TRAD}_{u,\tilde{u},y} > 0$), or exported to foreign markets (if $\text{TRAD}_{u,m,y} > 0$).

The coefficients $a_{u,c,s,j,y}^{CROP}$, $a_{u,k,i,y}^{LIVE}$, and $a_{u,h,y}^{PROC}$ are unrestricted in sign. While negative signs indicate that commodity y is an input for an activity, positive signs indicate outputs. The magnitudes of these coefficients along with their sign identify either input requirements or output yields per unit of activity. The structure of equation block (1) allows for production of multiple products and for multi level processing, where outputs of the first process become inputs to the next process. All activities in (1) can vary on a regional basis.

Supply and demand relationships are also specified for agricultural production factors linking agricultural activities to production factor markets. As shown in equation block (2), total use of production factors by cropping (CROP), livestock (LIVE), land use change (LUTR), and processing (PROC) activities must be matched by total supply of these factors (INPS) in each region.

(2)
$$INPS_{u,w} - \sum_{c,s,j} a_{u,c,s,j,w}^{CROP} \cdot CROP_{u,c,s,j} - \sum_{l} a_{u,l,w}^{LUTR} \cdot LUTR_{u,l} - \sum_{k,i} a_{u,k,i,w}^{LIVE} \cdot LIVE_{u,k,i} - \sum_{h} a_{u,h,w}^{PROC} \cdot PROC_{u,h} \le 0 \quad \text{for all u and w}$$

The most fundamental physical constraints on agricultural production arise from the use of scarce and immobile resources. Particularly, the use of agricultural land, family labor, irrigation water, and grazing units is limited by given regional endowments of these private or public resources. In ASMGHG, all agricultural activity variables (CROP, LUTR, LIVE, and PROC) have associated with them resource use coefficients $(a_{u,c,s,j,n}^{CROP}, a_{u,k,n}^{LUTR}, a_{u,k,n}^{PROC})$, which give the quantity of resources needed for producing one unit of that variable. For example, most crop production activity variables have a land use coefficient equaling 1. However, land use

most crop production activity variables have a land use coefficient equaling 1. However, land use coefficients are greater than 1 for some wheat production strategies, where wheat is preceded by fallow. Land use coefficients were also inflated by set aside requirements when analyzing previous features of the farm bill.

The mathematical representation of natural resource constraints in ASMGHG is straightforward and displayed in equation block (3). These equations simply force the total use of natural or human resources to be at or below given regional resource endowments $b_{u,n}$. Note that the natural and human resource index n is a subset of the production factor index w. Thus, all INPS_{u,n} resource supplies also fall into constraint set (2). The number of individual equations in (3) is given by the product of 63 U.S. regions times the number of relevant natural resources per region. (3) INPS_{u,n} $\leq b_{u,n}$ for all u and n

In ASMGHG, trade activities (TRAD_{u,m,y}, TRAD_{\tilde{m},m,y}, TRAD_{m,u,y}, TRAD_{m,m,y}) by international region of destination or origin are balanced through trade equations as shown in equation blocks (4) and (5). The equations in block (4) force a foreign region's excess demand for an agricultural commodity (FRXD_{m,y}) to not exceed the sum of all import activities into that particular region from other international regions (TRAD_{m,m,y}) and from the U.S. (TRAD_{u,m,y}). Similarly, the equations in block (5) force the sum of all commodity exports from a certain international region into other international regions (TRAD_{m,m,y}) and the U.S. (TRAD_{m,u,y}) to not exceed the region's excess supply activity (FRXS_{m,y}).

(4)
$$-\sum_{u} TRAD_{m,u,y} - \sum_{\tilde{m}} TRAD_{m,\tilde{m},y} + FRXD_{m,y} \le 0 \qquad \text{for all } m \text{ and } y$$

(5)
$$\sum_{u} TRAD_{u,m,y} + \sum_{\tilde{m}} TRAD_{\tilde{m},m,y} - FRXS_{m,y} \le 0 \qquad \text{for all } m \text{ and } y$$

The number of individual equations in blocks (4) and (5) equals the product of the number of traded commodities times the number of international regions per commodity. Because of data limitations only 8 major agricultural commodities are constraint through international trade balance equations. More details can be found in Chen (1999) and in Chen and McCarl (2000). A fifth set of constraints addresses aggregation related aspects of farmers' decision process. These constraints force producers' cropping activities CROP_{u.c.s.i} to fall within a convex combination of

historically observed choices $h_{u,c,t}$ [equation (6)]. Based on decomposition and economic duality theory (McCarl 1982, Onal and McCarl 1991), it is assumed that observed historical crop mixes represent rational choices subject to weekly farm resource constraints, crop rotation considerations, perceived risk, and a variety of natural conditions. In (6), the $h_{u,c,t}^{CMIX}$ coefficients contain the observed crop mix levels for the past 30 years. CMIX_{u,t} are positive, endogenous

variables indexed by historical year and region, whose level will be determined during the optimization process.

(6)
$$-\sum_{t} \left(h_{u,c,t}^{CMIX} \cdot CMIX_{u,t} \right) + \sum_{s,j} CROP_{u,c,s,j} = 0 \quad \text{for all } u \text{ and } c$$

The utilization of (6) has several important implications. First, many diverse constraints faced by agricultural producers are implicitly integrated. Second, crop choice constraints impose an implicit cost for deviating from historical crop rotations. Note that the sum of the CMIX variables over time is not forced to add to unity. Therefore, only relative crop shares are restricted, allowing the total crop acreage to expand or contract. Third, crop choice constraints prevent extreme specialization by adding a substantial number of constraints in each region and mimicking what has occurred in those regions. A common problem to large linear programming (LP) models is that the number of activity variables by far exceeds the number of constraint equations. Because an optimal LP solution will always occur at an extreme point⁷ of the convex feasibility region, the number of non-zero activity variables cannot exceed the number of constraints. Fourth, crop choice constraints are a consistent way of representing a large entity of small farms by one aggregate system (Dantzig and Wolfe 1961, Onal and McCarl 1989).

⁷ Suppose we have a convex set. A point in this set is said to be an extreme point if it can not be represent as a convex combination of any two other points in this set.

Crop mix constraints are not applied to crops, which under certain policy scenarios are expected to expand far beyond the upper bound of historical relative shares. Particularly, if

$$E\left[\sum_{s,j} LAND_{u,c,s,j} / \sum_{c,s,j} LAND_{u,c,s,j}\right] > Max_{t} \left(h_{u,c,t}^{CMIX} / \sum_{c} h_{u,c,t}^{CMIX}\right), \text{ then these crops should not be part}$$

of the crop mix equations. In ASMGHG, the biofuel crops of switchgrass, poplar and willow fall into this category.

The mix of livestock production is constraint in a similar way as crop production [equation (7)]. Particularly, the amount of regionally produced livestock commodities is constraint to fall in a convex combination of historically observed livestock product mixes ($h_{u,y,t}^{LMIX}$). LMIX_{u,t} are positive, endogenous variables indexed by historical year and region, whose level will be determined during the optimization process.

(7)
$$-\sum_{t} \left(h_{u,y,t}^{LMIX} \cdot LMIX_{u,t} \right) + \sum_{k,i} \left(a_{u,k,i,y}^{LIVE} \cdot LIVE_{u,k,i} \right) = 0 \quad \text{for all } u \text{ and } y$$

Agricultural land owners do not only have a choice between different crops and different crop management strategies, they can also abandon traditional crop production altogether in favor of establishing pasture or forest. Equivalently, some existing pasture or forest owners may decide to convert suitable land fractions into cropland. In ASMGHG, land use conversions are portrayed by a set of endogenous variables LUTR. As shown in (8), certain land conversion can be restricted to a maximum transfer $d_{u,l}$, whose magnitude was determined by GIS data on land suitability. If $d_{u,l} = 0$, then constraint (8) is not enforced. In such a case, land use transformations would only be constraint through constraint set (3).

(8)
$$LUTR_{u,l} \le d_{u,l}\Big|_{d_{u,l} \ge 0}$$
 for all u and l

The assessment of environmental impacts from agricultural production as well as political opportunities to mitigate negative impacts is a major application area for ASMGHG. To facilitate this task, ASMGHG includes environmental impact accounting equations as shown in (9) and (10). For each land management (CROP_{u,e,s,j} and LUTR_{u,l}), livestock (LIVE_{u,k,i}), or processing (PROC_{u,h}) activity, environmental impact coefficients ($a_{u,e,s,j,g}^{LAND}$, $a_{u,k,g}^{LUTR}$, $a_{u,k,g}^{PROC}$) contain the absolute or relative magnitude of those impacts per unit of activity. Negative values of greenhouse gas account coefficients, for example, indicate emission reductions. A detailed description of environmental impact categories and their data sources is available in Schneider (2000).

for all u and g

(9)

(10)

While the structure of equation blocks (9) and (10) can be used to account for many different environmental impacts, special focus was placed in ASMGHG on greenhouse gases. GHG emissions and emission reductions are accounted for all major sources, sinks and offsets from agricultural activities, for which data were available or could be simulated. Generally, ASMGHG considers:

- Direct carbon emissions from fossil fuel use (diesel, gasoline, natural gas, heating oil, LP gas) in tillage, harvesting, or irrigation water pumping as well as altered soil organic matter (cultivation of forested lands or grasslands),
- Indirect carbon emissions from fertilizer and pesticide manufacturing,
- Carbon savings from increases in soil organic matter (reduced tillage intensity and conversion of arable land to grassland) and from tree planting,
- Carbon offsets from biofuel production (ethanol and power plant feedstock via production of switchgrass, poplar, and willow),
- N2O emissions from fertilizer usage and livestock manure,
- CH4 emissions from enteric fermentation, livestock manure, and rice cultivation,
- CH4 savings from changes in manure and grazing management changes, and
- CH4 and N2O emission changes from biomass power plants.

All equations described so far have defined the convex feasibility region for the set of agricultural activities. Let us now turn to the objective function. The purpose of this single equation is to determine the optimal level of all endogenous variables within the convex feasibility region. Applying the McCarl and Spreen (1980) technique, we use a price-endogenous, welfare based objective function. This equation is shown in $(11)^8$.

The left hand side of equation (11) contains the unrestricted total agricultural welfare variable (WELF), which is to be maximized. The right hand side of equation (11) contains several major terms, which will be explained in more detail below. The first term

 $\sum_{u,y} \left[\int_{y} p_{u,y}^{DOMD} \left(DOMD_{u,y} \right) d(\cdot) \right]$ adds the sum of the areas underneath the inverse U.S. domestic

demand curves over all crops, livestock products, and processed commodities. ASMGHG can employ four types of demand specifications: a) downward sloping demand curves, b) horizontal or totally elastic demand implying constant prices, c) vertical demand implying fixed demand quantities, and d) zero demand. Downward sloping demand curves are specified as constant

⁸ In displaying the objective function, several modifications have been made to ease readability: a) the integration terms are not shown explicitly, b) farm program terms are omitted, and c) artificial variables for detecting infeasibilities are omitted. A complete representation of the objective function is available on the Internet or from the authors.

elasticity function⁹. To prevent integrals underneath a constant elasticity function and thus consumers' surplus reach infinity, we use truncated demand curves. A truncated demand curves is horizontal between zero and a small quantity ($DOMD_{u,y}^{TF}$) and downward sloping for quantities above $DOMD_{u,y}^{TF}$. In particular, the truncated inverse demand curve for commodity y and region

u becomes
$$p_{u,y}^{DOMD} \left(\text{DOMD}_{u,y} \right) = \{ \hat{p}_{u,y} \times \left(\frac{\text{DOMD}_{u,y}^{\text{TF}}}{\text{DOMD}_{u,y}} \right)^{1/\varepsilon_{u,y}} \text{ for all } \text{DOMD}_{u,y} < \text{DOMD}_{u,y}^{\text{TF}} \text{ and}$$

$$\left. \hat{p}_{u,y} \cdot \left(\frac{DOMD_{u,y}}{DOMD_{u,y}^{^{\wedge}}} \right)^{\!\!\!/ \epsilon_{u,y}} \text{ for all } DOMD_{u,y} \ge DOMD_{u,y}^{^{\text{TF}}} \right\}, \text{ where } \hat{p}_{u,y} \text{ and } DOMD_{u,y}^{^{\wedge}} \text{ denote an}$$

observed price quantity pair and $\varepsilon_{u,y}$ denotes the own price elasticities of demand.

(11)

$$Max WELF = \sum_{u,y} \left[\int_{y} p_{u,y}^{DOMD} \left(DOMD_{u,y} \right) d(\cdot) \right] \\
- \sum_{u,n} \left[\int_{n} p_{u,n}^{INPS} \left(INPS_{u,n} \right) d(\cdot) \right] \\
+ \sum_{m,y} \left[\int_{y} p_{m,y}^{FRXD} \left(FRXD_{m,y} \right) d(\cdot) \right] \\
- \sum_{m,y} \left[\int_{y} p_{m,y}^{FRXS} \left(FRXS_{m,y} \right) d(\cdot) \right] \\
- \sum_{u,f} \left(p_{u,f}^{INPS} \cdot INPS_{u,f} \right) \\
- \sum_{r,\tilde{r},y} \left(p_{r,\tilde{r},y}^{TRAD} \cdot TRAD_{r,\tilde{r},y} \right)$$

The second right hand side term $-\sum_{u,n} \left[\int_{n} p_{u,n}^{INPS} (INPS_{u,n}) d(\cdot) \right]$ subtracts the areas under-

neath the endogenously priced input supply curves for hired labor, water, land, and animal grazing units. Supply curves for these inputs are specified as upward sloping constant elasticity

functions with $p_{u,y}^{INPS}(INPS_{u,n}) = \hat{p}_{u,n}^{INPS} \times \left(\frac{INPS_{u,n}}{INPS_{u,n}}\right)^{1/\varepsilon_{u,n}}$. Note that the INPS_{u,n} supply variables

are constraint by physical limits in equation block (3). Thus, when the physical limit is reached, the inverse supply curve becomes effectively vertical.

The following two terms
$$+\sum_{m,y} \left[\int_{y} p_{m,y}^{FRXD} (FRXD_{m,y}) d(\cdot) \right]$$
 and $-\sum_{m,y} \left[\int_{y} p_{m,y}^{FRXS} (FRXS_{m,y}) d(\cdot) \right]$

account for the areas underneath the foreign inverse excess demand curves minus the areas

⁹ The GAMS version of ASMGHG contains a nonlinear and a stepwise linear representation of constant elasticity supply and demand functions both of which can be used.

underneath the foreign inverse excess supply curves. Together these two terms define the total

trade based Marshallian consumer plus producer surplus economic of foreign regions. Finally, the terms $-\sum_{u,f} (p_{u,f}^{INPS} \cdot INPS_{u,f})$ and $\sum_{r,\tilde{r},y} (p_{r,\tilde{r},y}^{TRAD} \cdot TRAD_{r,\tilde{r},y})$ subtract the costs of

exogenously priced production inputs and the costs for domestic and international transportation, respectively.

Decision parameter	Available options in ASMGHG
Crop choice (index c)	Cotton, Corn, Soybeans, Winter wheat, Durum wheat, Hard
	red winter wheat, Hard red and other spring wheat, Sorghum,
	Rice, Barley, Oats, Silage, Hay, Sugar Cane, Sugar Beets,
	Potatoes, Tomatoes, Oranges, Grapefruit
10	Switchgrass, Willow, Hybrid poplar
Irrigation alternatives ¹⁰	No irrigation
	Full irrigation
Tillage system	Conventional tillage (<15% plant cover)
alternatives Error! Bookmark	Reduced tillage (15-30% plant cover)
not defined.	Zero tillage (>30% plant cover)
Fertilization	Observed nitrogen fertilizer rates
alternatives ^{Error!} Bookmark	Nitrogen fertilizer reduction corresponding to 15% stress
not defined.	Nitrogen fertilizer reduction corresponding to 30% stress
Animal production	Dairy, cow-calf, feedlot beef cattle, heifer calves, steer calves,
choice	heifer yearlings, steer yearlings, feeder pigs, pig finishing, hog
	farrowing, sheep, turkeys, broilers, egg layers, and horses
Feed mixing choice	1158 specific processes based on 329 general processes
	differentiated by 10 US regions
Livestock production	Four different intensities (feedlot beef), two different
alternatives	intensities (hog operations), liquid manure treatment option
	(dairy and hog operations), BST treatment option (dairy)

Appendix 2 Agricultural management alternatives in ASMGHG

¹⁰ Irrigation, tillage, and fertilization alternatives are contained in index j

Dagion	Class Elements	Associated ASMGHG
Region class	Class Elements	Features
Non-US	Canada, East Mexico, West Mexico, Caribbean,	Excess demand and
world	Argentina, Brazil, Eastern South America, Western	supply function
regions ¹¹	South America, Scandinavia, European Islands,	parameter for 8 major
regions	Northern Central Europe, Southwest Europe,	crop commodities;
	France, East Mediterranean, Eastern Europe,	transportation cost
	Adriatic, former Soviet Union, Red Sea, Persian	data; Computation of
	Gulf, North Africa, West Africa, South Africa, East	trade equilibrium
	Africa, Sudan, West Asia, China, Pakistan, India,	
	Bangladesh, Myanmar, Korea, South East Asia,	
	South Korea, Japan, Taiwan, Thailand, Vietnam,	
	Philippines, Indonesia, Australia	
US	US	Demand function
		parameters for crop,
		livestock, and
		processed commodities
US macro	Northeast, Lake States, Corn belt, Northern Plains,	Feed mixing and other
regions	Appalachia, Southeast, Delta States, Southern	process data; labor
(10)	Plains, Mountain States, Pacific States	endowment data;
US minor	Alabama, Arizona, Arkansas, N-California, S-	Crop and livestock
regions (63)	California, Colorado, Connecticut, Delaware, Florida, Georgia, Idaho, N-Illinois, S-Illinois, N-	production data and activities, land type
(03)	Indiana, S-Indiana, W-Iowa, Central Iowa, NE-	and water resource
	Iowa, S-Iowa, Kansas, Kentucky, Louisiana, Maine,	data
	Maryland, Massachusetts, Michigan, Minnesota,	uutu
	Mississippi, Missouri, Montana, Nebraska, Nevada,	
	New Hampshire, New Jersey, New Mexico, New	
	York, North Carolina, North Dakota, NW-Ohio, S-	
	Ohio, NE-Ohio, Oklahoma, Oregon, Pennsylvania,	
	Rhode island, South Carolina, South Dakota,	
	Tennessee, TX-High Plains, TX-Rolling Plains, TX-	
	Central Blackland, TX-East, TX-Edwards Plateau,	
	TX-Coastal Belt, TX-South, TX Transpecos, Utah,	
	Vermont, Virginia, Washington, West Virginia,	
. .	Wisconsin, Wyoming	- 1 1
Land	Agricultural Land: Land with wetness limitation,	Land endowments;
types (6)	Low erodible land (Erodibility Index (EI) < 8),	Cost, yield, and
	Medium erodible land ($8 < EI < 20$), Highly erodible	
	land (EI < 20); Pasture; Forest	adjustment

Appendix 3 Spatial Scope of ASMGHG

¹¹ The international regional resolution differs across the 8 traded crops. For livestock and processed crop commodities one rest of the world region is used.

Account type	Account elements
Greenhouse gas emission	Carbon emissions from on-farm fossil fuel use for agricultural
accounts affected by	machinery (fuelc), carbon emissions from irrigation (irrgc),
energy tax policy (index	carbon emissions from grain drying (drygc), carbon emissions
g)	from fertilizer manufacture (fertc), carbon emissions from
	pesticide manufacture (pestc), greenhouse gas emission offsets
	from bioenergy
Greenhouse gas emission	Soil carbon changes, carbon sequestration from afforestation,
accounts not affected by	methane emission from rice cultivation, nitrous oxide
energy tax policy	emissions from nitrogen applications, methane emissions from
	ruminant animals, methane emissions from livestock manure,
	nitrous oxide emissions from livestock manure, methane
	emission savings from livestock manure digestion
Other environmental	Soil erosion through wind and water, nitrogen and
accounts not affected by	phosphorous losses from surface runoff, subsurface flow,
energy tax policy	percolation, immobilization, and other processes

Appendix 4 Environmental Accounts in ASMGHG

Research Unit Sustainability and Global Change, Hamburg University and Centre for Marine and Atmospheric Science

Working Papers

Schneider, U.A. and Bruce A. McCarl, (2005), *Appraising Agricultural Greenhouse Gas Mitigation Potentials: Effects of Alternative Assumptions*, **FNU-81**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Zandersen, M., M. Termansen, and F.S. Jensen, (2005), *Valuing new forest sites over time: the case of afforestation and recreation in Denmark*, **FNU-80**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Guillerminet, M.-L. and R.S.J. Tol (2005), *Decision making under catastrophic risk and learning: the case of the possible collapse of the West Antarctic Ice Sheet*, **FNU-79**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Nicholls, R.J., R.S.J. Tol and A.T. Vafeidis (2005), *Global estimates of the impact of a collapse of the West Antarctic Ice Sheet: An application of FUND*, **FNU-78**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Lonsdale, K., T.E. Downing, R.J. Nicholls, D. Parker, A.T. Vafeidis, R. Dawson and J.W. Hall (2005), *Plausible responses to the threat of rapid sea-level rise for the Thames Estuary*, FNU-77, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Poumadère, M., C. Mays, G. Pfeifle with A.T. Vafeidis (2005), *Worst Case Scenario and Stakeholder Group Decision: A 5-6 Meter Sea Level Rise in the Rhone Delta, France,* FNU-76, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Olsthoorn, A.A., P.E. van der Werff, L.M. Bouwer and D. Huitema (2005), *Neo-Atlantis: Dutch Responses to Five Meter Sea Level Rise*, **FNU-75**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Toth, F.L. and E. Hizsnyik (2005), *Managing the inconceivable: Participatory assessments of impacts and responses to extreme climate change*, **FNU-74**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Kasperson, R.E. M.T. Bohn and R. Goble (2005), *Assessing the risks of a future rapid large sea level rise: A review*, **FNU-73**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg.

Schleupner, C. (2005), *Evaluation of coastal squeeze and beach reduction and its consequences for the Caribbean island Martinique*, **FNU-72**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Schleupner, C. (2005), Spatial Analysis As Tool for Sensitivity Assessment of Sea Level Rise Impacts on Martinique, FNU-71, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. download

Sesabo, J.K. and R.S.J. Tol (2005), *Factor affecting Income Strategies among households in Tanzanian Coastal Villages: Implication for Development-Conservation Initiatives*, **FNU-70**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Fisher, B.S., G. Jakeman, H.M. Pant, M. Schwoon. and R.S.J. Tol (2005), *CHIMP: A Simple Population Model for Use in Integrated Assessment of Global Environmental Change*, **FNU-69**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Rehdanz, K. and R.S.J. Tol (2005), *A No Cap But Trade Proposal for Greenhouse Gas Emission Reduction Targets for Brazil, China and India*, **FNU-68**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Zhou, Y. and R.S.J. Tol (2005), *Water Use in China's Domestic, Industrial and Agricultural Sectors: An Empirical Analysis*, **FNU-67**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Rehdanz, K. (2005), *Determinants of residential space heating demand in Germany*, **FNU-66**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Ronneberger, K., R.S.J. Tol and U.A. Schneider (2005), *KLUM: A simple model of global agricultural land use as a coupling tool of economy and vegetation*, **FNU-65**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Tol, R.S.J. (2005), *The Benefits of Greenhouse Gas Emission Reduction: An Application of* FUND, **FNU-64**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Röckmann, C., M.A. St.John, F.W. Köster, F.W. and R.S.J. Tol (2005), *Testing the implications of a marine reserve on the population dynamics of Eastern Baltic cod under varying environmental conditions*, **FNU-63**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Letsoalo, A., J. Blignaut, T. de Wet, M. de Wit, S. Hess, R.S.J. Tol and J. van Heerden (2005), *Triple Dividends of Water Consumption Charges in South Africa*, **FNU-62**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Zandersen, M., Termansen, M., Jensen, F.S. (2005), *Benefit Transfer over Time of Ecosystem Values: the Case of Forest Recreation*, **FNU-61**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Rehdanz, K., Tol, R.S.J. and Wetzel, P. (2005), *Ocean Carbon Sinks and International Climate Policy*, **FNU-60**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Schwoon, M. (2005), *Simulating The Adoption of Fuel Cell Vehicles*, **FNU-59**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Bigano, A., J.M. Hamilton and R.S.J. Tol (2005), *The Impact of Climate Change on Domestic and International Tourism: A Simulation Study*, **FNU-58**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Bosello, F., R. Roson and R.S.J. Tol (2004), *Economy-wide estimates of the implications of climate change: Human health*, **FNU-57**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Hamilton, J.M. and M.A. Lau (2004), *The role of climate information in tourist destination choice decision-making*, **FNU-56**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Bigano, A., J.M. Hamilton and R.S.J. Tol (2004), *The impact of climate on holiday destination choice*, **FNU-55**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Bigano, A., J.M. Hamilton, M. Lau, R.S.J. Tol and Y. Zhou (2004), *A global database of domestic and international tourist numbers at national and subnational level*, **FNU-54**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Susandi, A. and R.S.J. Tol(2004), *Impact of international emission reduction on energy and forestry sector of Indonesia*, **FNU-53**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Hamilton, J.M. and R.S.J. Tol (2004), *The Impact of Climate Change on Tourism and Recreation*, **FNU-52**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Schneider, U.A. (2004), *Land Use Decision Modelling with Soil Status Dependent Emission Rates*, **FNU-51**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Link, P.M., U.A. Schneider and Tol, R.S.J. (2004), *Economic impacts of changes in fish population dynamics: the role of the fishermen's harvesting strategies*, **FNU-50**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Berritella, M., A. Bigano, R. Roson and R.S.J. Tol (2004), *A General Equilibrium Analysis of Climate Change Impacts on Tourism*, **FNU-49**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Tol, R.S.J. (2004), *The Double Trade-Off between Adaptation and Mitigation for Sea Level Rise: An Application of* FUND, **FNU-48**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Erdil, Erkan and Yetkiner, I. Hakan (2004), *A Panel Data Approach for Income-Health Causality*, **FNU-47**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2004), *Multi-Gas Emission Reduction for Climate Change Policy: An Application of* FUND, **FNU-46**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Tol, R.S.J. (2004), *Exchange Rates and Climate Change: An Application of* FUND, **FNU-45**, Hamburg University and Centre for Marine and Atmospheric Science, Hamburg. *download*

Gaitan, B., Tol, R.S.J, and Yetkiner, I. Hakan (2004), *The Hotelling's Rule Revisited in a Dynamic General Equilibrium Model*, **FNU-44**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Rehdanz, K. and Tol, R.S.J (2004), *On Multi-Period Allocation of Tradable Emission Permits*, **FNU-43**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Link, P.M. and Tol, R.S.J. (2004), *Possible Economic Impacts of a Shutdown of the Thermohaline Circulation: An Application of* FUND, **FNU-42**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Zhou, Y. and Tol, R.S.J. (2004), *Evaluating the costs of desalination and water transport*, **FNU-41**, revised, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Lau, M. (2004), Küstenzonenmanagement in der Volksrepublik China und Anpassungsstrategien an den Meeresspiegelanstieg, FNU-40, Centre for Marine and Climate Research, Hamburg University, Hamburg. download

Rehdanz, K. and Maddison, D. (2004), *The Amenity Value of Climate to German Households*, **FNU-39 revised**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Bosello, F., Lazzarin, M., Roson, R. and Tol, R.S.J. (2004), *Economy-wide Estimates of the Implications of Climate Change: Sea Level Rise*, **FNU-38**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Schwoon, M. and Tol, R.S.J. (2004), *Optimal CO₂-abatement with socio-economic inertia and induced technological change*, **FNU-37**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Hamilton, J.M., Maddison, D.J. and Tol, R.S.J. (2004), The Effects of Climate Change on International Tourism, **FNU-36**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Hansen, O. and R.S.J. Tol (2003), *A Refined Inglehart Index of Materialism and Postmaterialism*, **FNU-35**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Heinzow, T. and Tol, R.S.J. (2003), *Prediction of Crop Yields across four Climate Zones in Germany: An Artificial Neural Network Approach*, **FNU-34**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2003), *Adaptation and Mitigation: Trade-offs in Substance and Methods*, **FNU-33**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2003), *The Marginal Costs of Carbon Dioxide Emissions*, Department of the Environment, Food and Rural Affairs, London. *download*

Tol, R.S.J. and T. Heinzow (2003), *Estimates of the External and Sustainability Costs of Climate Change*, **FNU-32**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Hamilton, J.M., Maddison, D.J. and Tol, R.S.J. (2003), Climate change and international tourism: a simulation study, **FNU-31**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Link, P.M. and R.S.J. Tol (2003), *Economic impacts of changes in population dynamics of fish on the fisheries in the Barents Sea*, Research Unit Sustainability and Global Change **FNU-30**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J., T.E. Downing, O.J. Kuik and J.B. Smith (2003), *Distributional Aspects of Climate Change Impacts*, OECD Working Paper ENV/EPOC/GSP(2003)14/FINAL, Organisation for Economic Cooperation and Development, Paris. *download*

Link, P.M. (2003), *Auswirkungen populationsdynamischer Veränderungen in Fischbeständen auf die Fischereiwirtschaft in der Barentssee*, Research Unit Sustainability and Global Change FNU-29, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Lau, M. (2003), Integrated Coastal Zone Management in the People's Republic of China – An Assessment of Structural Impacts on Decision-making Processes, Research Unit Sustainability and Global Change **FNU-28 (revised)**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Lau, M. (2003), *Coastal Zone Management in the People's Republic of China – A Unique Approach?*, Research Unit Sustainability and Global Change **FNU-27**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *China Environment Series*, Issue 6, pp. 120-124; *download*

Roson, R. and R.S.J. Tol (2003), An Integrated Assessment Model of Economy-Energy-Climate – The Model Wiagem: A Comment, Research Unit Sustainability and Global Change FNU-26, Centre for Marine and Climate Research, Hamburg University, Hamburg. download

Yetkiner, I.H. (2003), *Is There An Indispensable Role For Government During Recovery From An Earthquake? A Theoretical Elaboration*, Research Unit Sustainability and Global Change **FNU-25**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Yetkiner, I.H. (2003), A Short Note On The Solution Procedure of Barro And Sala-i-Martin for *Restoring Constancy Conditions*, Research Unit Sustainability and Global Change **FNU-24**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Schneider, U.A. and B.A. McCarl (2003), *Measuring Abatement Potentials When Multiple Change is Present: The Case of Greenhouse Gas Mitigation in U.S. Agriculture and Forestry*, Research Unit Sustainability and Global Change **FNU-23**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Zhou, Y. and R.S.J. Tol (2003), *The Implications of Desalination for Water Resources in China: An Economic Perspective*, Research Unit Sustainability and Global Change **FNU-22**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Yetkiner, I.H., de Vaal, A., and van Zon, A. (2003), *The Cyclical Advancement of Drastic Technologies*, Research Unit Sustainability and Global Change **FNU-21**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Rehdanz, K. and Maddison, D. (2003), *Climate and Happiness*, Research Unit Sustainability and Global Change **FNU-20**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J., (2003), *The Marginal Costs of Carbon Dioxide Emissions: An Assessment of the Uncertainties*, Research Unit Sustainability and Global Change **FNU-19**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Lee, H.C., B.A. McCarl, U.A. Schneider, and C.C. Chen (2003), *Leakage and Comparative* Advantage Implications of Agricultural Participation in Greenhouse Gas Emission Mitigation,

Research Unit Sustainability and Global Change **FNU-18**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Schneider, U.A. and B.A. McCarl (2003), *Implications of a Carbon Based Energy Tax for U.S. Agriculture*, Research Unit Sustainability and Global Change **FNU-17**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2002), *Climate, Development and Malaria: An Application of* FUND, Research Unit Sustainability and Global Change **FNU-16**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Susandi, A. and R.S.J. Tol (2002), *The Impact of International Climate Policy on Indonesia*', Report No **341**, *Max Planck Institute of Meteorology*, Hamburg.

Hamilton, J.M. (2002), *Climate and the Destination Choice of German Tourists,* Research Unit Sustainability and Global Change **FNU-15 revised** (2003), Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2002), *Technology Protocols for Climate Change: An Application of* FUND, Research Unit Sustainability and Global Change **FNU-14**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Rehdanz, K (2002), *Hedonic Pricing of Climate Change Impacts to Households in Great Britain*, Research Unit Sustainability and Global Change **FNU-13**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2002), *Emission Abatement Versus Development As Strategies To Reduce Vulnerability To Climate Change: An Application Of* FUND, Research Unit Sustainability and Global Change **FNU-12** (revised), Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Rehdanz, K. and Tol, R.S.J. (2002), *On National and International Trade in Greenhouse Gas Emission Permits*, Research Unit Sustainability and Global Change **FNU-11 (revised)**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Fankhauser, S. and Tol, R.S.J. (2001), *On Climate Change and Growth*, Research Unit Sustainability and Global Change **FNU-10 (revised)**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J.and Verheyen, R. (2001), *Liability and Compensation for Climate Change Damages – A Legal and Economic Assessment*, Research Unit Sustainability and Global Change FNU-9, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Yohe, G. and R.S.J. Tol (2001), *Indicators for Social and Economic Coping Capacity – Moving Toward a Working Definition of Adaptive Capacity*, Research Unit Sustainability and Global Change **FNU-8**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Kemfert, C., W. Lise and R.S.J. Tol (2001), *Games of Climate Change with International Trade*, Research Unit Sustainability and Global Change **FNU-7**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download* Tol, R.S.J., W. Lise, B. Morel and B.C.C. van der Zwaan (2001), *Technology Development and Diffusion and Incentives to Abate Greenhouse Gas Emissions*, Research Unit Sustainability and Global Change **FNU-6**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Kemfert, C. and R.S.J. Tol (2001), *Equity, International Trade and Climate Policy*, Research Unit Sustainability and Global Change **FNU-5**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Lise, W., R.S.J. Tol and B.C.C. van der Zwaan (2001), *Negotiating Climate Change as a Social Situation*, Nota di Lavoro **44.01**, Fondazione Eni Enrico Mattei, Milan. *download*

Tol, R.S.J., Downing T.E., Fankhauser S., Richels R.G. and Smith J.B. (2001), *Progress in Estimating the Marginal Costs of Greenhouse Gas Emissions*, Research Unit Sustainability and Global Change **FNU-4**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J. (2000), *How Large is the Uncertainty about Climate Change?*, Research Unit Sustainability and Global Change **FNU-3**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Tol, R.S.J., S. Fankhauser, R.G. Richels and J.B. Smith (2000), *How Much Damage Will Climate Change Do? Recent Estimates*, Research Unit Sustainability and Global Change **FNU-2**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download*

Lise, W. and R.S.J. Tol (2000), *Impact of Climate on Tourism Demand*, Research Unit Sustainability and Global Change **FNU-1**, Centre for Marine and Climate Research, Hamburg University, Hamburg. *download* Revised (2001): Nota di Lavoro **48.01**, Fondazione Eni Enrico Mattei, Milan. *download*

Kemfert, C. and R.S.J. Tol (2000), *The Liberalisation of the German Electricity Market – Modelling and Oligopolistic Structure by a Computational Game Theoretic Modelling Tool,* Oldenburg Working Paper **V-208-00**. *download*

Tol, R.S.J. and T.E. Downing (2000), *The Marginal Costs of Climate Changing Emissions*, Institute for Environmental Studies **D00/08**, Vrije Universiteit, Amsterdam. *download*

Tol, R.S.J., W. Lise and B.C.C. van der Zwaan (2000), *Technology Diffusion and the Stability of Climate Coalitions*, Nota di Lavoro **20.00**, Fondazione Eni Enrico Mattei, Milan. *download*

Tol, R.S.J. (1999), *Equitable Cost-Benefit Analysis of Climate Change*, Nota di Lavoro **41.99**, Fondazione Eni Enrico Mattei, Milan. *download*

Tol, R.S.J., N.M. van der Grijp, A.A. Olsthoorn and P.E. van der Werff (1999), *Adapting to Climate Change: A Case Study on Riverine Floods in the Netherlands*, Institute for Environmental Studies **D99/10**, Vrije Universiteit, Amsterdam. *download*

Darwin, R.F. and R.S.J. Tol (1998), *Estimates of the Economic Impacts of Sea Level Rise*, Institute for Environmental Studies **D98/11**, Vrije Universiteit, Amsterdam. *download*