## UCLA UCLA Previously Published Works

### Title

CH4 sources estimated from atmospheric observations of CH4 and its C-13/C-12 isotopic ratios: 1. Inverse modeling of source processes

**Permalink** https://escholarship.org/uc/item/7fm946gg

**Journal** Global Biogeochemical Cycles, 18(4)

**ISSN** 0886-6236

### **Authors**

Mikaloff Fletcher, S.E. Tans, P P Bruhwiler, L M <u>et al.</u>

**Publication Date** 

2004-10-01

Peer reviewed

### 1 CH<sub>4</sub> sources estimated from atmospheric observations of CH<sub>4</sub> and its 2 ${}^{13}C/{}^{12}C$ isotopic ratios: 1. Inverse modeling of source processes

<sup>3</sup> Sara E. Mikaloff Fletcher<sup>1</sup>

4 Cooperative Institute for Research in Environmental Science (CIRES), University of Colorado, Boulder, Colorado, USA

5 Pieter P. Tans, Lori M. Bruhwiler, and John B. Miller

6 National Oceanic and Atmospheric Administration Climate Modeling Diagnostics Laboratory (NOAA CMDL), Boulder,

7 Colorado, USA

8 Martin Heimann

9 Max-Planck-Institut für Biogeochemie, Jena, Germany

- 10 Received 14 January 2004; revised 13 June 2004; accepted 20 June 2004; published XX Month 2004
- 11 [1] A time-dependent inverse modeling approach that estimates the global magnitude of
- 12 atmospheric methane sources from the observed spatiotemporal distribution of
- atmospheric CH<sub>4</sub>,  ${}^{13}C/{}^{12}C$  isotopicratios, and a priori estimates of the source strengths is
- 14 presented. Relative to the a priori source estimates, the inverse model calls for increased
- <sup>15</sup> CH<sub>4</sub> flux from sources with strong spatial footprints in the tropics and Southern
- 16 Hemisphere and decreases in sources in the Northern Hemisphere. The  $CH_4$  and  ${}^{13}C/{}^{12}C$
- 17 isotopic ratio observations suggest an unusually high CH<sub>4</sub> flux from swamps ( $\sim 200 \pm$
- <sup>18</sup> 44 Tg CH<sub>4</sub>/yr) and biomass burning ( $88 \pm 18$  Tg CH<sub>4</sub>/yr) with relatively low estimates of
- emissions from bogs ( $\sim 20 \pm 14$  Tg CH<sub>4</sub>/yr), and landfills ( $35 \pm 14$  Tg CH<sub>4</sub>/yr). The
- <sup>20</sup> model results support the hypothesis that the 1998 CH<sub>4</sub> growth rate anomaly was caused
- in part by a large increase in CH<sub>4</sub> production from wetlands, and indicate that wetland
- sources were about 40 Tg CH<sub>4</sub>/yr higher in 1998 than 1999. INDEX TERMS: 0315
- 23 Atmospheric Composition and Structure: Biosphere/atmosphere interactions; 0322 Atmospheric Composition
- 24 and Structure: Constituent sources and sinks; 0368 Atmospheric Composition and Structure: Troposphere-
- 25 constituent transport and chemistry; 1040 Geochemistry: Isotopic composition/chemistry; KEYWORDS:
- 26 inverse model, isotopic signature, methane
- 28 Citation: Mikaloff Fletcher, S. E., P. P. Tans, L. M. Bruhwiler, J. B. Miller, and M. Heimann (2004), CH<sub>4</sub> sources estimated from
- 29 atmospheric observations of  $CH_4$  and its  ${}^{13}C/{}^{12}C$  isotopic ratios: 1. Inverse modeling of source processes, *Global Biogeochem. Cycles*,
- 30 18, GBXXXX, doi:10.1029/2004GB002223.

#### 32 1. Introduction

[2] High-quality, quantitative estimates of the CH<sub>4</sub> bud-33 get are crucial to predicting climate change, managing 34Earth's carbon reservoirs, and understanding atmospheric 35chemistry. CH<sub>4</sub> is the second most important greenhouse 36 gas after CO<sub>2</sub> and is responsible for approximately 20% of 37 the direct radiative forcing from all long-lived greenhouse 38 39gases [Intergovernmental Panel on Climate Change 40 (*IPCC*), 2001].  $CH_4$  is the second most important sink for OH radical, which is the primary determinant of the 41 42oxidizing capacity of Earth's atmosphere. In addition, CH<sub>4</sub> plays an important role in tropospheric O3 pollution 43 [Fiore et al., 2002], and about half of all stratospheric water 44

Copyright 2004 by the American Geophysical Union. 0886-6236/04/2004GB002223\$12.00

vapor comes from the oxidation of  $CH_4$  [*Jones and Pyle*, 45 1984].

[3] Over the last 150 years, the mixing ratio of  $CH_4$  in the 47 atmosphere has more than doubled [Etheridge et al., 1998], 48 primarily as the result of the addition of anthropogenic 49 methane sources such as ruminant animal husbandry and 50 rice agriculture, production of natural gas, coal mining, 51 biomass burning, and landfills. CH4 is also produced 52 naturally by anaerobic bacteria in wetlands, dry tundra, 53 and termites. The oceans evolve CH<sub>4</sub> from anaerobic 54 bacteria in surface waters, fossil methane in marine sedi- 55 ments, and destabilization of methane hydrates, although 56 these sources are thought to be relatively small due to 57 oxidation of CH<sub>4</sub> in the water column. Oxidation of CH<sub>4</sub> 58 by OH radical in the troposphere is the principle  $CH_4$  sink, 59 accounting for approximately 90% of all CH<sub>4</sub> destruction. 60 In addition,  $CH_4$  is oxidized by methanotrophic bacteria in 61 aerobic soils and by reaction with OH, Cl, and O (1D) in the 62 stratosphere. 63

[4] Despite the importance of  $CH_4$  to Earth's radiative 64 balance and atmospheric chemistry, there are still large 65

<sup>&</sup>lt;sup>1</sup>Now at Department of Atmospheric and Oceanic Sciences, University of California, Los Angeles, California, USA.

t1.2	Sources	A Priori Estimates, Tg CH <sub>4</sub> /yr	Range of Estimates Reported by <i>IPCC</i> [2001], Tg CH <sub>4</sub> /yr	Mean Isotopic Signature
t1.3	Total wetlands		92-237	$-58\%^{i}$
t1.4	Swamps	91 <sup>a</sup>		
t1.5	Bogs and tundra	54 <sup>a</sup>		
t1.6	Rice agriculture	$60^{\mathrm{b}}$	25-100	$-63\%^{i}$
t1.7	Ruminant animals	93 <sup>b</sup>	80-115	$-60\%^{i}$
t1.8	Termites	$20^{\circ}$	20-20	$-70\%^{i}$
t1.9	Biomass burning	52 <sup>d</sup>	23-55	$-25\%^{i}$
t1.10	Energy		75-109	
t1.11	Coal	38 <sup>b</sup>		-37‰ <sup>i</sup>
t1.12	Natural gas and	57 <sup>b</sup>		$-44\%^{i}$
	other industrial			
t1.13	Landfills	50 <sup>e</sup>	35-73	$-55\%^{i}$
t1.14	Ocean	$10^{\rm f}$	10-15	$-60\%^{i}$
t1.15	Hydrates	5 <sup>f</sup>	5-10	$-60\%^{i}$
t1.16	Total source	530	500-600	∼−53‰ <sup>i</sup>
			Range of Estimates	
		A Priori Estimates.	Reported by <i>IPCC</i>	
t1.17	Sinks	Tg CH <sub>4</sub> /yr	[2001], Tg CH <sub>4</sub> /yr	Isotopic Fractionation
t1.18	Tropospheric OH	507 <sup>g</sup>	450-510	5.4‰ <sup>j</sup>
t1.19	Stratospheric loss	$40^{\rm h}$	40-46	12‰ <sup>k</sup>
t1.20	Soils	30 <sup>h</sup>	10-30	22‰ <sup>1</sup>
+1.91	Total	577	/	~ 6.7%
01.41				/ /00

t1.1	Table 1.	Methane Budget	and the Mean	$\delta^{13}CH_4$	Isotopic	Signatures	of the	Sources and	Sinks <sup>a</sup>

<sup>a</sup>IPCC range of estimates covers the high and low estimates from a suite of budgets compiled using different approaches listed in the *IPCC* [2001] report. These estimates are typical of the range of estimates that can be found in the literature for  $CH_4$  sources.

t1.23 <sup>b</sup>Lelieveld et al. [1998].

t1.22

t1.24 <sup>c</sup>EDGAR emissions database [Olivier et al., 1996].

t1.25 <sup>d</sup>Sanderson [1996].

t1.26 <sup>e</sup>Levine et al. [2000].

t1.27 <sup>f</sup>Bingemer and Crutzen [1987].

t1.28 <sup>g</sup>Cicerone and Oremland [1988].

t1.29 <sup>h</sup>On the basis of *Spivakovsky et al.* [2000] OH fields and model CH<sub>4</sub> mixing ratios, tuned to *IPCC* [2001] total CH<sub>4</sub> loss.

t1.30 *IPCC* [2001].

t1.31 <sup>j</sup>Whiticar [1993].

t1.32 <sup>k</sup>Cantrell et al. [1990].

t1.33 <sup>1</sup>Brenninkmeijer et al. [1995], reflecting the total observed isotopic fractionation due to OH, O<sup>1</sup>D, and Cl in the stratosphere.

t1.34  ${}^{m}Tyler \ et \ al. \ [1994].$ 

uncertainties in estimates of the CH<sub>4</sub> fluxes as shown by the 66 wide range of IPCC [2001] estimates in Table 1, and the 67 causes for the observed variability in the recent CH<sub>4</sub> growth 68 rate are not well understood [Dlugokencky et al., 2003, 69 2001, 1998]. The growth rate of atmospheric CH<sub>4</sub> for the 701990s has an overall decreasing trend and includes anom-71 alous increases in the growth rate in 1991 and 1998 and a 72large decrease in the growth rate during 1992. Much 73progress has been made toward qualitatively attributing 74 75these features to source and sink processes by correlating them to changes in climate, fossil fuel consumption, and 76 other phenomena [i.e., Dlugokencky et al., 1996; Bekki et 77 al., 1994; Dlugokencky et al., 1998]. The 1998 growth rate 78 anomaly occurred during an unusually warm year, marked 79by precipitation anomalies associated with the transition 80 from a strong El Niño condition to a La Niña [Bell et al., 81 1999; Curtis et al., 2001]. Comparisons between the CH<sub>4</sub> 82 growth rate anomaly and a process-based model of wetlands 83 which included temperature and precipitation anomalies 84 illustrated that increased biospheric production could 85 account for this event [Dlugokencky et al., 2001]. 86

Conversely, *Langenfelds et al.* [2002] and *Van der Werf et*  $^{87}$ *al.* [2004] attributed much of the 1997–1998 CH<sub>4</sub> anomaly  $^{88}$  to extensive fires.  $^{89}$ 

[5] Process-level estimates of  $CH_4$  fluxes have significant 90 uncertainties due to the aggregation or extrapolation of local 91 measurements, often representing only a limited time 92 period, of sources with large spatial and temporal variability 93 to regional or global scales. Model simulations of the  $CH_4$  94 atmospheric mixing ratio resulting from these bottom-up 95 source estimates typically overestimate the interhemispheric 96 gradient of  $CH_4$  relative to the observations [i.e., *Fung et 97 al.*, 1991; *Hein et al.*, 1997; *Houweling et al.*, 1999] (also 98 Figure 1, this study) implying that the sources may be 99 overestimated in the Northern Hemisphere (NH) and/or 100 underestimated in the Southern Hemisphere (SH).

[6] Inverse modeling is a "top-down" approach to optimize trace gas flux estimates using observations of atmo-103 spheric mixing ratios, a model of atmospheric transport, the 104 spatial distributions of the sources, and, in most cases, a 105 prior estimate of the source magnitudes to calculate an 106 optimal combination of fluxes to match the observational 107



**Figure 1.** Latitudinal gradient of (top) CH<sub>4</sub> and (bottom)  $\delta^{13}$ CH<sub>4</sub> of the observations (diamonds), forward simulation based on the a priori estimates (asterisks), and forward simulation based on the a posteriori source estimates (squares). Error bars on the observations reflect the standard deviation of the individual observations from the annual mean.

108 data and our current understanding of the source processes. 109 This technique has been applied to several atmospheric 110 trace gases including  $CO_2$  [e.g., *Enting and Mansbridge*, 111 1989; *Tans et al.*, 1990; *Fan et al.*, 1998; *Gurney et* 112 *al.*, 2002], CH<sub>4</sub> [e.g., *Hein et al.*, 1997; *Houweling et al.*, 113 1999], and CO [e.g., *Kasibhatla et al.*, 2002; *Bergamaschi* 114 *et al.*, 2000b].

[7] One of the difficulties associated with using atmo-115 spheric observations of CH<sub>4</sub> to gain insight into the sources 116 and sinks of CH<sub>4</sub> is that atmospheric observations primarily 117provide information regarding the spatial distribution of the 118total CH<sub>4</sub> flux, and some of the CH<sub>4</sub> source processes have 119a great deal of spatial overlap. Two approaches have been 120121used to address this issue in CH<sub>4</sub> inverse studies. In one 122approach, an inverse model was used to determine the spatial distribution of CH<sub>4</sub> flux required to match the 123atmospheric observations without differentiating the flux 124by source process [Houweling et al., 1999]. While this 125technique was able to reduce the uncertainty of the total 126CH<sub>4</sub> flux, especially in the NH, it provided limited insight 127 into the physical processes responsible for the differences 128 between the inverse model and process-based estimates. In 129an alternate approach, inverse models have been used to 130

estimate the magnitude of the total global fluxes for separate 131 source process based on the spatial distribution of the 132 sources [e.g., Hein et al., 1997; Bergamaschi et al., 133 2000a, 2001] or from separate source processes across large 134 spatial regions [Chen, 2004]. These inverse estimates tend 135 to find decreases in source estimates relative to the prior 136 estimates for source processes with larger footprints in the 137 NH and increases in sources with large footprints in the SH, 138 consistent with the forward modeling results suggesting that 139 a priori sources lead to an overestimate of the interhemi- 140 spheric gradient. While Hein et al. [1997] were able to 141 reduce the uncertainties associated with the source estimates 142 using the station observations; they also found that a variety 143 of different source scenarios could also match the observa- 144 tional data, in line with the earlier work of Fung et al. 145 [1991]. 146

[8] Including observations of isotopic ratios in CH<sub>4</sub> 147 inversions may add a unique constraint to the problem by 148 taking advantage of differences between the isotopic dis-149 crimination associated with different source processes. In 150 addition to providing a new constraint to the underdeter-151 mined CH<sub>4</sub> inverse problem, observations of isotopic ratios 152 may improve partitioning of the flux estimates between 153 source processes with similar spatial patterns but differing 154 isotopic signatures. The source processes can be separated 155 into four broad categories based on their isotopic signatures: 156 bacterial sources, including wetlands, rice paddies, ruminant 157 animals, and termites, biomass burning, fossil sources, and 158 landfills (Table 1). 159

[9] Previous inverse model studies have made limited use 160 of observations of stable isotopes of CH<sub>4</sub>. Bergamaschi et 161 al. [2000a] used the NOAA/CMDL observations of CH<sub>4</sub> to 162 estimate the magnitude of the CH<sub>4</sub> source, then used 163 observations from two SH stations and one NH station of 164 the  ${}^{13}\text{C}/{}^{12}\text{C}$  isotopic ratio in atmospheric CH<sub>4</sub> and the 165 inverse CH<sub>4</sub> source estimates to optimize the isotopic 166 signature of each source process. Hein et al. [1997] used 167 observation of <sup>13</sup>C from three stations to further constrain 168 their inverse study and optimize the isotopic signatures of 169 the sources. However, since in the latter study only stations 170 in the NH were used, interhemispheric gradient information 171 was not included. Using a two-box model with annual, 172 hemispheric averages of  ${}^{13}C/{}^{12}C$  and CH<sub>4</sub>, *Miller et al.* 173 [2002] conducted a simple inversion for two general CH<sub>4</sub> 174 source categories, bacterial CH<sub>4</sub> production and biomass 175 burning, holding fossil fuel sources fixed. These studies 176 found that measurements of <sup>13</sup>C/<sup>12</sup>C isotopic ratios com- 177 bined with measurements of CH<sub>4</sub> could provide constraints 178 to the methane budget. 179

[10] Here we present the first time-dependent 180 inverse estimates of  $CH_4$  constrained by both the 181 GLOBALVIEW-CH<sub>4</sub> data product and observations of the 182  $^{13}C/^{12}C$  isotopic ratios from six NOAA/CMDL stations 183 from 1998–1999. The variations between the two inverse 184 model years are shown and discussed in the context of the 185 1998 methane growth rate anomaly, and the inverse esti-186 mates are compared with recent process-based estimates and 187 discussed in the context of observed physical phenomena 188 likely to affect the source processes. In addition, the 189 sensitivity of the inverse estimates is tested in response to 190 several potential sources of error. In a companion paper
[*Mikaloff Fletcher et al.*, 2004], a complimentary technique
will be used to interpret the relative source process con-

194 tributions to regional  $CH_4$  inverse estimates with observa-

195 tions of  ${}^{13}C/{}^{12}C$  isotopic ratios in CH<sub>4</sub>.

#### 196 2. Methods

197 [11] This study employs a time dependent assimilation 198 and source retrieval technique [*Bruhwiler et al.*, 2000]. It is 199 a conceptually straightforward mass balance approach that 190 has minimal dependence on prior estimates. The behavior of 201 a trace gas over time in the presence of sources, sinks, and 202 transport processes can be described by the mass continuity 203 equation,

$$\frac{dy}{dt} = \mathbf{T} \bullet y + S,\tag{1}$$

where **T** is an operator that describes the atmospheric transport processes, y is the atmospheric abundance of the trace gas, and S is the net effect of sources and sinks. [12] The effect of the sources over a given time step

from a defined source region on the atmospheric abundance of a trace gas at an observing station in the absence
of transport error over a given time period can be described
by

$$y_j^{\text{obs}} - y_j = \sum_{i=1,\text{nsrc}} \mathbf{H}_{ij} x_i.$$
 (2)

In this equation,  $y^{obs}$  is the observed mixing ratio at station j, 214  $x_i$  is the source strength for the *i*th source region, and nsrc is 215the total number of source regions. The theoretical mixing 216ratio in the absence of sources, y, is calculated by applying 217the transport model to the three dimensional trace gas 218 219 distribution from the previous time step without including source processes.  $H_i$  is the basis function matrix which 220 describes the signal observed at the station after one time 221 step in response to an arbitrary, steady source from the *i*th 222 source region, calculated by emitting 1 Tg CH<sub>4</sub>/yr from the 223source region and allowing the transport model to act on 224these emissions. After the emissions have been transported 225226for one inversion time step, in this case 1 month, the resulting mixing ratio distribution is sampled at the station 227locations. Thus, in the absence of error, the difference 228 between the observed mixing ratio of a trace gas and the 229modeled mixing ratio in the absence of sources is described 230as a linear combination of the sources. This calculation was 231done monthly over the period of the inversion, 1998–2000. 232One important limitation to our inversion is that the basis 233functions only reflect 1 month of model transport. Errors in 234the flux estimates for a given month step are propagated to 235the next time step because they influence the modeled 236spatial distribution of the trace gas,  $y_i$  in equation (2). 237Therefore an underestimate in the flux from a region in a 238given month may lead to an underestimate in the flux from 239 that region or a neighboring region in a later month, since 240 no mechanism is included for flux estimates from previous 241 months to be adjusted based on observations for the current 242

month. This is likely to result in increased temporal noise in 243 the inverse estimates. 244

[13] In addition to the station observation constraints used 245 in the Bruhwiler et al. [2000], constraints from process- 246 based estimates of the sources, or a priori estimates, have 247 been included. A Singular Value Decomposition (SVD) is 248 applied to determine the optimal source magnitudes 249 required to match the observations and the prior estimates. 250 When including a priori estimates, the relative weighting of 251 the atmospheric observations and the a priori estimates 252 based on their estimated uncertainty,  $\sigma$ , plays a critical role 253 in the inverse flux estimates. In the limit of high model-data 254 mismatch error relative to the prior uncertainty, the a 255 posteriori inverse estimates may primarily reflect the a priori 256 estimates. In this inversion, the uncertainty associated with 257 the prior estimates was set equal to the difference between 258 the high and low estimates for each source process 259 published in the IPCC [2001] (Table 1), except in the case 260 of termites, where the uncertainty was assumed to be 20 Tg 261 CH<sub>4</sub>/yr. The uncertainty associated with the observational 262 data is much less straightforward, because it is not primarily 263 associated with the measurements themselves; rather, it due 264 to limitations in the model's ability to describe the station 265 observations. In this study, an average uncertainty was 266 estimated for both continental and coastal or marine sites 267 based on the mean standard deviation of the residuals from 268 the smooth curve in the observations. Sites sampling marine 269 air were assigned a model-data mismatch uncertainty of 270 10 ppb and those sampling continental air were assigned an 271 uncertainty of 21 ppb. This choice of sigma values results in 272 a primarily data-driven inversion with the a priori 273 constraints only ruling out truly nonphysical results such 274 as uptake due to processes known to act exclusively as 275 sources. 276

[14] In this experiment, following Hein et al. [1997], each 277 source process is estimated separately with the spatial 278 distribution of the source processes represented by the 279 NASA Goddard Institute for Space Studies (GISS) flux 280 maps described by Fung et al. [1991]. As in the work of 281 Fung et al., the five major wetland types [Matthews and 282 Fung, 1987] are grouped into two broad categories: bogs, 283 which occur mainly between 50°N and 70°N, and swamps, 284 which primarily occur in the tropics. The isotopic signature 285 of each source is prescribed in order to use the isotopic 286 ratios measured at each observing station as additional 287 constraints on the methane flux estimates. It is important to 288 note that source process inversions are subject to significant 289 error due to the inherent assumption that the a priori spatial 290 distribution of each source process is correct and has little or 291 no interannual variability. In addition, the large spatial 292 extent of the source processes may lead to errors. Since the 293 internal spatial distribution of the sources for a model region 294 cannot be adjusted by the inversion and the sampling 295 network is sparse, inaccuracies and unrepresented varia- 296 bility in the spatial pattern for the region have been shown 297 to introduce biases, also called "aggregation error" 298 [Kaminski et al., 1999]. Conversely, if very small model 299 regions are used in an inverse model, the current observing 300 network is unlikely to be able to provide sufficient 301 constraints for many of the model regions, resulting in 302 (5)

inverse estimates that are strongly determined by a prioriestimates.

 $_{305}$  [15] Equation (2) can be rewritten in terms of  $^{13}$ C as

$$R_j^{\text{obs}} y_j^{\text{obs}} - R_j y_j = \sum_{i=1,\text{nsrc}} \mathbf{H}_{i,j} R_i x_i, \tag{3}$$

where  $R_j^{\text{obs}}$  and  $R_j$  represent the  ${}^{13}\text{C}/{}^{12}\text{C}$  ratios of 307 the observations and the model simulation, calculated in 308 the absence of sources during the time step, and  $R_i$  is the 309 isotopic ratio of <sup>13</sup>C/<sup>12</sup>C in CH<sub>4</sub> observed for each source 310 process. In order to isolate very small changes in the 311 isotopic ratio due to the isotope effects of source and sink 312 processes, stable isotope ratios are conventionally expressed 313 as  $\delta^{13}$ C, the fractional deviation of the isotopic ratio of the 314 sample, R<sub>sample</sub>, from a standard, R<sub>reference</sub>. 315

$$\delta^{13}C = \left(\frac{R_{\text{sample}}}{R_{\text{reference}}} - 1\right) \times 1000.$$
(4)

317 By using a linear combination of equation (2) and 318 equation (3) and applying the definitions of  $\delta^{13}$ C 319 (equation (4)), we can write an equation for the CH<sub>4</sub> 320 sources in terms of both  $\delta^{13}$ CH<sub>4</sub> and CH<sub>4</sub> (Appendix A).

$$\delta_j^{\text{obs}} y_j^{\text{obs}} - \delta_j y_j = \sum_{i=1,\text{nr}} \mathbf{H}_{i,j} x_i \delta_i^{\text{src}},$$

where  $\delta_i^{\text{src}}$  is the isotopic signature of the *i*th source process. The uncertainty estimate, equation (5), which plays an important role in estimating the a posteriori error estimates and the relative weighting of each linear equation in the system of linear equations, is expressed in terms of the uncertainty associated with  $\delta$ ,  $\sigma_j^{\delta}$ , and the uncertainty associated with y,  $\sigma_i^{\delta}$ .

$$\sigma = \sqrt{\left(\sigma_j^{\delta} y_j\right)^2 + \left(\delta_j \sigma_j^{\psi}\right)^2}.$$
 (6)

Thus, if equation (5) were used, the uncertainty for the isotopic signature constraints would be strongly dependent on the arbitrary reference value selected in equation (4),  $R_{\text{reference}}$ . Therefore we set the reference ratio equal to the calculated isotopic ratio expected in the absence of sources, which is different for each station, such that the calculated  $\delta \equiv 0$  and equation (5) reduces to

$$\delta_j^{*\text{obs}} y_j^{\text{obs}} = \sum_{i=1,\text{nr}} \mathbf{H}_{i,j} x_i \delta_i^{*\text{src}},\tag{7}$$

where  $\delta^{*obs}$  and  $\delta_i^{*src}$  represent the delta values defined in terms of the calculated isotopic ratio for each station. Equation (7) is added to the inversion as an additional constraint on the CH<sub>4</sub> flux estimates.

342 [16] The isotopic ratios used in this equation are shown in 343 Table 1. The biomass burning source has a spatial pattern in 344 the isotopic signature of the sources. The two primary plant 345 photosynthetic pathways, C-3 and C-4, have differing 346 isotopic signatures in plant biomass leading to differing isotopic signatures in emissions from combustion of C-3 347 and C-4 plants [*Chanton et al.*, 2000]. To account for this, a 348 spatial map of the relative fraction of C-4 plants [*Still et al.*, 349 2003] and mean isotopic signatures from C-3 and C-4 plants 350 [*Chanton et al.*, 2000] are applied to create a spatially 351 varying isotopic signature from biomass burning. The 352 resulting global mean isotopic signature from biomass 353 burning is -25%. 354

[17] The initial conditions were set as close to the real 355 atmosphere as possible. First, a "test" inverse model was 356 initialized to the observed hemispheric mean values of 357 atmospheric CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> [*Miller et al.*, 2002] and run 358 from 1998 to 2000. The three-dimensional CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> 359 fields from the final time step of this "test" inversion are 360 then used to initialize the inverse model. The first 3 months 361 of the final inverse results were excluded for further model 362 spin-up time. Three months is the time required for the 363 modeled CH<sub>4</sub> mixing ratios to be further corrected by the 364 station observations such that the differences between 365 modeled and observed CH<sub>4</sub> no longer reflect inaccuracies 366 in the initial conditions. 367

[18] Recent work has shown that it takes much longer to 368 establish large-scale spatial gradients in the isotopic ratios 369 than total CH<sub>4</sub> [*Tans*, 1997; *Lassey et al.*, 2000]. This 370 implies there may be a slowly adjusting drift in the 371 calculated atmospheric isotopic ratios due to inaccuracies in 372 the initial conditions, which would lead to errors in the 373 source partitioning by the inverse model. However, these 374 errors are likely to be smaller than the errors associated with 375 paucity of available data [*Tans*, 1997]. 376

[19] The transport was represented by the coarse-grid 377 version of the global, three-dimensional tracer transport 378 model, Transport Model 3 version 3.3 (TM3) [Heimann 379 and Körner, 2003], with a spatial resolution of 7.8° latitude 380 by 10° longitude by nine vertical levels. TM3 solves the 381 continuity equation numerically for an arbitrary number of 382 trace gases in a three-dimensional Eulerian grid using 'off- 383 line' wind fields. The National Centers for Weather 384 Prediction/National Center for Atmospheric Research 385 (NCEP/NCAR) wind fields concurrent with the model year 386 were used. Recent model studies have suggested that a 387 significant part of the inter-annual variability in the CH<sub>4</sub> 388 growth rate may be explained by variability in model 389 transport [Warwick et al., 2002; Johnson et al., 2002], 390 implying that using meteorology corresponding to the 391 current model year rather than repeating meteorology from 392 a single year may be critical in correctly inferring surface 393 fluxes from the observed CH<sub>4</sub> mixing ratios. Tracer 394 transport that is resolved in the model grid is calculated 395 using a "slopes scheme" [Russell and Lerner, 1981], where 396 the distribution of each tracer within each model grid-box is 397 represented by a three-dimensional linear slope of the 398 mixing ratio distribution. Vertical sub-grid scale transport is 399 calculated based on cumulus cloud convection [Tiedke, 400 1989] and vertical diffusion based on calculated air stability 401 [Louis, 1979]. The ability of TM2, an earlier version of the 402 model, and the fine grid version of TM3 to reproduce 403 important features of tracer transport such as the interhemi- 404 spheric gradient and seasonal cycle due to transport of a 405 trace gas has been tested with SF<sub>6</sub>, a chemically and 406

biologically neutral trace gas with a single, well-known
anthropogenic source in the TransCom Model Intercomparison experiment [*Denning et al.*, 1999], and the role of the
choice of model resolution on tracer transport in TM3 has
been explored by *Heimann and Körner* [2003].

[20] The CH<sub>4</sub> sinks due to tropospheric OH, stratospheric loss, and oxidation by aerobic soils were prescribed and not optimized. CH<sub>4</sub> is oxidized by OH in the following reaction:

$$CH_4 + OH \longrightarrow CH_3 + H_2O,$$
 (8)

which has a temperature-dependent rate constant of k =  $2.45 \times 10^{-12}$  cm<sup>-3</sup> s<sup>-1</sup>e<sup>-1775/T</sup> [*DeMore et al.*, 1997]. The 416 417 global distribution of OH was represented by the monthly 418 OH fields of Spivakovsky et al. [2000], which were scaled to 419match the IPCC estimate of 507 Tg CH<sub>4</sub>/yr. These OH 420fields have been tested for consistency with the budgets of 421CH<sub>3</sub>CCl<sub>3</sub>, a trace gas with well-known emissions that is 422 destroyed primarily by OH oxidation, in addition to a suite 423of other important atmospheric trace gases [Spivakovsky et 424al., 2000]. Spivakovsky et al. [2000] estimated the total 425uncertainty to be no greater than  $\pm 15\%$ . 426

427 [21] The destruction of  $CH_4$  by OH was assigned a 428 Kinetic Isotope Effect (KIE) of 1.0054 based on the 429 laboratory measurements of *Cantrell et al.* [1990]. A more 430 recent measurement of this KIE of 1.0039 has been made by 431 *Saueressig et al.* [2001]. This value is used to test the 432 sensitivity of the inverse result to the KIE of  $CH_4$ 433 destruction by tropospheric OH.

[22] In addition to the tropospheric OH sink, which is 434responsible for approximately 88% of total CH<sub>4</sub> loss. CH<sub>4</sub> is 435destroyed in the stratosphere by OH, Cl, and O<sup>1</sup>D. Owing to 436the large Kinetic Isotope Effect (KIE) of CH<sub>4</sub> destruction by 437Cl, the stratospheric loss term has relatively strong influence 438on atmospheric  $\delta^{13}$ CH<sub>4</sub> in comparison to CH<sub>4</sub> [Gupta et al., 4391996; McCarthy et al., 2001]. A spatially uniform strato-440spheric loss term with a global total equal to the IPCC 441 [2001] estimate of 40 Tg CH<sub>4</sub>/yr was applied to all model 442 grid cells above the temperature inversion as defined by off-443 line temperature fields. Following Hein et al. [1997], total 444 isotopic fractionation of CH4 due to chemical destruction in 445the stratosphere by OH, Cl, and O<sup>1</sup>D was assigned an 446isotopic discrimination of 12‰ based on observations of the 447 correlation between  $\delta^{13}\text{CH}_4$  and  $\text{CH}_4$  in aircraft measure-448 ments [Brenninkmeijer et al., 1995]. These measurements 449 occurred near the tropopause at high southern latitudes, a 450region of strong transport from the stratosphere to the 451troposphere and are in good agreement with the observa-452tions of Sugawara et al. [1997]. Tropospheric Cl was not 453represented in the model, but recent measurements have 454suggested that there may be a significant active Cl sink in 455the boundary layer [Platt and Hönninger, 2003]. Owing to 456the large Cl KIE, this is an important source of uncertainty 457in the interpretation of the  $\delta^{13}CH_4$  observations. 458

[23] The spatial distribution of the soil sink was represented by the NASA GISS field described by *Fung et al.* [1991], and the total flux was tuned to the *IPCC* [2001] emission estimate of 30 Tg CH<sub>4</sub>/yr. An isotopic fractionation of 22‰ was assigned to the soil sink based on the measurements of *Tyler et al.* [1994]. Like the stratospheric sink, owing to its strong isotopic fractionation the soil sink 465 has a much greater impact on the atmospheric  $\delta^{13}CH_4$  than 466 it does on total CH<sub>4</sub>.

[24] The GLOBALVIEW-CH<sub>4</sub> data product based on 468 measurements from several international laboratories was 469 used to represent the spatiotemporal CH<sub>4</sub> distribution 470 (GLOBALVIEW-CH4 [National Oceanic and Atmospheric 471 Administration (NOAA), 2001]). GLOBALVIEW-CH4 is 472 based on regular samples collected at 67 land stations and 473 along two ocean ship tracks. The ship tracks sample 17 474 positions in the Pacific Ocean and seven positions in the 475 South China Sea. The sampling sites are preferentially 476 located to sample remote marine boundary layer air in order 477 to ensure that the samples consist of well-mixed air, 478 representing background mixing ratios of the trace gases 479 measured. Duplicate samples are collected in flasks, 480 typically once per week, and analyzed for CH<sub>4</sub> by gas 481 chromatography (GC) followed by flame ionization detec- 482 tion (FID). The measurements are adjusted to a single scale, 483 the NOAA Climate Monitoring Diagnostics Laboratory 484 (NOAA CMDL) scale, in order to account for differences 485 between individual laboratories' standard scales [NOAA, 486 2001]. 487

[25] In order to create a temporally consistent time series 488 over all the contributing stations, these observations are fit 489 to a smoothed curve and the smoothed curve is sampled at 490 regular, 7.6 day intervals. In cases where the data record is 491 incomplete, the existing observations are extended based on 492 the site climatology and observations from remote marine 493 boundary sites at similar latitudes. The data extension and 494 integration process used in GLOBALVIEW is described in 495 more detail by *Masarie and Tans* [1995].

[26] Weekly, duplicate flask samples from six NOAA 497 CMDL Cooperative Air Sampling Network have been 498 sampled for  $\delta^{13}$ CH<sub>4</sub> at the Institute for Arctic and Atmo- 499 spheric Research (INSTAAR) by GC isotope-ratio-mass- 500 spectrometry (IRMS) since 1998 [Miller et al., 2002]. The 501 stations sampled for  $\delta^{13}$ CH<sub>4</sub> are Barrow, Alaska 502 (71°N), Niwot Ridge, Colorado (40°N), Mauna Loa, Hawaii 503 (20°N), Cape Matatula, American Samoa (14°S), Cape 504 Grim, Tasmania (40°S), and South Pole, Antarctica (90°S). 505 These observations are fit to a smoothed curve, excluding 506 outliers more than 3 standard deviations from an initial 507 smoothed curve fit. The smoothed curve is sampled at 508 7.6 day intervals to create a  $\delta^{13}$ CH<sub>4</sub> data set comparable to 509 GLOBALVIEW-CH<sub>4</sub>. It is worthy of note that trace gas 510 observations at American Samoa are particularly difficult to 511 interpret due to the complex tropical meteorology at this 512 site, and this station may be especially sensitive to errors in 513 model transport. 514

[27] Long-term observational records of  $\delta^{13}$ CH<sub>4</sub> are available for a number of other observing stations [e.g., *Lowe et* 516 *al.*, 1994; *Quay et al.*, 1999; *Bergamaschi et al.*, 2000a]. 517 National Institute of Water and Atmospheric Research 518 (NIWA) observations of  $\delta^{13}$ CH<sub>4</sub> at Baring Head, New 519 Zealand, and Scott Base, Antarctica [*Lowe et al.*, 1994], are 520 used to validate the inverse estimates in section 6, but only 521 the  $\delta^{13}$ CH<sub>4</sub> observations from the NOAA/CMDL network 522 are used to constrain the inversion. The CH<sub>4</sub> observations 523 from different laboratories have been carefully compared, 524

571

t2.2	Scenario	Description	Additional Details		
t2.3	S0	a priori source estimates	forward simulation of prior source estimates shown in Table 1		
t2.4	S1	a posteriori estimates, excluding observations of $\delta^{13} \mathrm{CH}_4$	inverse source estimates using $CH_4$ observations and prior estimates only, with no $\delta^{13}CH_4$ constraints		
t2.5	S2	a posteriori estimates, including observations of $\delta^{13}\mathrm{CH}_4$	inverse source estimates with $\delta^{13}$ CH <sub>4</sub> constraints in addition to observations of CH <sub>4</sub> and prior estimates		
t2.6	S3	sensitivity to OH kinetic isotope effect	S2 with the <i>Saueressig et al.</i> [2001] measurement of the KIE for OH		
t2.7	S4	sensitivity to OH fields-upper limit	S2 with OH increased by 15% to the upper end of the uncertainty estimate of <i>Spivakovsky et al.</i> [2000]		
t2.8	S5	sensitivity to OH field-lower limit	S2 with OH decreased 15% to the lower end of the uncertainty estimate of <i>Spivakovsky et al.</i> [2000]		
t2.9	S6	sensitivity to initial conditions	S2 initialized to the observed hemispheric mean $CH_4$ and $\delta^{13}CH_4$ for 1998 [ <i>Miller et al.</i> , 2002]		

t2.1 **Table 2.** Summary of the Inversion Scenarios Implemented to Compare Prior Estimates With Inverse Results and Test the Sensitivity of the Inverse Results to Various Potential Sources of Error

adjusted to a common scale [NOAA, 2001], and are 525available as a single, self-consistent data set. Limited 526comparisons between NOAA/CMDL observations and data 527528from NIWA, Quay et al. [1999], and Francey et al. [1999] 529suggest there may be offsets between laboratories of about 0.1% [Miller et al., 2002], about 15% of the interhemi-530spheric gradient. Therefore, careful measurement intercom-531 parisons and linking of scales are essential before these data 532can be incorporated in the inversion to avoid introducing 533534large biases.

<sup>535</sup> [28] Inverse estimates were calculated for a variety of <sup>536</sup> different "inverse scenarios," summarized in Table 2, to <sup>537</sup> isolate the impact of including the  $\delta^{13}$ CH<sub>4</sub> observations and <sup>538</sup> test the sensitivity of the inverse estimates to uncertainties in <sup>539</sup> the model.

[29] The first scenario, S0, is simply the a priori source 540estimates. These source estimates have been chosen to 541 542reflect a best process-based estimate only; therefore they 543do not balance the CH<sub>4</sub> budget. S1 is the inverse estimate including only the observations of CH<sub>4</sub>, but excluding observations of  $\delta^{13}$ CH<sub>4</sub>, and S2 is the inverse model incorporating the observations of  $\delta^{13}$ CH<sub>4</sub>. Throughout this 544545546paper, if the scenario being discussed is not explicitly 547 specified, we refer to S2. Scenarios 3 to 7 test the sensitivity 548of the inverse model to uncertainties in OH chemistry, 549model transport year, and initial conditions. The base 550

scenario, S2, uses a KIE of 5.4‰ for the oxidation of 551 CH<sub>4</sub> by OH. S3 applies the more recent measurement of the 552 OH KIE [Saueressig et al., 2001]. The error associated with 553 the OH fields used to represent the chemical sink in this 554 study has been estimated as  $\pm 15\%$  [Spivakovsky et al., 555 2000]. To explore the sensitivity to this error, the OH fields 556 have been increased uniformly by 15% in S4 and decreased 557 by 15% in S5. Recall that the total OH sink based on the 558 within-model CH<sub>4</sub> mixing ratio using the Spivakovsky OH 559 fields of 470 Tg CH<sub>4</sub>/yr has been adjusted to match the 560 IPCC estimate of 507 Tg CH<sub>4</sub>/yr, which is within the error 561 limits of the Spivakovsky OH fields. The 15% variation for 562 these scenarios was applied to the uncorrected value of 563 470 Tg CH<sub>4</sub>/yr in keeping with the original context of the 564 error estimate. As a result, these scenarios are expected to be 565 asymmetric around the base scenario. Finally, in S6, the 566 model is initialized to the observed hemispheric mean 567 atmospheric CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> to evaluate the sensitivity of 568 the inverse estimates to small errors in the initial conditions 569 after the relatively short model spin-up time [Tans, 1997]. 570

#### 3. Inverse Estimates

[30] Comparing the a priori estimates with the a posteriori 572 estimates (Table 3) constrained by the  $CH_4$  observations 573 alone (S1), the largest single change is the dramatic increase 574

t3.1 Table 3. Annual Mean Source Estimates for the A Priori Fluxes (S0) and the 1998–1999 Mean a Posteriori Estimates for the Inverse Scenarios Described in Table 2<sup>a</sup>

t3.2	Sources	S0	S1	S2	S3	S4	S5	S6
t3.3	Swamps	90	$204 \pm 46$	$206 \pm 44$	$196 \pm 44$	$228 \pm 44$	$134 \pm 44$	$200 \pm 44$
t3.4	Bogs	50	$8 \pm 15$	$21 \pm 14$	$22 \pm 14$	$20 \pm 14$	$25 \pm 14$	$23 \pm 14$
t3.5	Tundra	5	$3 \pm 4$	$4 \pm 4$	$5 \pm 4$	$4 \pm 4$	$4 \pm 4$	$4 \pm 4$
t3.6	Rice agriculture	60	$69 \pm 18$	$54 \pm 17$	$50 \pm 17$	$56 \pm 16$	$47 \pm 17$	$59 \pm 17$
t3.7	Ruminant Animals	93	$94 \pm 19$	$91 \pm 18$	$88 \pm 18$	$91 \pm 18$	$89 \pm 18$	$91 \pm 18$
t3.8	Termites	20	$36 \pm 19$	$29 \pm 18$	$22 \pm 18$	$30 \pm 18$	$24 \pm 18$	$33 \pm 18$
t3.9	Biomass Burning	52	$65 \pm 20$	$88 \pm 18$	$102 \pm 18$	$94 \pm 18$	$68 \pm 18$	$80 \pm 18$
t3.10	Coal	38	$30 \pm 12$	$30 \pm 11$	$34 \pm 11$	$31 \pm 12$	$28 \pm 11$	$29 \pm 11$
t3.11	Natural gas	57	$57 \pm 18$	$52 \pm 18$	$56 \pm 18$	$53 \pm 18$	$46 \pm 18$	$53 \pm 18$
t3.12	Landfills	50	$42 \pm 14$	$35 \pm 14$	$35 \pm 14$	$36 \pm 14$	$33 \pm 14$	$37 \pm 14$
t3.13	Total source	515	609	610	610	644	498	609

t3.14 <sup>a</sup>Note that the relatively small ocean sources and all of the CH<sub>4</sub> sinks have been prescribed.

575 in  $CH_4$  from swamps relative to the a priori estimates. This difference is driven by the fact that forward simulations of 576the a priori estimates lead to an underestimate of SH CH<sub>4</sub> 577mixing ratios compared to the observations, as shown in 578Figure 1. Since swamps have a strong spatial footprint in 579the SH and the a priori estimates for wetlands are highly 580uncertain, the inverse model calls for an increase in 581swamps to match the interhemispheric gradient. Adding 582the observations of  $\delta^{13}$ CH<sub>4</sub> (S2) does not significantly 583change this conclusion. Since the isotopic signature of wetlands is strongly depleted in <sup>13</sup>C compared to the 584585atmosphere, this source is expected to be well constrained by the observations of atmospheric  $\delta^{13}CH_4$ . Therefore 586 587 the observations of  $CH_4$  and  $\delta^{13}CH_4$  both strongly support 588 an increased source from swamps. From a strictly 589atmospheric perspective, these features of the CH<sub>4</sub> obser-590vations might also be matched by a large increase in the 591ocean source, which was prescribed in this study, rather 592than an increase in swamp emissions. However, shipboard 593measurements of seawater and atmospheric CH<sub>4</sub> do not 594support such a dramatic increase in the oceanic CH<sub>4</sub> flux 595estimates [e.g., Bange et al., 1998; Bates et al., 1996; 596597Bange et al., 1994].

[31] Two recent process-model studies have also called 598for increased wetland spatial coverage or CH4 flux from 599 wetlands. Using a GCM in conjunction with a vegetation 600 model and algorithms for determining wetland area based 601 on topography and soil moisture, Kaplan [2001] estimated 602 603  $11.0 \times 10^{\circ}$  km<sup>2</sup> of wetlands globally, about twice the spatial coverage estimated by earlier wetland inventory approaches 604 [i.e., Aselmann and Crutzen, 1989; Matthews and Fung, 605 1987]. This was largely attributed to temporary wetlands 606 that are inundated for only part of the year and are therefore 607 not likely to be accounted for in wetland inventories. These 608 seasonal wetlands accounted for 61% of the total wetland 609 area estimate in this study, and over half of the seasonal 610 611 wetlands occur in the tropics. Although this study does show a large increase in the spatial extent of wetlands 612 compared to previous work, Kaplan concluded a CH4 613 wetland source of 140 Tg CH<sub>4</sub>/yr, only about 30 Tg CH<sub>4</sub>/yr 614 more than the inventory-based estimate of Matthews and 615Fung [1987] using a CH<sub>4</sub> flux estimation technique based 616 on heterotrophic respiration. In addition to the Kaplan study, 617 Walter [1998] used a process model to calculate flux from 618 wetlands as a function of temperature and hydrological 619 conditions, finding an unusually large source of 263 Tg 620 CH<sub>4</sub>/yr, even higher than that found in this top-down 621622 approach.

[32] The previous CH<sub>4</sub> inversions of *Hein et al.* [1997] 623 and Bergamaschi et al. [2001] also found a large source 624from swamps. Chen [2004] found a lower total wetland 625source of 140-150 Tg CH<sub>4</sub>/yr but very high emissions from 626 rice cultivation of 110-120 Tg CH<sub>4</sub>/yr. He suggested that 627 the high inverse estimate rice paddies may be partially due 628629 to wetlands since wetlands and rice paddies have similar spatial patterns and seasonal cycles. These studies are based 630 on different time periods than this one, so these estimates 631 are not entirely comparable; however, they are consistent 632 with the hypothesis that CH<sub>4</sub> emissions from swamps may 633be underestimated. 634

[33] The inverse flux estimates from bogs are reduced 635 relative to the a priori sources based on the CH<sub>4</sub> observa- 636 tions alone (S1), which is not surprising since this source 637 has a large spatial pattern in the NH, and the priors tend to 638 overestimate sources in the NH slightly in the forward 639 model. However, in S2, constrained by the observations 640 of  $\delta^{13}$ CH<sub>4</sub>, this source is not as greatly reduced. Like 641 swamps, the distinctive isotopic signature of the source 642 from bogs is expected to provide a strong constraint for 643 this source process. A very low estimate of CH<sub>4</sub> from bogs 644 from the 1998-1999 period would have been surprising 645 since 1998 was an unusually warm year with positive 646 precipitation anomalies over many high northern latitude 647 land regions during the growing season [Bell et al., 1999; 648 Curtis et al., 2001], and the anomalously high growth rate 649 in 1998 has been partially attributed to increased emissions 650 from northern wetlands resulting from these conditions 651 [Dlugokencky et al., 2001]. 652

[34] Both S1 and S2 estimated a somewhat high source 653 estimate for termites, although this difference is not large 654 compared to the error estimates on the a posteriori sources. 655 Since termites are a small, spatially diffuse source with a 656 similar isotopic signature to wetlands, rice paddies, and 657 ruminant animals, the station observations may not be 658 sufficient to discriminate between this source and the other 659 bacterial sources. 660

[35] As shown in Table 1, the a priori estimate for 661 biomass burning used in this study is on the high end of 662 the range of biomass burning estimates. This high estimate 663 of biomass burning is consistent with the observations of 664 CH<sub>4</sub>, since differences between S1 and the a priori estimate 665 are small compared to the uncertainty. The observations of 666  $\delta^{13}$ CH<sub>4</sub> call for an even greater biomass burning source. 667 This source is expected to be better constrained by the 668 observations of  $\delta^{13}$ CH<sub>4</sub> than any other source process. Like 669 bacterial sources, biomass burning has a very distinctive 670 isotopic signature; however, unlike these sources the isoto- 671 pic signature of biomass burning is not shared by any other 672 source process. The inverse studies of Hein et al. [1997], 673 and Bergamaschi et al. [2001] indicated a much lower 674 biomass burning source than this study, and the estimates of 675 Chen [2004] were somewhat lower. This may be due in part 676 to the limited use of  $\delta^{13}$ CH<sub>4</sub> observations to constrain the 677 total CH<sub>4</sub> budget in these studies, the differing observational 678 time period, or differences in inverse methodologies. Miller 679 et al. [2002] and Quay et al. [1999] also found relatively 680 high biomass burning sources using global mass balance 681 calculations of CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub>. In addition, recent studies 682 have indicated that the biomass burning source may have 683 been elevated during the period of this inversion 684 [Langenfelds et al., 2002; Van der Werf et al., 2004]. 685

[36] The landfill source estimate is reduced slightly com- 686 pared to the a priori estimates by the observations of 687 atmospheric  $CH_4$  and reduced further by the inclusion of 688 the  $\delta^{13}CH_4$  observations. The isotopic signature of the 689 landfill source is very close to that of the background 690 atmosphere, so it is not constrained very well by the 691 atmospheric isotopic data. 692

[37] Differences between a priori and a posteriori esti- 693 mates of CH<sub>4</sub> emissions from tundra, rice agriculture, 694



Total A Priori Flux





Difference Between A Posteriori and A Priori





Methane Flux (Tg CH<sub>4</sub>/grid box)

ruminant animals, coal, and natural gas are small compared 695 to the inverse error estimates for both S1 and S2. In order to 696 visualize the differences between the total a priori and a 697 posteriori fluxes spatially, the emissions estimates from the 698 source processes were used to create a total flux map by 699 multiplying the assumed a priori spatial pattern for each 700 source process by the corresponding inverse source esti- 701 mate. Recall that we have not estimated the flux from 702 each grid box individually. In Figure 2, the total flux 703 maps for the a priori CH<sub>4</sub> flux, the a posteriori CH<sub>4</sub> flux 704 (S2), and the differences between the a priori and a 705 posteriori estimates are compared. While the small ocean 706 source has been prescribed, there are some emissions 707 occurring in ocean regions due to the presence of 708 islands. 709

[38] Overall, the a posteriori estimates have been reduced 710 relative to the a priori sources in the NH and increased in the 711 SH, which is consistent with the changes expected from the 712 interhemispheric gradient of the forward simulation in 713 Figure 1. In North America and western Europe, the total 714 a posteriori flux is smaller than the a priori flux, largely due 715 to decreases in estimated emissions from landfills and coal 716 in industrial regions and the small decrease in bogs at high 717 northern latitudes. In eastern Eurasia, there is a slight 718 decrease in some high-latitude regions due to the decrease 719 in the a posteriori bog source relative to the a priori sources 720 and an increase in midlatitudes resulting from the large 721 increase in swamps.

[39] The spatial pattern of the difference between the a 723 priori and a posteriori fluxes is especially interesting in 724 Southeast Asia. In much of Asia, there is a decrease in 725 the total a posteriori flux estimates relative to the a priori 726 source estimates due to decreases in the emissions from 727 rice agriculture and coal mining. However, nearby grid 728 boxes in southern China and Indonesia show a great 729 increase in CH<sub>4</sub> emissions over the a priori sources 730 caused by the dramatic increase in the swamp source 731 strength. This may be a bias in the model associated with 732 the large spatial extent of the source-process regions. It is 733 possible that the spatial pattern of swamps overestimates 734 relative importance of the wetland contribution from these 735 islands. However, due to the aggregation of the CH<sub>4</sub> 736 fluxes to an entire source process in the inverse model, 737 the flux from this small region must be increased pro- 738 portionally to all other swamps, possibly leading to an 739 overestimate of the flux from these islands. In order to 740 accommodate this overestimate, the inverse model might 741 underestimate the source from the continental rice 742 paddies. This possibility illustrates one of the major 743 problems associated with this type of inverse model. 744 Since the isotopic signatures of rice paddies and swamps 745 are similar, including the observations of  $\delta^{13}$ CH<sub>4</sub> is not 746 likely to improve this problem. 747



779

t4.1 **Table 4.** Hemispheric and Global Total CH<sub>4</sub> Fluxes of the A Priori Estimates, Inverse Estimates Constrained by the Isotopes (S2), and the Work of *Houweling et al.* [1997]

t4.2	Region	A Priori Estimates (S0)	A Posteriori Estimates (S2)	Houweling et al. [1999]
t4.3	NH	398	401	340
t4.4	SH	127	209	165
t4.5	NH:SH ratio	3.1	1.9	2.0
t4.6	Global total	525	610	505

T48 [40] The largest increases in  $CH_4$  flux over the a priori estimates occur in South America and Africa, and are primarily driven by the large increase in swamps and biomass burning and secondarily affected by the larger a posteriori estimates of termites and natural gas. This change is in approximate agreement with the inverse  $CH_4$  flux maps of *Houweling et al.* [1999].

[41] The hemispheric distribution of the sources in the a 755 756priori estimates, the a posteriori estimates, and the inverse study of Houweling et al. [1999] are compared in Table 4. 757 As illustrated in more detail above, the NH:SH ratio is 758 strongly reduced by including the atmospheric observations. 759The a posteriori NH:SH ratio used in this study is 760remarkably similar to the values estimated by Houweling 761 et al. [1999], despite significant differences in the model 762 representation of the OH sink, inverse technique, and time 763 period of the inverse model. The Houweling study 764 [Houweling et al., 1999] used a chemistry transport model 765 (CTM) tuned to match the CH<sub>3</sub>CCl<sub>3</sub> observations to 766 represent the OH chemistry and a time-independent inverse 767 technique in which the inverse model was solved for each 768 model grid box rather than aggregating the model to larger 769 inverse regions. The similarities between the NH:SH ratio 770 of these very different inverse models suggests this feature 771 is robust with respect to OH loss and inverse technique and 772 strongly driven by the atmospheric data. The large 773differences between the global total CH<sub>4</sub> flux estimated 774by Houweling et al. and this study are due partly to the fact 775

that they were modeling an earlier time period (1993–1995) 776 and partly to the smaller estimate of the OH sink (450 Tg 777  $CH_4/yr$ ) by Houweling et al. 778

#### 4. Interannual Variability

[42] The time period covered by these estimates coincides 780 with the anomalously large 1998 CH<sub>4</sub> growth rate followed 781 by a decrease in the CH<sub>4</sub> growth rate in 1999, so these 782 inverse results may be able to add to the discussion of the 783 causes of these anomalies. Unfortunately, the observations 784 of  $\delta^{13}$ CH<sub>4</sub> at the NOAA CMDL flask sites did not begin 785 until 1998 and the model requires 3 months of spin-up time, 786 so only 9 months of inverse results for 1998 are available. 787 Table 5 shows the mean source estimates for the last 788 9 months of 1998 and the full year of 1999. The a priori 789 sources do not vary interannually but do vary seasonally. 790 Differences between the a priori estimates listed for 1998 791 and 1999 represent the seasonal bias associated with only 792 including the last 9 months of 1998 in the average, where 793 the full year is included for 1999. The total a posteriori 794 source estimate is much larger for 1998 than 1999, due in 795 part to the seasonal bias associated with the time period 796 sampled and in part to the anomalous 1998 growth rate. In 797 the a priori sources, the April-December mean is 25 Tg 798 CH<sub>4</sub>/year higher than the annual average. In addition, the 799 1998 growth rate increase corresponds to an increase of 800  $\sim$ 24 Tg CH<sub>4</sub>/yr in the imbalance between CH<sub>4</sub> sources and 801 sinks compared to the earlier 1995-1997 time period 802 [Dlugokencky et al., 2001]. Between 1998 and 1999, the 803 global observed growth rate decreased from 12.7 ppb to 804 2.6 ppb, indicating a corresponding decrease in the source/ 805 sink imbalance. 806

[43] Currently, there are two competing hypotheses 807 regarding the 1998 growth rate anomaly. On the basis of 808 careful analysis of the methane growth rate and a process 809 model experiment, *Dlugokencky et al.* [2001] suggested that 810 the 1998 growth rate increase was due to increased flux 811 from wetlands as a result of the temperature and precipita- 812 tion anomalies. Conversely, a recent multispecies analysis 813 study suggested that a great deal of the 1998 CH<sub>4</sub> growth 814

t5.2	Sources	A Priori Estimates April−Dec. Mean, Tg CH₄/yr	A Posteriori (S2) 1998 April–Dec. Mean, Tg CH <sub>4</sub> /yr	A Priori Estimates Annual Mean, Tg CH <sub>4</sub> /yr	A Posteriori (S2) 1999 Annual Mean, Tg CH <sub>4</sub> /yr			
t5.3	Swamps	92	$221 \pm 44$	90	$208 \pm 44$			
t5.4	Bogs	61	$30 \pm 13$	50	$12 \pm 143$			
t5.5	Tundra	7	$12 \pm 4$	5	$0 \pm 4$			
t5.6	Rice agriculture	71	$53 \pm 17$	60	$56 \pm 17$			
t5.7	Ruminant animals	93	$97 \pm 18$	93	$87 \pm 18$			
t5.8	Termites	20	$48 \pm 18$	20	$16 \pm 18$			
t5.9	Biomass Burning	51	$91 \pm 18$	52	$88 \pm 20$			
t5.10	Coal	38	$15 \pm 11$	38	$40 \pm 11$			
t5.11	Natural gas	57	$49 \pm 18$	57	$62 \pm 18$			
t5.12	Landfills	50	$34 \pm 14$	50	$31 \pm 14$			
t5.13	Total source	540	646	515	601			

t5.1 **Table 5.** Mean A Priori and A Posteriori Flux Estimates of  $CH_4$  Flux for April–December 1998 and All of 1999<sup>a</sup>

<sup>a</sup>Note that the a priori source estimates do not include interannual variability. The differing a priori sources from 1998 to 1999 t5.14 reflect the seasonality of the sources since the two time-averaged values include different months.



**Figure 3.** Comparison between the monthly mean  $\delta^{13}$ CH<sub>4</sub> measurement record at six observing stations (diamonds), model simulation based on a priori sources (asterisks), and the model simulation based n the a posteriori sources (squares). The observing stations shown are Barrow, Alaska (BRW), Niwot Ridge, Colorado (NWR), Mauna Loa, Hawaii (MLO), Tutuila, American Samoa (SMO), Cape Grim, Tasmania (CGO), and South Pole, Antarctica (SPO). Error bars on the measurements represent the standard deviation of the individual observations from the smoothed curve.

rate anomaly was caused by biomass burning rather than 815 wetlands based on correlations between atmospheric 816 observations of CO<sub>2</sub> and it's  $\delta^{13}$ C, H<sub>2</sub>, CH<sub>4</sub>, and CO 817 [Langenfelds et al., 2002]. In addition, Van der Werf et al. 818 [2004] also attributed much of the CH<sub>4</sub> anomaly to biomass 819 820 burning based on satellite observations of fires combined 821 with atmospheric models, CO observations, and observed 822 emission rations.

[44] The results of this inversion support the conclusions 823 of Dlugokencky et al. [2001] that a large portion of the 1998 824 growth rate anomaly was due to an unusually large wetland 825 source. The large change between 1998 and 1999 occur in 826 the wetland sources including swamps, bogs, and tundra, 827 although the interannual variations in swamps and bogs are 828 not far larger than the error estimates and should be 829 interpreted with caution. In addition, the large change in the 830 termite source, which is not consistent with process-level 831 understanding of the interannual variability of termite 832 emissions, is most likely due to variability in the wetland 833 source. Since the termite source has a similar isotopic 834

signature to wetlands and a somewhat similar spatial 835 footprint to swamps, it is possible that the inverse model 836 is not effectively partitioning these two sources and part of 837 this variability is actually due to wetlands. The magnitude 838 of the 1998–1999 wetland variations is also in reasonable 839 agreement with the process model simulations of 840 Dlugokencky et al. regarding the anomaly. Using a global 841 process-based model that includes soil temperature and 842 moisture, they calculated an emission anomaly of 843 11.6 Tg CH<sub>4</sub>/yr for wetlands north of 30°N and 13 Tg for 844 tropical wetlands. 845

[45] There is very little variation in the biomass burning 846 estimate between these two model years. However, it is 847 likely that fires played an important role in the increasing 848 growth rate at the end of 1997 and perhaps the beginning of 849 1998, consistent with the Langenfelds study [*Langenfelds et 850 al.*, 2002]. There was an anomalous wildfire source from 851 peat fires in Asia at the end of 1997, resulting in a large 852 perturbation to the carbon cycle [*Page et al.*, 2002], but this 853 event is not observed in these results, since 1997 and the 854

early months of 1998 were not included in these estimates. 855In addition, owing to the large uncertainty estimates 856 associated with this work, these results do not preclude a 857 moderate biomass burning anomaly in addition to large 858 wetland fluxes during 1998. For example, if OH was lower 859 in 1998 than 1999 [e.g., Novelli et al., 2003], the ratio of 860 bacterial sources to biomass burning sources might also be 861 overestimated in 1998 and/or underestimated in 1999, since 862 OH enriches atmospheric  $CH_4$  in  $^{13}C$ . 863

[46] The reason that the inversion attributed the bulk of 864 865 the 1998-1999 variability to bacterial sources rather than biomass burning can be found in the observational record of 866  $\delta^{13}$ CH<sub>4</sub> (Figure 3). If this anomaly were primarily due to 867 biomass burning, one would expect to see a peak in the 868 observations of  $\delta^{13}$ CH<sub>4</sub> to reflect the relatively heavy 869 isotopic signature of this source. Instead, more negative 870  $\delta^{13}$ CH<sub>4</sub> isotopic signatures were observed at Barrow, 871 Alaska, Mauna Loa, Hawaii, and Cape Grim, Tasmania, 872 in late 1998. Therefore the observations used to constrain 873 this model call for greater fluxes from sources with lighter 874 isotopic signatures than the background atmosphere in 875 1998, resulting in high estimates of bacterial sources. 876

877 [47] Two hypothetical model scenarios were used to examine how well the observations of  $CH_4$  and  $\delta^{13}CH_4$ . 878 might be able to constrain a biomass burning anomaly. The 879 1998 anomaly reflects to a source/sink imbalance of 24 Tg 880 CH4 [Dlugokencky et al., 2001]. In one biomass burning 881 scenario, the entire anomaly is attributed to biomass burning 882 883 by increasing the a posteriori biomass burning by 24 Tg CH<sub>4</sub> in 1998 and reducing the a posteriori wetland source 884 by an equal amount. The second scenario reflects the effect 885 of attributing one third of the total anomaly to biomass 886 burning and the remainder to wetlands, following the results 887 of an earlier analysis of  $\delta^{13}$ CH<sub>4</sub> [*Miller et al.*, 2002]. 888

[48] These scenarios were constructed by combining *the a* posteriori CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> mixing ratios with CH<sub>4</sub> and <sup>13</sup>CH<sub>4</sub> mixing ratios calculated by forward model simulations of a 1998 biomass burning perturbation, [CH<sub>4</sub>]<sub>BB</sub> pert, and a 1998 wetland perturbation, [CH<sub>4</sub>]<sub>BB</sub> pert, in which both perturbations include OH loss. The resulting concentrations of CH<sub>4</sub> and <sup>13</sup>CH<sub>4</sub> can be written as

$$\left[\mathrm{CH}_{4}\right]_{Scenario} = \left[\mathrm{CH}_{4}\right]_{a \text{ posteriori}} + \left[\mathrm{CH}_{4}\right]_{BB \text{ pert}} - \left[\mathrm{CH}_{4}\right]_{Wetl. \text{ pert}} (9)$$

$$\begin{bmatrix} {}^{13}\text{CH}_4 \end{bmatrix}_{\text{Scenario}} = \begin{bmatrix} {}^{13}\text{CH}_4 \end{bmatrix}_{\text{a posteriori}} + \begin{bmatrix} {}^{13}\text{CH}_4 \end{bmatrix}_{\text{BB pert}} - \begin{bmatrix} {}^{13}\text{CH}_4 \end{bmatrix}_{\text{Wetl. pert}}.$$
 (10)

899 Then the  $\delta^{13}$ CH<sub>4</sub> for the new scenario is calculated 900 following equation (4).

901 [49] A 24 Tg CH4 increase in the biomass burning source 902 and a corresponding decrease in the wetland source during 1998 would result in a significant change in the  ${}^{13}C/{}^{12}C$ 903 isotopic ratio of atmospheric CH<sub>4</sub> at most observing sta-904 tions, but very little change in the CH<sub>4</sub> mixing ratio, as 905 shown for MLO in Figure 4. At the end of 1998, the 906 atmospheric  $\delta^{13}$ CH<sub>4</sub> for this scenario is between 0.16 and 907 0.23 per mil higher than the a posteriori isotopic signature 908



Figure 4. Comparison between the monthly mean (top)  $\delta^{13}$ CH<sub>4</sub> and (bottom) CH<sub>4</sub> measurement record at MLO (diamonds), model simulation based on a posteriori sources (squares), and two scenarios which explore the effect of a 1998 biomass burning anomaly on atmospheric  $\delta^{13}$ CH<sub>4</sub> and CH<sub>4</sub>. In once scenario, the entire 1998 anomaly was attributed to biomass burning by reducing the a posteriori wetland source by 24 Tg CH<sub>4</sub> during 1998 and increasing the a posteriori biomass burning source by the same amount (asterisks). Then, the possibility of an anomaly due to a combination of increased biomass burning and wetland emissions was examined by reducing the a posteriori wetland source by 8 Tg CH<sub>4</sub> during 1998 and increasing the a posteriori biomass burning source by the same amount (triangles). Error bars on the measurements represent the standard deviation of the individual observations from the smoothed curve.

for the three NH stations and between 0.02 and 0.16 per mil 909 higher for the SH stations. At MLO, NWR, and SMO, the 910 difference between the a posteriori  $\delta^{13}$ CH<sub>4</sub> and the new 911 scenario during 1999 is close to the magnitude of the 912 seasonal cycle. Conversely, the second scenario, in which 913 only one third of the total anomaly is shifted to biomass 914 burning, is still reasonably consistent with the observations 915 (Figure 4). This simulation combined with the error estimate 916 associated with the a posteriori biomass burning flux 917 indicates that the observations used to constrain the inverse 918 model are consistent with moderate contribution of biomass 919 burning to the 1998 growth rate anomaly. 920

[50] The simulated  $CH_4$  concentrations are very similar 921 for the a posteriori case and both biomass burning 922 scenarios (Figure 4, bottom), as would be expected based 923



**Figure 5.** (top) Latitudinal gradient of the a priori and a posteriori  $CH_4$  flux estimates and (bottom) the difference between the a posteriori flux estimates for the inverse scenarios described in Table 2 and the standard inverse scenario, S2.

924 on the work of *Fung et al.* [1991]. This suggests that a 925 24 Tg CH<sub>4</sub> perturbation from biomass burning perturbation 926 would be very difficult to distinguish from a similar 927 perturbation due to wetlands based on the observations of 928 CH<sub>4</sub> alone. Observations of  $\delta^{13}$ CH<sub>4</sub> provide far more insight 929 into the source processes controlling changes of this 930 magnitude.

[51] The changes in landfills, natural gas, coal, ruminant 931animals, and termites between 1998 and 1999 probably 932 primarily reflect model noise as a function of time. These 933 934sources do not have significant seasonal variations, so 935 seasonal bias issues do not apply to these sources. In addition, large variability on annual timescales is unlikely 936 for these sources. For example, while the ruminant animal 937 source is likely to change significantly with changes in feed 938 quality, age demographics of the animals, and other factors, 939 940these kinds of changes on a global scale are not likely to occur over a 2-year time period. 941

#### 942 5. Sensitivity of the Results

943 [52] In order to determine whether the major conclusions
944 of this study are robust with respect to several sources of
945 uncertainty, inverse estimates have been calculated after
946 varying a number of model features in scenarios 3–7,
947 summarized in Table 2. The results of these sensitivity tests

are compared to the base scenario, S2, in Table 3 and 948 Figure 5 (bottom). 949

[53] Overall, the major conclusions of the inverse study 950 are reasonably robust with respect to changes in these model 951 parameters. Changing the KIE of CH<sub>4</sub> oxidation by OH (S3) 952 had very little effect on the inverse results. The differences 953 between S2 and S3 never exceed the error bars of the 954 inverse estimates. The largest percent difference between 955 these two model runs is the biomass burning source, which 956 changes by 14%. Since the smaller OH KIE results in less 957 enrichment in atmospheric <sup>13</sup>C from the chemical sink, the 958 inverse model calls for more biomass burning, since 959 the biomass burning source is very enriched compared to 960 the atmosphere. Since bacterial sources deplete the atmo- 961 sphere in <sup>13</sup>C, most of the bacterial sources are reduced 962 slightly between S2 and S3. Because OH concentrations are 963 much higher low latitudes, the largest perturbations to the 964 emissions under this scenario occur in the tropics (Figure 5), 965 and emissions from bogs and tundra, which occur predom- 966 inantly at high latitudes, increased slightly in S3 rather than 967 decreasing. 968

[54] S4 and S5 test the upper and lower limits of the OH 969 fields, as determined by Spivakovsky et al. [2000]. Recall 970 that the lower limit test (S4) is expected to diverge more 971 from S2 than the upper limit test (S5) because the base 972 scenario is closer to the high end of the range. In both the 973 upper and lower limit, the global total CH<sub>4</sub> source strength 974 changes significantly, since the total magnitude of the sink 975 is changed relative to the base scenario while the amount of 976  $CH_4$  in the atmosphere remains unchanged, with the greatest 977 changes occurring for sources with large emissions in the 978 tropics (Figure 6). The upper limit OH estimate results in 979 very little divergence from the base scenario for most 980 sources, but does result in increased emissions from 981 biomass burning and swamps. Applying the lower limit 982 OH sink to the inversion (S5) results in large changes in the 983 inverse flux estimates in the tropics (Figure 5). The largest 984 decrease occurs in swamps; however, even with this 985 decrease, the inverse model still calls for a large increase 986 in this source compared to the a priori source estimates. A 987 corresponding large change occurs in biomass burning, 988 showing that the relatively high estimates of biomass 989 burning found in this study are not robust in the lower limit 990 of OH production. Changes to the other source strength 991 estimates are small relative to the error estimates. The strong 992 perturbations to the CH<sub>4</sub> emissions from swamps and 993 biomass burning relative to the other source processes are 994 probably due to the fact that destruction by OH is the 995 greatest in the tropics, and these two source processes occur 996 largely in the tropics, while their isotopic signatures have 997 opposite effects on the atmosphere. Therefore, decreasing 998 both sources corrects for the OH perturbation while 999 matching the  $\delta^{13}$ CH<sub>4</sub> observations. Finally, the changes in 1000 the source estimates from a large change in initial conditions 1001 are small. 1002

[55] Overall, the most of the conclusions from the 1003 previous section are robust with respect to these changes 1004 in the model parameters tested here, but the a posteriori 1005 flux estimates are sensitive to large changes in OH. Since 1006 the OH sink is the largest single component of the  $CH_4$  1007



**Figure 6.** Comparison between the monthly mean  $CH_4$  measurement record at six observing stations (diamonds), model simulation based on a priori sources (asterisks), and the model simulation based on the a posteriori sources (squares). Error bars on the measurements represent the standard deviation of the individual observations from the smoothed curve.

1008 budget, and changing the fractionation of this sink by 1009 1.5‰ did not significantly change the inverse estimates, 1010 the results shown here are not expected to be strongly 1011 sensitive to small changes in the isotopic signatures of 1012 the sources.

# 1013 6. A Posteriori Atmospheric CH<sub>4</sub> Mixing Ratios 1014 and $\delta^{13}$ CH<sub>4</sub>

1015 [56] One advantage of inverse source estimates is that they 1016 are constrained by the observations of the trace gas in the 1017 atmosphere. Therefore forward simulations using the inverse 1018 estimates should reproduce the broad features of the obser-1019 vations such as the interhemispheric gradient and seasonal 1020 cycle at observing stations well. Figures 1, 3, and 6 compare 1021 the modeled  $CH_4$  and  $\delta^{13}CH_4$  based on the a posteriori 1022 sources to those based on a priori sources to the observa-1023 tional record at the stations used to constrain the inversion. 1024 Figure 7 compares the a posteriori  $\delta^{13}CH_4$  with the observational record from two NIWA stations that were not used 1025 to constrain the inversion, Baring Head, New Zealand, and 1026 Scott Base, Antarctica [*Lowe et al.*, 1994], as an 1027 independent validation of the inverse model. 1028

[57] The inverse sources match the observed latitudinal 1029 gradients of both  $CH_4$  and  $\delta^{13}CH_4$  well, especially in 1030 comparison to the a priori estimates (Figure 1). There are 1031 two stations that have very high observed values compared 1032 to other stations at similar latitudes, which are not well 1033 matched by the inverse estimates. These stations, located on 1034 the Black Sea in Romania (BSC) and Cape Rama, India 1035 (CRI), are likely to be influenced by the large continental 1036 sources nearby. The observations at stations sampling 1037 continental air were given a higher uncertainty than obser-1038 vations at stations sampling marine air, implying that 1039 stations sampling continental air do not constrain the 1040 inverse model as strongly as those sampling marine air. 1041 The reason for weighting these stations more weakly in the 1042 inversion is that these data are influenced more strongly by 1043



**Figure 7.** Comparison between the  $\delta^{13}$ CH<sub>4</sub> measurement (diamonds) and the model simulation based on the a posteriori sources (squares) for two NIWA observing stations: Baring Head, New Zealand, and Scott Base, Antarctica [*Lowe et al.*, 1994].

1044 local sources, small-scale transport effects, and other factors 1045 that cannot be represented effectively in a coarse resolution 1046 model. The a posteriori  $CH_4$  does not reproduce observa-1047 tions at BSC and CRI well because they are weighted more 1048 weakly, and a linear combination of large source regions 1049 that matched these stations well would not be consistent 1050 with the other station observations.

1051 [58] The monthly mean observations and model results 1052 are compared at the six NOAA CMDL stations where 1053 both observations of CH<sub>4</sub> and observations of  $\delta^{13}$ CH<sub>4</sub> are 1054 made (Figures 3 and 5). Overall, the a posteriori esti-1055 mates match the broad features of the CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> 1056 observations at these stations, as well as at the two NIWA 1057 stations that were not used to constrain the inverse model 1058 (Figure 7).

1059 [59] In all cases, the a posteriori  $CH_4$  source estimates 1060 result in a far better match to the station observations 1061 than the a priori estimates. The a posteriori correct the a 1062 priori underestimate of the overall magnitude of the  $CH_4$ 1063 mixing ratio as well as the poor match to the a priori 1064 seasonal cycle at BRW and MLO. There is a small a 1065 posteriori overestimate of  $CH_4$  at NWR at the end of 1066 1998. The use of large spatial regions and coarse model 1067 resolution can sometimes preclude an exact match to the 1068 station observations based on linear combinations of these 1069 large regions, and this may have caused this discrepancy. The a posteriori calculation of atmospheric  $\delta^{13}$ CH<sub>4</sub> 1070 generally matches the mean observed  $\delta^{13}$ CH<sub>4</sub> and the 1071 observed  $\delta^{13}$ CH<sub>4</sub> seasonal cycle, as accurately as the CH<sub>4</sub> 1072 match.

#### 7. Conclusions 1074

[60] We have presented source estimates that are 1075 optimally consistent with the observations of atmospheric 1076  $CH_4$  and  $\delta^{13}CH_4$  and process-level understanding of the 1077 sources and sinks. There are many important departures 1078 from previous source estimates. The  $CH_4$  source from 1079 wetlands was unusually large, which agrees with two recent 1080 process-level models suggesting a greater importance of 1081 wetland ecosystems than previously thought [*Kaplan*, 2001; 1082 *Walter*, 1998]. The interannual distribution of this source 1083 supports the hypothesis of *Dlugokencky et al.* [2001] that the 1084 1998 growth rate anomaly was primarily caused by increased 1085 wetland emissions. Biomass burning source estimates were 1086 very high, in agreement with an earlier study incorporating 1087 observations of  $\delta^{13}CH_4$  [*Miller et al.*, 2002].

[61] These results show that through inverse modeling, 1089 the atmospheric CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> observations have the 1090 capacity to add unique insight into the CH<sub>4</sub> problem, but 1091 significant limitations to this technique persist. While the 1092 inverse results are robust with respect to changes in the 1093 initial conditions and the OH KIE, the CH<sub>4</sub> flux estimates 1094 for biomass burning and swamps are sensitive to changes in 1095 the assumed OH sink. The inverse estimates may also be 1096 sensitive to inaccuracies in model transport and the assumed 1097 isotopic signature of the sources. The aggregation of the 1098 sources into spatially diffuse source process regions intro- 1099 duces both a source of error and a limitation to the 1100 understanding that may be provided by the inverse esti- 1101 mates. The error is introduced by the assumption that the 1102 CH<sub>4</sub> flux can be represented by a linear combination of a 1103 small number of source regions and that the assumed spatial 1104 pattern of the CH<sub>4</sub> emissions within these regions are 1105 perfect. In reality, the spatial distributions of many of the 1106 source processes are likely to vary with regional tempera- 1107 ture anomalies and other physical processes. In addition, 1108 grouping the sources in this way removes the potential to 1109 use the CH<sub>4</sub> and  $\delta^{13}$ CH<sub>4</sub> observations to diagnose changes 1110 in CH<sub>4</sub> flux on regional scales. 1111

#### Appendix A: Derivation of Equation (5) 1112

[62] First, equation (3) is divided by an arbitrary reference 1113 ratio of  ${}^{13}\text{C}/{}^{12}\text{C}$ .

$$\frac{R_j^{\text{obs}}}{R_{\text{reference}}} y_j^{\text{obs}} - \frac{R_j}{R_{\text{reference}}} y_j = \sum_{i=1,\text{nsrc}} \mathbf{H}_{i,j} \frac{R_i}{R_{\text{reference}}} x_i.$$
(A1)

Then, equation (2) is subtracted from equation (A1).

$$\left(\frac{R_j^{\text{obs}}}{R_{\text{reference}}} y_j^{\text{obs}} - y_j^{\text{obs}}\right) - \left(\frac{R_j}{R_{\text{reference}}} y_j - y_j\right)$$
$$= \sum_{i=1,nsrc} \mathbf{H}_{i,j} \frac{R_i}{R_{\text{reference}}} x_i - \sum_{i=1,nsrc} \mathbf{H}_{i,j} x_i.$$
(A2)

1117 Equation (A2) is multiplied by 1000 and rearranged.

$$\left(\frac{R_j^{\text{obs}}}{R_{\text{reference}}} - 1\right) \times 1000 \times y_j^{\text{obs}} - \left(\frac{R_j}{R_{\text{reference}}} - 1\right) \times 1000 \times y_j$$
$$= \sum_{i=1,\text{nsrc}} \mathbf{H}_{i,j} x_i \times \left(\frac{R_i}{R_{\text{reference}}} - 1\right) \times 1000.$$
(A3)

1120 Finally, equation (4), the definition of  $\delta$  units, can be 1121 substituted into equation (A3) to reach equation (5).

$$\delta_j^{\text{obs}} y_j^{\text{obs}} - \delta_j y_j = \sum_{i=1,\text{nsrc}} \mathbf{H}_{i,j} x_i \delta_i$$

1124[63] Acknowledgments. We thank Jim White, Scott Denning and 1125 A. R. Ravishankara for their insightful comments and helpful discussions. 1126 We are especially grateful to all of the scientists responsible for the 1127 observations that made this work possible, including all of the contributors 1128 to the Cooperative Air Sampling Network and the Carbon Cycle Green-1129 house Gases Group at NOAA. In particular, we thank Jim White and 1130 INSTAAR for the measurements of  $\delta^{13}$ CH<sub>4</sub> and Ken Masarie for his work 1131 on the GLOBALVIEW data product. The authors also acknowledge Dave 1132 Lowe, Gordon Brailsford, and Ross Martin for the  $\delta^{13}CH_4$  observations at 1133 Baring Head, New Zealand, and Scott Base, Antarctica. S. F., P. T., L. B., 1134 and J. M. acknowledge the NOAA Office of Oceanic and Atmospheric 1135 Research for support. S. F. also acknowledges CIRES for support through 1136 the Graduate Research Fellowship program and the Biosphere Atmosphere 1137 Stable Isotope Network (BASIN) for travel funding that facilitated the 1138 development of this work. This research has also been presented in S. F.'s 1139 doctoral dissertation at the University of Colorado, Boulder, Colorado, 1140 USA, 2003.

#### 1141 References

- 1142 Aselmann, I., and P. J. Crutzen (1989), Global distribution of natural fresh-
- water wetlands and rice paddies, their net primary productivity, season-ality, and possible methane emissions, J. Atmos. Chem., 8, 307-358. 11431144
- 1145 Bange, H. W., U. H. Bartell, S. Rapsomanikis, and M. O. Andreae (1994),
- 1146 Methane in the Baltic and North Seas and a reassessment of the marine
- emissions of methane, *Global Biogeochem. Cycles*, *8*, 465–480.
  Bange, H. W., R. Ramesh, S. Rapsomanikis, and M. O. Andreae (1998),
  Methane in surface waters of the Arabian Sea, *Geophys. Res. Lett.*, *25*, 11503547 - 3550
- 1151 Bates, T. S., K. C. Kelly, J. E. Johnson, and R. H. Gammon (1996), A 1152reevaluation of the open ocean source of methane to the atmosphere, J. Geophys. Res., 101, 6953-6961. 1153
- 1154 Bekki, S., K. S. Law, and J. A. Pyle (1994), Effect of ozone depletion on atmospheric CH4 and CO concentrations, Nature, 371, 595-597 1155
- 1156Bell, G. D., M. S. Halpert, C. F. Ropelewski, V. E. Kousky, A. V. Douglas,
- R. C. Schnell, and M. E. Gelman (1999), Climate assessment for 1998, 1157
- Bull. Am. Meteorol. Soc., 80, S1–S48.
  Bergamaschi, P., M. Bräunlich, T. Marik, and C. A. M. Brenninkmeijer
- 1160(2000a), Measurements of the carbon and hydrogen isotopes of atmo-1161 spheric methane at Izaña, Tenerife: Seasonal cycles and synoptic-scale
- variations, J. Geophys. Res., 105, 14,531-14,546. 1162
- 1163 Bergamaschi, P., R. Hein, M. Heimann, and P. J. Crutzen (2000b), Inverse modeling of the global CO cycle: 1. Inversion of CO mixing ratios, J. Geophys. Res., 105, 1909–1927. 1164
- 1165
- Bergamaschi, P., D. C. Lowe, M. R. Manning, R. Moss, T. Bromley, and 1166 T. S. Clarkson (2001), Transects of atmospheric CO, CH<sub>4</sub>, and their 1167
- 1168 isotopic composition across the Pacific: Shipboard measurements and validation of inverse models, J. Geophys. Res., 106, 7993-8011. 1169
- 1170 Bingemer, H. G., and P. J. Crutzen (1987), The production of methane from solid wastes, J. Geophys. Res., 92, 2181-2187. 1171
- Brenninkmeijer, C. A. M., D. C. Lowe, M. R. Manning, R. J. Sparks, and P. F. J. van Velthoven (1995), The <sup>13</sup>C, <sup>14</sup>C, and <sup>18</sup>O isotopic composition 1172
- 1173
- of CO, CH<sub>4</sub>, and CO<sub>2</sub> in the higher southern latitudes lower stratosphere, 1174J. Geophys. Res., 100, 26,163-26,172. 1175
- Bruhwiler, L., P. Tans, and M. Ramonet (2000), A time-dependent 1176
- assimilation and source retrieval technique for atmospheric tracers, in 1177 1178Inverse Methods in Global Biogeochemical Cycles, Geophys. Monogr.
- 1179Ser., vol. 114, edited by P. Kasibhatla et al., pp. 265-277, AGU,
- Washington, D. C. 1180

- Cantrell, C. A., R. E. Shetter, A. H. McDaniel, J. G. Calvert, J. A. 1181 Davidson, D. C. Lowe, S. C. Tyler, R. J. Cicerone, and J. P. Greenberg 1182 (1990), Carbon kinetic isotope effect in the oxidation of methane by the 1183 hydroxyl radical, J. Geophys. Res., 95, 22,455-22,462. 1184
- Chanton, J. P., C. M. Rutkowski, C. C. Schwartz, D. E. Ward, and 1185 L. Boring (2000), Factors influencing the stable isotope signature of 1186 methane from combustion and biomass burning, J. Geophys. Res., 105, 1187 1867 - 18771188
- Chen, Y.-H. (2004), Estimation of methane and carbon dioxide surface 1189fluxes using a 3-D global atmospheric chemical transport model, Ph.D. 1190 thesis, Mass. Inst. of Technol., Cambridge, Mass. 1191
- Cicerone, R. J., and R. S. Oremland (1988), Biogeochemical aspects of 1192 atmospheric methane, Global Biogeochem. Cycles, 2, 299-327 1193
- Curtis, S., R. Adler, G. Huffman, E. Nelkin, and D. Bolvin (2001), Evolu-1194tion of tropical and extratropical precipitation anomalies during the 1195 1997–1999 ENSO Cycle, *Int. J. Climatol.*, 21, 961–967. 1196 DeMore, W. B., S. P. Sander, D. M. Golden, R. F. Hampson, M. J. Kurylo, 1197
- C. J. Howard, A. R. Ravishankara, C. E. Kolb, and M. J. Molina (1997), 1198Chemical kinetics and photochemical data for use in stratospheric mod-1199eling, Publ. 97-4, Jet Propulsion Lab., Pasadena, Calif. 1200
- Denning, S. A., et al. (1999), Three-dimensional transport and concentra-1201 tion of SF6: A model intercomparison study (Transcom 2), Tellus, Ser. B, 120251, 266-297 1203
- Dlugokencky, E. J., E. G. Dutton, P. C. Novelli, P. P. Tans, K. A. Masarie, 1204K. O. Lantz, and S. Madronich (1996), Changes in CH4 and CO growth 1205 rates after the eruption of Mt. Pinatubo and their link with changes in 1206tropical tropospheric UV flux, Geophys. Res. Lett., 23, 2761-2764. 1207
- Dlugokencky, E. J., K. A. Masarie, P. M. Lang, and P. P. Tans (1998), 1208Continuing decline in the growth rate of the atmospheric methane burden, 1209 Nature, 393, 447-450. 1210
- Dlugokencky, E. J., B. P. Walter, K. A. Masarie, P. M. Lang, and E. S. 1211 Kasischke (2001), Measurements of an anomalous global methane in-1212 crease during 1998, Geophys. Res. Lett., 28, 499-502. 1213
- Dlugokencky, E. J., S. Houweling, L. Bruhwiler, K. A. Masarie, P. M. 1214Lang, J. B. Miller, and P. P. Tans (2003), Atmospheric methane levels 1215 off: Temporary pause or a new steady state?, Geophys. Res. Lett., 30(19), 12161992, doi:1029/2003GL017475. 1217
- Enting, I. G., and J. V. Mansbridge (1989), Seasonal sources and sinks of 1218 atmospheric CO<sub>2</sub>: Direct inversion of filtered data, Tellus, Ser. B, 41, 1219111 - 126.1220
- Etheridge, D. M., L. P. Steele, R. J. Francey, and R. L. Langenfelds (1998), 1221 Atmospheric methane between 1000 A.D. and present: Evidence of 1222 anthropogenic emissions and climatic variability, J. Geophys. Res., 1223103, 15,979-15,993 1224
- Fan, S. M., M. Gloor, J. Mahlman, S. Pacala, J. Sarmiento, T. Takahashi, 1225 and P. Tans (1998), A large terrestrial carbon sink in North America 1226implied by atmospheric and oceanic carbon dioxide data and models, 1227 Science, 282, 442-446. 1228
- Fiore, A. M., D. J. Jacob, B. D. Field, D. G. Streets, S. D. Fernandes, and 1229C. Jang (2002), Linking ozone pollution and climate change: The case for 1230 controlling methane, *Geophys. Res. Lett.*, 29, 1919–1923. 1231 Francey, R. J., M. R. Manning, C. E. Allison, S. A. Coram, D. M. 1232
- Etheridge, R. L. Langenfelds, D. C. Lowe, and L. P. Steele (1999), A history of  $\delta^{13}C$  in atmospheric  $CH_4$  from the Cape Grim Air Archive and 12331234Antarctic firn air, J. Geophys. Res., 104, 23,631-23,643. 1235
- Fung, I., J. John, J. Lerner, E. Matthews, M. Prather, L. P. Steele, and P. J. 1236Fraser (1991), Three-dimensional model synthesis of the global methane 1237 cycle, J. Geophys. Res., 96, 13,033-13,065. 1238
- Gupta, M., S. Tyler, and R. Cicerone (1996), Modeling atmospheric  $\delta^{13}CH_4$  1239 and the causes of recent changes in atmospheric CH4 amounts, J. Geo-1240 phys. Res., 101, 22,923-22,932. 1241
- Gurney, K. R., et al. (2002), Towards robust regional estimates of CO2 1242 sources and sinks using atmospheric transport models, Nature, 415, 1243626 - 6301244
- Heimann, M., and S. Körner (2003), The Global Atmospheric Tracer Model 1245 TM3 model description and user's manual, technical report, Max-Planck-1246Inst. für Biogeochem., Jena, Germany. 1247
- Hein, R., P. J. Crutzen, and M. Heimann (1997), An inverse modeling 1248approach to investigate the global atmospheric methane cycle, Global 1249Biogeochem. Cycles, 11, 43-76. 1250
- Houweling, S., T. Kaminski, F. Dentener, J. Lelieveld, and M. Heimann 1251(1999), Inverse modeling of methane sources and sinks using the adjoint 1252of a global transport model, J. Geophys. Res., 104, 26,137-26,160. 1253
- Intergovernmental Panel on Climate Change (2001), Climate Change 2001: 1254 The Scientific Basis, edited by J. T. Houghton et al., Cambridge Univ. 1255 Press, New York. 1256
- Johnson, C. E., D. S. Stevenson, W. J. Collins, and R. G. Derwent (2002), 1257Interannual variability in methane growth rate simulated with a coupled 1258

1259ocean-atmosphere-chemistry model, Geophys. Res. Lett., 29, 1903-12601907

- 1261 Jones, R. L., and J. A. Pyle (1984), Observations of CH<sub>4</sub> and N<sub>2</sub>O by the 1262Nimbus 7 SAMS: A comparison with in situ data and two-dimensional
- 1263numerical model calculations, J. Geophys. Res., 89, 5263-5279.
- 1264 Kaminski, T., M. Heimann, and R. Giering (1999), A coarse grid three-1265dimensional inverse model of the atmospheric transport: 1. Adjoint model
- and Jacobian matrix, J. Geophys. Res., 104, 18,535-18,553. 1266
- Kaplan, J. O. (2001), Wetlands at the Last Glacial Maximum: Distribution 12671268and methane emissions, Geophys. Res. Lett., 29, 6-10.
- 1269Kasibhatla, P., A. Arellano, J. A. Logan, P. I. Palmer, and P. Novelli (2002),
- 1270Top-down estimate of a large source of atmospheric carbon monoxide
- associated with fuel combustion in Asia, Geophys. Res. Lett., 29(19), 1271 1900, doi:10.1029/2002GL015581. 1272
- 1273 Langenfelds, R. L., R. J. Francey, B. C. Pak, L. P. Steele, J. Lloyd, C. M.
- 1274Trudinger, and C. E. Allison (2002), Interannual growth rate variations of
- 1275atmospheric CO<sub>2</sub> and it's  $\delta^{13}$ C, H<sub>2</sub>, CH<sub>4</sub>, and CO between 1992 and 1999
- 1276linked to biomass burning, Global Biogeochem. Cycles, 16, 1048-1070.
- 1277 Lassey, K. R., D. C. Lowe, and M. R. Manning (2000), The trend in atmospheric methane  $\delta^{13}C$  and implications for isotopic constraints on 1278
- 1279the global methane budget, Global Biogeochem. Cycles, 14, 41-49.
- 1280 Lelieveld, J., P. J. Crutzen, and F. S. Dentener (1998), Changing concen-1281 tration, lifetime, and climate forcing of atmospheric methane, Tellus, Ser. 1282B, 50, 128 - 150.
- 1283 Levine, J. S., W. R. Coffer III, and J. P. Pinto (2000), Biomass burning, in
- 1284Atmospheric Methane: Its Role in Global Environment, edited by M. A.
- 1285K. Khalil, Springer-Verlag, New York.
- 1286Louis, J. F. (1979), A parametric model of vertical eddy fluxes in the
- atmosphere, Boundary Layer Meteorol., 17, 187-202. 1287
- 1288 Lowe, D. C., C. A. M. Brenninkmeijer, G. W. Brailsford, K. Lassey, A. J.
- Gomez, and E. G. Nisbet (1994), Concentration and <sup>13</sup>C records of atmo-1289
- 1290spheric methane in New Zealand and Antarctica: Evidence for changes in
- 1291 methane sources, J. Geophys. Res., 99, 16,913-16,925.
- Masarie, K. A., and P. P. Tans (1995), Extension and integration of atmo-12921293spheric carbon dioxide data into a globally consistent measurement re-
- 1294cord, J. Geophys. Res., 100, 11,593-11,610.
- 1295 Matthews, E., and I. Fung (1987), Methane emissions from natural wet-1296 lands: Global distribution, area, and environmental characteristics of
- 1297sources, Global Biogeochem. Cycles, 1, 61-86.
- 1298 McCarthy, M. C., P. Connell, and K. A. Boering (2001), Isotopic fractiona-1299tion of methane in the stratosphere and its effect on free tropospheric
- isotopic compositions, Geophys. Res. Lett., 28, 3657-3660 1300
- 1301 Mikaloff Fletcher, S. E., P. P. Tans, L. M. Bruhwiler, J. B. Miller, and
- 1302
- M. Heimann (2004), CH<sub>4</sub> sources estimated from atmospheric observa-tions of CH<sub>4</sub> and its  ${}^{13}C/{}^{12}C$  isotopic ratios: 2. Inverse modeling of CH<sub>4</sub> fluxes from geographical regions, *Global Biogeochem. Cycles*, 13031304
- 1305doi:10.1029/2004GB002224, in press Miller, J. B., K. A. Mack, R. Dissly, J. W. C. White, E. J. Dlugokencky, and 1306
- P. P. Tans (2002), Development of analytical methods and measurements 1307of <sup>13</sup>C/<sup>12</sup>C in atmospheric CH<sub>4</sub> from the NOAA/CMDL global air sam-1308
- 1309pling network, J. Geophys. Res., 107(D13), 4178, doi:10.1029/ 2001JD000630. 1310
- 1311 National Oceanic and Atmospheric Administration (2001), GLOBAL-
- VIEW-CH4: Cooperative Atmospheric Data Integration Project- Methane 13121313 [CD-ROM], report, Clim. Monit. and Diag. Lab., Boulder, Colo. (Also
- 1314
- available at ftp.cmdl.noaa.gov, Path: ccg/ch4/GLOBALVIEW)
- 1315 Novelli, P. C., K. A. Masarie, P. M. Lang, B. D. Hall, R. C. Myers, and J. W. Elkins (2003), Reanalysis of tropospheric CO trends: Effects of the 1316 1317 1997-1998 wildfires, J. Geophys. Res., 108, 4464-4488.
- 1318 Olivier, J. G. J., A. F. Bouwman, C. W. M. van der Maas, J. M. Berdowski,
  1319 C. Veldt, J. P. J. Bloos, A. J. H. Visschedijk, P. J. Zandveld, and J. L.
- 1320Haverlag (1996), Description of Edgar Version 2.0: A set of global emis-
- 1321 sion inventories of greenhouse gases and ozone-depleting substances for
- all anthropogenic and most natural sources on a per country basis and on 1322

 $1 \times 1$  grid, report, Natl. Inst. of Public Health and the Environ., Biltho- 1323 ven, Netherlands. 1324

- Page, S. E., F. Siegert, J. O. Rieley, H. D. V. Boehm, A. Jaya, and S. Limin 1325 (2002), The amount of carbon released form peat and forest fires in 1326 Indonesia during 1997, Nature, 420, 61-65. 1327
- Platt, U., and G. Hönninger (2003), The role of halogen species in the 1328troposphere, Chemosphere, 52, 325-338. 1329
- 1330 Quay, P., J. Stutsman, D. Wilbur, A. Snover, E. Dlugokencky, and T. Brown (1999), The isotopic composition of atmospheric methane, Global Bio-1331 geochem. Cycles, 13, 445-461. 1332
- Russell, G., and J. Lerner (1981), A new finite-differencing scheme for the 1333tracer transport equation, J. Appl. Meteorol., 20, 1483-1498. 1334
- Sanderson, M. G. (1996), Biomass of termites and their emissions of 1335 methane and carbon dioxide: A global database, Global Biogeochem. 1336Cycles, 10, 543-557. 1337
- Saueressig, G., J. N. Crowley, P. Bergamaschi, C. Brühl, C. A. M. 1338Brenninkmeijer, and H. Fischer (2001), Carbon 13 and D kinetic isotope 1339 effects in the reactions of  $CH_4$  with  $O(^{1}D)$  and OH: New laboratory 1340measurements and their implications for the isotopic composition of stra-13411342
- tospheric methane, J. Geophys. Res., 106, 23,127-23,138. Spivakovsky, C. M., et al. (2000), Three-dimensional climatological dis-1343tribution of tropospheric OH: Update and evaluation, J. Geophys. Res., 1344 1345
- 105, 8931–8980. titll, C. J., J. A. Berry, G. J. Collatz, and R. S. DeFries (2003), Global 1346distribution of C3 and C4 vegetation: Carbon cycle implications, Global 1347Biogeochem. Cycles, 17(1), 1006, doi:10.1029/2001GB001807. 1348
- Sugawara, S., T. Nakazawa, Y. Shirakawa, K. Kawamura, S. Aoki, 1349 T. Machida, and H. Honda (1997), Vertical profile of the carbon isotopic 13501351ratio of stratospheric methane over Japan, Geophys. Res. Lett., 24, 2989-2992 1352
- Tans, P. P. (1997), A note on isotopic ratios and the global atmospheric 1353methane budget, Global. Biogeochem. Cycles, 11, 77-81. 1354
- Tans, P. P., I. Y. Fung, and T. Takahashi (1990), Observational constraints 1355on the global atmospheric CO<sub>2</sub> budget, Science, 247, 1431-1438. 1356
- Tiedke, M. (1989), A comprehensive mass flux scheme for cumulus para-1357meterization in large-scale models, *Mon. Weather Rev.*, *117*, 1779–1800. 1358 Tyler, S. C., P. M. Crill, and G. W. Brailsford (1994), <sup>13</sup>C/<sup>12</sup>C fractionation 1359
- of methane during oxidation in a temperate forested soil, Geochim. Cos-1360mochim. Acta, 58, 1625-1633. 1361
- Van der Werf, G. R., J. T. Randerson, G. J. Collatz, L. Giglio, P. S. 1362Kasibhatla, A. F. Arellano, S. C. Olsen, and E. S. Kaisichke (2004), 1363Continental-scale partitioning of fire emissions during the 1997 to 2001 1364El Niño/La Niña period, Science, 303, 73-76. 1365
- Walter, B. (1998), Development of a process-based model to derive 13661367methane emissions from natural wetlands for climate studies, Ph.D. thesis, Univ. Hamburg, Germany 1368
- Warwick, N. J., S. Bekki, K. S. Law, E. G. Nisbet, and J. A. Pyle (2002), 1369The impact of meteorology on the interannual growth rate of atmospheric 1370methane, Geophys. Res. Lett., 29, 1947-1951. 1371
- Whiticar, M. (1993), Stable isotopes in global budgets, in Atmospheric 1372 Methane-Sources, Sinks, and Role in Environmental Change, NATO 1373 ASI Ser.: Global Environ. Change, vol. 1, edited by M. A. K. Khalil, 1374 Springer-Verlag, New York. 1375
- L. M. Bruhwiler, J. B. Miller, and P. P. Tans, NOAA CMDL, R/CMDL-1, 1377 325 Broadway, Boulder, CO 80305, USA. (lori.bruhwiler@noaa.gov; 1378 john.b.miller@cmdl.noaa.gov; pieter.tans@noaa.gov) 1379

S. E. Mikaloff Fletcher, Department of Atmospheric and Oceanic 1382Sciences, University of California, Los Angeles, 5839 Schlicter Hall, Los 1383Angeles, CA 90024, USA. (fletcher@igpp.ucla.edu) 1384

M. Heimann, Max-Planck-Institut für Biogeochemie, Postfach 10064, 1380D-0771 Jena, Germany. (martin.heimann@bgc-jena.mpg.de) 1381