

# Sensitivity of simulated terrestrial carbon assimilation and canopy transpiration to different stomatal conductance and carbon assimilation schemes

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**Abstract** Accurate simulations of terrestrial carbon assimilation and canopy transpiration are needed for both climate modeling and vegetation dynamics. Coupled stomatal conductance and carbon assimilation ( $A - g_s$ ) models have been widely used as part of land surface parameterizations in climate models to describe the biogeophysical and biogeochemical roles of terrestrial vegetation. Differences in various  $A - g_s$  schemes produce substantial differences in the estimation of carbon assimilation and canopy transpiration, as well as in other land–atmosphere fluxes. The terrestrial carbon assimilation and canopy transpiration simulated by two different representative  $A - g_s$  schemes, a simple  $A - g_s$  scheme adopted from the treatments of the NCAR model (Scheme I) and a two-big-leaf  $A - g_s$  scheme newly developed by Dai et al. (J Clim 17:2281–2299, 2004) (Scheme II), are compared via some sensitivity experiments to investigate impacts of different  $A - g_s$  schemes on the simulations. Major differences are found in the estimate of

canopy carbon assimilation rate, canopy conductance and canopy transpiration between the two schemes, primarily due to differences in (a) functional forms used to estimate parameters for carbon assimilation sub-models, (b) co-limitation methods used to estimate carbon assimilation rate from the three limiting rates, and (c) leaf-to-canopy scaling schemes. On the whole, the differences in the scaling approach are the largest contributor to the simulation discrepancies, but the different methods of co-limitation of assimilation rate also impact the results. Except for a few biomes, the residual effects caused by the different parameter estimations in assimilation sub-models are relatively small. It is also noted that the two-leaf temperature scheme produces distinctly different sunlit and shaded leaf temperatures but has negligible impacts on the simulation of the carbon assimilation.

## 1 Introduction

Vegetation plays an important role in climate change, and land–atmosphere exchanges are in part controlled over vegetated regions through the stomatal resistance of leaves. In earlier land surface models, such as BATS (Dickinson et al. 1986, 1993) and SiB (Sellers et al. 1986), empirical models of the stomatal resistance based on Jarvis (1976) were widely used to describe the biophysical control of evapotranspiration and to provide more realistic estimation of the land–atmosphere fluxes. With increasingly scientific interest in global climate change, the need for more complete models of the climate system including biological and chemical processes has become apparent. Since the carbon flux exchange between terrestrial ecosystems and the atmosphere is one of most important components of the global carbon cycle, the parameterizations that provide

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realistic and accurate estimation of CO<sub>2</sub> flux through vegetation are needed for both climate modeling and ecosystem modeling. Biochemical models of carbon assimilation have been extensively incorporated into climate models to describe the biogeochemical roles of the terrestrial vegetation, and in particular coupled stomatal conductance and carbon assimilation ( $A - g_s$ ) models have been widely used in the third generation land models (Sellers et al. 1996; Bonan 1996; Dickinson et al. 1998) to describe stomatal control of vegetation transpiration as well as the exchange of carbon between the vegetated land surface and the atmosphere (Sellers et al. 1997).

Farquhar et al. (1980) developed a widely used carbon assimilation model which has been modified by many researchers (Collatz et al. 1990, 1991; Harley et al. 1992; Harley and Baldocchi 1995; Leuning 1995) and has been extended to couple the stomatal conductance to the carbon assimilation (Ball et al. 1987, 1988; Leuning 1990; Collatz et al. 1991). The carbon assimilation model for C4 plants basically comes from that of Collatz et al. (1992). Such models have been developed at the leaf level, and must be scaled to the canopy level for coupling to the atmosphere (Baldocchi and Harley 1995; Leuning et al. 1995; Kull and Kruijt 1998; Kull and Jarvis 1995; Walcroft et al. 1997; Dang et al. 1997).

The methods used for leaf to canopy scaling can be divided into three categories, i.e., one-big-leaf models, two-big-leaf (sunlit/shaded) models, and multi-layer models. Multilayer models can use parameters measured at the leaf level, in which the canopy photosynthetic rate is computed by integrating the environmental and physiological variables within the canopy. They can be calibrated from leaf-level measurements as long as the spatial pattern of parameters and physiological factors are represented (Wang and Jarvis 1990; Jarvis 1993, 1995; Leuning et al. 1995; Baldocchi and Harley 1995; Larocque 2002). Due to their complexity, multi-layer models are not widely used in climate models or global carbon cycle models. On the contrast, the big-leaf models have been extensively used in land surface climate modeling because they require fewer parameters and are computationally efficient (Sellers et al. 1996; Bonan 1996; Dickinson et al. 1998; Dai et al. 2003). The one-big-leaf models assume that the integrated characteristics of the whole canopy can be represented as a single, horizontally extended big leaf for the computation of canopy carbon assimilation rate and other fluxes (Sellers et al. 1992, 1996). However, carbon assimilation is determined by photosynthetically active radiation (PAR) and temperatures that differ between sunlit and shaded leaves (Sinclair et al. 1976; Norman 1993). Thus, the one-big-leaf models could significantly overestimate the canopy carbon assimilation rate by neglecting these differences (Spitters 1986; Wang and Leuning 1998). The two-big-leaf (sunlit/shaded) models, which stratify a canopy into sunlit and

shaded portions, have been introduced into land surface models (Bonan 1996; de Pury and Farquhar 1997; Dickinson et al. 1998; Wang and Leuning 1998; Dai et al. 2004). The models of Bonan (1996) and Dickinson et al. (1998) treat the carbon assimilation and stomatal conductance of sunlit leaves separately from those of shaded leaves but use a single leaf temperature, while the two-big-leaf models developed by Wang and Leuning (1998) and Dai et al. (2004) calculate separately leaf temperatures and fluxes for the sunlit and shaded canopy.

The stomatal conductance and carbon assimilation ( $A - g_s$ ) parameterizations used in land surface simulations have been continuously improved by incorporating the knowledge acquired from plant physiological research. However, with increasing complexity model details diverge in various aspects, such as in their scaling schemes, photosynthetic parameter estimations and computational schemes as well as other relevant treatments.

To provide an example of the consequences of such differences, two different  $A - g_s$  parameterization schemes are compared to evaluate the impacts of different treatments of stomatal conductance and carbon assimilation on the simulation of carbon assimilation rate and canopy transpiration in this study. The two  $A - g_s$  schemes are briefly described in Sect. 2 and designs of sensitivity experiments are given in Sect. 3. Results and further explanations with respect to reasons for the differences are discussed in Sect. 4, followed by a summary in Sect. 5.

## 2 Description of stomatal conductance and carbon assimilation schemes

### 2.1 Relatively simple $A - g_s$ parameterization scheme (Scheme I)

Scheme I is a relatively simple  $A - g_s$  parameterization for the stomatal conductance and carbon assimilation, which was used in the early NCAR Land Surface Model (NCAR LSM1.0, Bonan 1996). The new NCAR Community Land Model (CLM3.0, Oleson et al. 2004) has a different treatment of leaf light levels than the earlier one used by Bonan (1996), whose impact is not addressed here, but otherwise uses the same scheme. The leaf carbon assimilation rate is estimated by using a leaf carbon assimilation biochemical model, and the leaf stomatal resistance is coupled to the leaf carbon assimilation rate (Eq. in Table 1). The basic equations and relevant parameters for Scheme I are summarized in Tables 1 and 2.

The carbon assimilation rate is estimated as the minimum of three assimilation limited rates (Eq. 2b). Three limiting rates, i.e., the Rubisco limited rate  $w_c$ , the light-limited rate  $w_j$  and the carbon compound export limitation (C3 plants) or

**Table 1** Comparison of two  $A - g_s$  schemes

| Process  | Scheme  |  |
|--|---|--|
|  | Scheme II   | Scheme I   |
| <b>A. Carbon assimilation sub-model:</b>   |   |  |
| <b>1. Three limiting rates of assimilation</b>   |   |  |
| <b>(1) Rubisco limited rate:</b>   |   |  |
|  | $w_c = \begin{cases} \frac{(c_i - \Gamma_*)V_m}{c_i + K_c(1 + o_i/K_o)} & \text{for } C_3 \\ V_m & \text{for } C_4 \end{cases} \quad (1)$   | Same   |
|  | CO <sub>2</sub> compensation point:   |  |
|  | $\Gamma_* = 0.5 \times o_i / (2,600 \times 0.57^{Q_{10}})$ (2a)   | $\Gamma_* = 0.5(K_c/K_o) \times 0.21 \times o_i \approx 0.5 \times o_i / (4,762 \times 0.57^{Q_{10}})$ (2b)              |
|  | Maximum catalytic capability of Rubisco:  | Same   |
|  | $V_m = V_{max} f_T(T_l) f_w(\theta)$ (3)  |  |
|  | Leaf temperature dependence of $V_m$ :  | $f_T(T_l) = \frac{2.4^{Q_{10}}}{[1 + e^{(710T_l - 220000)/RT_l}]}$ (4b)  |
|  | $f_T(T_l) = \begin{cases} \frac{2.1^{Q_{10}}}{\{1 + e^{0.3(T_l - s_2)}\}} & \text{for } C_3 \\ \frac{2.1^{Q_{10}}}{\{1 + e^{0.3(T_l - s_2)}\} \{1 + e^{0.2(s_4 - T_l)}\}} & \text{for } C_4 \end{cases} \quad (4a)$ |  |
|  | Soil water limited factor:  | Same   |
|  | $f_w(\theta) = \sum_{i=1}^{n_{soil}} \{r_i [(\psi_{max} - \psi_i) / (\psi_{max} + \psi_{sat,i})]\}$ (5)   |  |
| <b>(2) Light-limited rate:</b>   |   |  |
|  | $w_j = \begin{cases} \frac{J(c_i - \Gamma_*)}{c_i + 2\Gamma_*} & \text{for } C_3 \\ J & \text{for } C_4 \end{cases} \quad (6)$  | Same   |
|  | Electron transport rate for given absorbed PAR ( $\phi$ ):  | $J = \varepsilon \alpha \phi$ (7b)   |
|  | $J = \min(\varepsilon \alpha \phi, J_m/4)$ (7a)   | Same   |
|  | where $\alpha = 4.6 \mu\text{mol J}^{-1}$ is used to covert $\phi$ ( $\text{W m}^{-2}$ ) to photosynthetic photon flux ( $\mu\text{mol m}^{-2} \text{s}^{-1}$ )   |  |
|  | Potential electron transport rate:  |  |
|  | $J_m = J_{max} f_T(T_l) f_w(\theta)$ (8)  |  |
|  | $J_{max} = 2.1 V_{c,max}$ (9)   | None   |
|  | Leaf temperature dependence of $J_m$ :  |  |
|  | $f_T(T_l) = \frac{e^{(10Q_{10} E_a)/(298RT_l)} [1 + e^{(2985-H)/(298R)}]}{[1 + e^{(5T_l - H)/RT_l}]}$ (10)  |  |
| <b>(3) Carbon compound export limitation (C3 plants) or PEP-carboxylase limitation (C4 plants)</b> |   |  |
|  | $w_e = \begin{cases} 0.5V_m & \text{for } C_3 \\ 2 \times 10^4 V_m \frac{c_i}{P_{atm}} & \text{for } C_4 \end{cases} \quad (11a)$   | $w_e = \begin{cases} 0.5V_m & \text{for } C_3 \\ 4,000V_m \frac{c_i}{P_{atm}} & \text{for } C_4 \end{cases} \quad (11b)$ |
| <b>2. Estimation of assimilation rate A</b>  |   |  |
|  | Assimilation rate are described by combining three limiting rates into two quadratic equations, which are then solved for their smaller roots:  | Assimilation rate is assume to be the minimum of the three limiting rates:   |
|  | $\beta_{c_j} w_p^2 - w_p(w_c + w_j) + w_c w_j = 0$ $\beta_{pe} A^2 - A(w_p + w_e) + w_p w_e = 0$ (12a)  | $A = \min(w_c, w_j, w_e)$ (12b)  |
|  | Where $w_p$ is a temporary variable, $\beta_{c_j} = 0.877$ and $\beta_{pe} = 0.99$ are canopy photosynthesis curvature factors  |  |

**Table 1** continued

| Process  | Scheme  |  |
|--|---|--|
|  | Scheme II   | Scheme I   |
| Net assimilation (mol m <sup>-2</sup> s <sup>-1</sup> ): | $A_n = A - R_d$ (13)  | No respiration rate calculated   |
| Dark respiration rate:                                   | $R_d = f_d V_m$ (14)  |  |
| Leaf temperature dependence of $V_m$ used here is:       |   |  |
|  | $f_T(T_l) = \frac{2.1^{10}}{\{1 + e^{1.3(T_l - 328.16)}\}}$ (15)  |  |
| 3. Leaf to canopy scaling scheme                         |   |  |
| Leaf to canopy vertical integration scheme               |   | Average scheme   |
| Rubisco capacity $V_{\max}$ :                            |   | $V_{\max} = V_{c\max}$ (16b)   |
|  | $V_{\max} = V_{c\max} \exp(-k_n x)$ (16a)   |  |
| Photosynthetic capacity of sunlit and shaded canopy:     |   |  |
|  | $[V_{\max}]_{\text{sun}} = \int_0^{L_{AI}} V_{\max}(x) f_{\text{sun}}(x) dx = C_{1\text{sun}} \times V_{c\max}$ (17a)                             | $V_{\max} = V_{c\max}$ (17b)   |
|  | $[V_{\max}]_{\text{sha}} = \int_0^{L_{AI}} V_{\max}(x) f_{\text{sha}}(x) dx = C_{1\text{sha}} \times V_{c\max}$ (18a)                             | $V_{\max} = V_{c\max}$ (18b)   |
| Scaling factors used are:                                |   |  |
|  | $C_{1\text{sun}} = [1 - e^{-(k_n + k_b)L_{AI}}] / (k_n + k_b)$ (19)   |  |
|  | $C_{1\text{sha}} = [1 - e^{-k_n L_{AI}}] / k_n - [1 - e^{-(k_n + k_b)L_{AI}}] / (k_n + k_b)$ (20)   |  |
| Potential electron transport:                            |   | None   |
|  | $J_{\max} = J_{c\max} \exp(-k_d x)$ (21)  |  |
| Potential electron transport for sunlit/shaded canopy:   |   | None   |
|  | $[J_{\max}]_{\text{sun}} = \int_0^{L_{AI}} J_{\max}(x) f_{\text{sun}}(x) dx = C_{2\text{sun}} \times J_{c\max}$ (22)                              |  |
|  | $[J_{\max}]_{\text{sha}} = \int_0^{L_{AI}} J_{\max}(x) f_{\text{sha}}(x) dx = C_{2\text{sha}} \times J_{c\max}$ (23)                              |  |
| Scaling factors are given by:                            |   |  |
|  | $C_{2\text{sun}} = (1 - e^{-(k_d + k_b)L_{AI}}) / (k_d + k_b)$ (24)   |  |
|  | $C_{2\text{sha}} = (1 - e^{-k_d L_{AI}}) / k_d - \{[1 - e^{-(k_d + k_b)L_{AI}}] / (k_d + k_b)\}$ (25)   |  |
| B. Stomatal conductance model                            |   |  |
|  | $g_s = m \frac{A_n \varepsilon_s}{c_s e_i} P_{\text{atm}} + b$ (26a)  | $\frac{1}{r_s} = m \frac{A_n \varepsilon_s}{c_s e_i} P_{\text{atm}} + b$ (26b) |
| Scaling to canopy:                                       |   |  |
|  | $[g_s]_{\text{sun}} = m \left[ \frac{A_n \varepsilon_s}{c_s e_i} \right]_{\text{sun}} P_{\text{atm}} + b f_w(\theta) \times C_{3\text{sun}}$ (27) |  |
|  | $[g_s]_{\text{sha}} = m \left[ \frac{A_n \varepsilon_s}{c_s e_i} \right]_{\text{sha}} P_{\text{atm}} + b f_w(\theta) \times C_{3\text{sha}}$ (28) |  |
|  | $C_{3\text{sun}} = (1 - e^{-k_b L_{AI}}) / k_b = L_{\text{sun}}$ (29)   |  |
|  | $C_{3\text{sha}} = L_{AI} - (1 - e^{-k_b L_{AI}}) / k_b = L_{\text{sha}}$ (30)  |  |

PEP-carboxylase limitation (C4 plants)  $w_e$ , are given by Eqs. (1), (6) and (11b), respectively. One of the most important model parameters is the maximum rate of carboxylation  $V_m$ , which depends on the physiological parameter  $V_{\max}$  of each plant functional type (PFT), and is also adjusted by a leaf temperature dependence function  $f_T(T_l)$  and a soil moisture limitation function  $f_w(\theta)$  (Eq. 3). The maximum photosynthetic capacity at 25°C,  $V_{\max}$ , is assumed to be constant at all the canopy levels and is set to the maximum Rubisco capacity at the canopy top per leaf area ( $V_{c\max}$ ) (Eq. 16b). The absorbed PAR together with the vegetation dependent parameter  $\varepsilon$ , i.e., quantum yield of electron transport, is used to calculate the electron transport rate  $J$  (Eq. 7b).

The relatively simple scheme estimates carbon assimilation ( $A$ ) and stomatal conductance ( $g_s$ ) for the sunlit and shaded leaves per unit leaf area index (LAI) by using an

average of absorption of direct and diffuse PAR, in which a common leaf temperature is calculated and used for both sunlit and shaded leaves. Then the total assimilation rate and canopy stomatal conductance are estimated by multiplying assimilation rates of sunlit leaves and shaded leaves per unit LAI by sunlit LAI ( $L_{\text{sun}}$ ) and shaded LAI ( $L_{\text{sha}}$ ) (Eqs. 29–30).

## 2.2 CoLM two-big-leaf $A - g_s$ scheme (Scheme II)

The CoLM two-big-leaf  $A - g_s$  scheme (Scheme II) is a new and more complex scheme for the calculation of canopy temperature, carbon assimilation and stomatal conductance developed more recently by Dai et al. (2004). Its basic equations and related parameters are summarized in Table 1. It separately calculates sunlit and shaded leaf temperatures. Its leaf to canopy scaling scheme considers the

**Table 2** Model parameters and variables of  $A - g_s$  schemes

| Definition  | Symbol                               | Unit                              |
|---|--------------------------------------|-----------------------------------|
| Maximum Rubisco capacity at top canopy at 25°C per leaf area                                | $V_{cmax}$                           | $\text{mol m}^{-2} \text{s}^{-1}$ |
| One-half point of high temperature inhibition function                                      | $s_2$                                | K                                 |
| One-half point of low temperature inhibition function                                       | $s_4$                                | K                                 |
| Quantum yield of electron transport   | $\epsilon$                           | $\text{mol mol}^{-1}$             |
| Root fraction within soil layer   | $r_i$                                | –                                 |
| Rubisco Michaelis–Menten constant for $\text{CO}_2$   | $K_c = 30 \times 2.1^{Q_{10}}$       | Pa                                |
| Rubisco inhibition constant for oxygen  | $K_o = 30,000 \times 1.2^{Q_{10}}$   | Pa                                |
| $Q_{10}$ temperature coefficient  | $Q_{10} = (T_i - 298.16)/10$         | –                                 |
| Activation energy   | $E_a = 37,000$                       | $\text{J mol}^{-1}$               |
| Electron-transport temperature response parameter   | $S = 710$                            | $\text{J mol}^{-1}$               |
| Curvature parameter for $J_{max}$   | $H = 2.2 \times 10^5$                | $\text{J mol}^{-1} \text{K}^{-1}$ |
| Universal gas constant  | $R = 8.314$                          | $\text{J mol}^{-1} \text{K}^{-1}$ |
| Extinction coefficients for diffuse PAR   | $k_d = 0.719$                        | –                                 |
| Coefficients of leaf nitrogen allocation within canopy                                      | $k_n = 0.5$                          | –                                 |
| Direct beam extinction coefficients of the canopy   | $k_b$                                | –                                 |
| Soil water matric potential   | $\psi_i$                             | mm                                |
| Wilting point soil matric potential of leaf   | $\psi_{max} = -1.5 \times 10^5$      | mm                                |
| Saturated soil water matric potential   | $\psi_{sat,i}$                       | mm                                |
| Dark respiration of leaf at 20°C  | $f_d = 0.015$ for C3<br>0.025 for C4 | –                                 |
| Stomatal slope factor   | $m$                                  | –                                 |
| Minimum stomatal conductance  | $b$                                  | $\text{mol m}^{-2} \text{s}^{-1}$ |
| Partial pressure of $\text{CO}_2$ in interior leaf, at leaf surface                         | $c_{i,c_s}$                          | Pa                                |
| Partial pressure of $\text{CO}_2$ in canopy air   | $c_a = 355 \times 10^{-6} P_{atm}$   | Pa                                |
| Partial pressure of $\text{O}_2$ in leaf interior   | $o_i = 0.209 P_{atm}$                | Pa                                |
| Leaf temperature  | $T_l$                                | K                                 |
| Electron transport rate   | $J$                                  | $\text{mol m}^{-2} \text{s}^{-1}$ |
| Potential electron transport rate   | $J_m$                                | $\text{mol m}^{-2} \text{s}^{-1}$ |
| Leaf stomatal conductance   | $g_s$                                | $\text{mol m}^{-2} \text{s}^{-1}$ |
| Canopy stomatal conductance   | $[g_s]$                              | $\text{mol m}^{-2} \text{s}^{-1}$ |
| Atmospheric pressure at surface   | $P_{atm}$                            | Pa                                |
| Partial pressure of $\text{H}_2\text{O}$ in canopy air, at leaf surface and inside the leaf | $e_a, e_s, e_i$                      | Pa                                |

vertical variations of leaf physiological properties within the plant to provide separate leaf assimilation rates and stomatal conductances for both the sunlit and shaded canopy.

The assimilation rate for Scheme II is also estimated from three limiting rates  $w_c$ ,  $w_j$  and  $w_e$ , but with some modifications to the estimations of model parameters (Table 1). Different empirical formula was used to estimate  $\Gamma^*$  and  $f_T(T_l)$  (Eqs. 2a and 4a), and a co-limitation as given by Eq. (7a) was used to estimate the electron transport rate  $J$ . In addition, the assimilation rate is calculated by solving two quadratic equations (Eq. 12a).

The model equations are integrated over the canopy depth to produce the canopy values for sunlit and shaded leaves individually, based on two basic assumptions: (1) the maximum Rubisco capacity  $V_{max}$  is related to the leaf nitrogen concentration (Field 1983; Leuning et al. 1991;

Harley et al. 1992), and the vertical profile of leaf nitrogen decreases exponentially with cumulative relative leaf area index,  $x$ , from the top of the canopy (Hirose and Werger 1987; Leuning et al. 1995; de Pury and Farquhar 1997); (2) the potential electron transport rate,  $J_{max}$ , was assumed to decrease exponentially from the top to the bottom, as expressed in Eq. (21) (Wang and Polglase 1995; Wang and Leuning 1998). The  $V_{max}$  and  $J_{max}$  integrated over the canopy and photosynthetic capacities and potential electron transport rates for the sunlit and shaded canopy are used according to Eqs. (17a–18a) and Eqs. (22–23).

### 2.3 Differences between the two $A - g_s$ schemes

The main differences between Scheme I and Scheme II as summarized in Table 1 are discussed below:

- (1) Different carbon assimilation sub-model parameters are used: a different leaf temperature response function  $f_T(T_l)$  is used for  $V_{\max}$  (Eq. 4a vs. 4b) and different formula are used to estimate  $\text{CO}_2$  compensation point  $\Gamma^*$  (Eq. 2a vs. 2b), and only Scheme II restricts the electron transport rate (Eq. 7a vs. 7b).
- (2) Different co-limitation methods are used for estimating the assimilation rate: Scheme I assumes that the carbon assimilation rate is the minimum of three limiting rates (referred to as the “minimum” method), but Scheme II calculates the carbon assimilation rate by solving two quadratic equations based on three limiting rates, and hence avoiding an abrupt transition among different limitation rates (referred to as the “smoothing” method) (Eq. 12a vs. 12b).
- (3) A different leaf-to-canopy scaling scheme is used: In Scheme I, the assimilation equations are solved for both sunlit and shaded leaves per LAI, and then the averages of conductance and canopy carbon assimilation rate are weighted by the fractions and leaf area indices of the sunlit and shaded leaves (Eqs. 16b–18b), which is referred to as the “averaging” scheme. In Scheme II, however, the leaf-to-canopy scaling scheme considers the vertical variations of the leaf physiological properties and diffuse light within the canopy, to aggregate the assimilation rate and stomatal conductance from the leaf to the sunlit and shaded canopy separately (referred to as the “scaling” scheme) (Eqs. 16a–25).
- (4) Different leaf temperature calculation schemes are used: Scheme I only calculates and uses one common leaf temperature to estimate the stomatal conductance and assimilation rates for both sunlit and shaded leaves. Scheme II calculates the sunlit and shaded leaf temperature individually and uses them for the calculation of separate stomatal conductance and assimilation rates for the sunlit and shaded canopy.

Differences in methods used for PAR calculations between the two schemes are not examined. Rather, the same PAR scheme is used in both models to focus on evaluating and recognizing the impacts of different treatments in  $A - g_s$  schemes. The PAR scheme in CoLM (Dai et al. 2004) is used throughout the study.

### 3 Design of sensitivity experiments

The land surface model used is the improved version of the Common Land Model, referred to as CoLM so designated to avoid confusion with different versions of NCAR Community Land Model (CLM2.0, Bonan et al. 2002; CLM3.0, Oleson et al. 2004 and Dickinson et al. 2006).

The Common Land Model (CLM initial version) was developed by incorporating the best features of three existing land models, i.e., BATs (Dickinson et al. 1993), IAP94 (Dai and Zeng 1997) and NCAR LSM1 (Bonan 1996, 1998), which was documented by Dai et al. (2001) and introduced to the modeling community in Dai et al. (2003). CoLM has been developed on the basis of its initial version with several important improvements, including: (1) a two-big-leaf model for leaf temperatures and carbon assimilation–stomatal resistance (Dai et al. 2004) and (2) an improved two-stream approximation model for the canopy radiation transfer with separate integrations of radiation absorption by sunlit and shaded fractions of canopy (Dai et al. 2004; Dai 2005).

The Global Soil Wetness Project Period 2 (GSWP2) global  $1^\circ \times 1^\circ$  near-surface meteorological datasets spanning from July 1982 to December 1995 (Zhao and Dirmeyer 2003) are used to force CoLM. Most of model parameters used including  $V_{\text{cmax}}$  (cf Table 2), are the same as those documented by Oleson et al. (2004). Parameters used only in Scheme II are taken from the default values of CoLM. Some functional differences are maintained (cf Eq. 2 and Eq. 4 in Table 1). The boundary condition datasets used are provided by the standard datasets of NCAR CLM3.0, except for a new LAI dataset developed by Tian et al. (2004a, b) based on MODIS products.

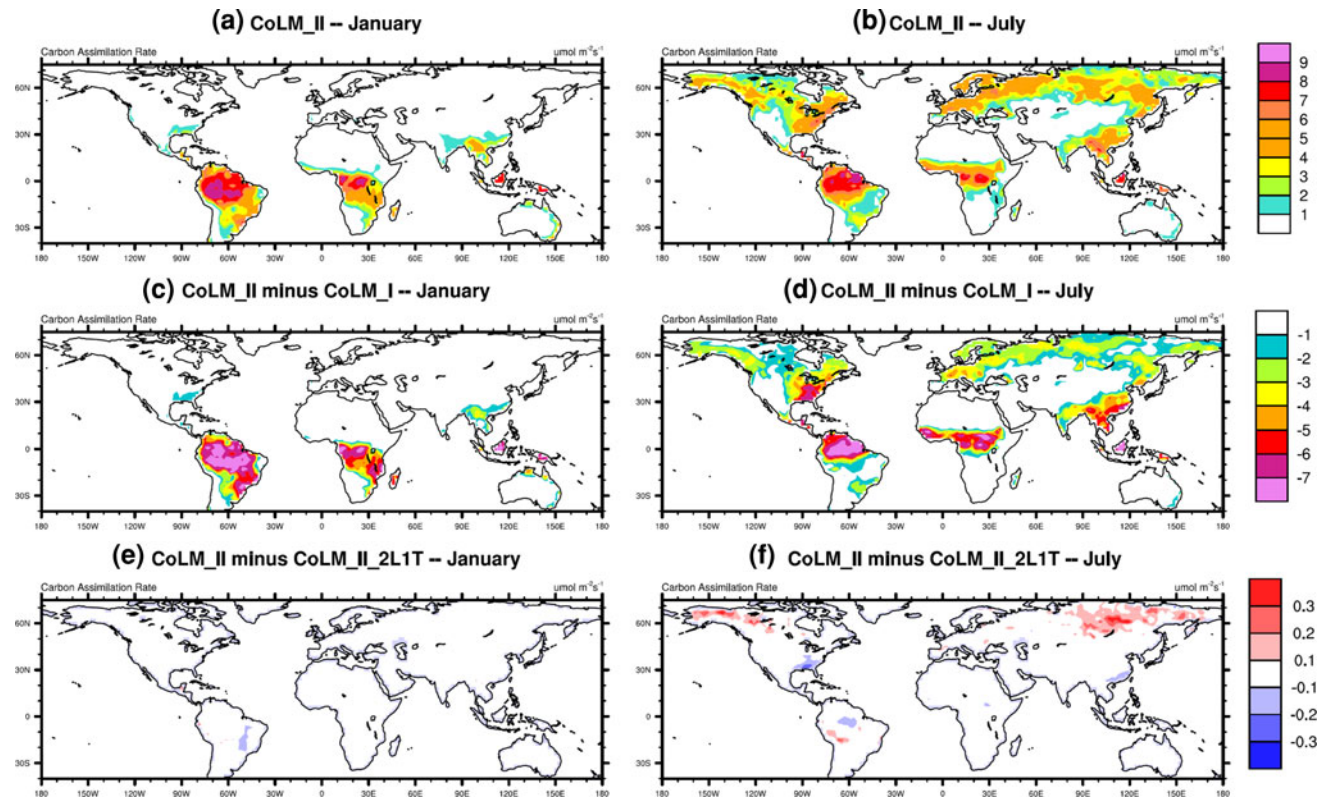
Three experiments of 13.5-year global simulations were performed by using the CoLM with different  $A - g_s$  schemes, i.e., Scheme I (Exp. CoLM\_I), Scheme II (Exp. CoLM\_II), and a modification of Scheme II with only one common leaf temperature calculated (Exp. CoLM\_II\_2L1T). All experiments were integrated from July 1983 to December 1995. The average of the last 10 years of the results was investigated. Comparisons of model results between Exp. CoLM\_I and CoLM\_II explore the differences produced by the two different  $A - g_s$  schemes, while the comparisons between Exp. CoLM\_II and CoLM\_II\_2L1T examine the impacts resulting from the differences in leaf temperature computation schemes.

Three additional experiments, i.e., Exp. CoLM\_II\_sm, Exp. CoLM\_II\_scale and Exp. CoLM\_II\_sm\_scale, were also carried out to quantitatively evaluate the impacts of different treatments used in the carbon assimilation models. Table 3 summarizes these runs. Exp. CoLM\_I-I\_sm is the same as Exp. CoLM\_II except for replacing the solution of the quadratic equations used in Scheme II with the minimum value method of Scheme I, Exp. CoLM\_II\_scale replaces the original scaling scheme of Scheme II by the average scheme used in Scheme I; Exp. CoLM\_II\_sm\_scale removes both the smoothing of quadratic equations and the original scaling method of Scheme II.



**Table 3** Brief description of different sensitivity runs

| Experiments      | Description  |
|------------------|--|
| CoLM_I           | Scheme I: same sun and shade leaf temperature, same $V_{\max}$ , no co-limitation used   |
| CoLM_II          | Scheme II: different sun and shade leaves temps, variable $V_{\max}$ , co-limitation used  |
| CoLM_II_2L1T     | Scheme II: with one common leaf temperature  |
| CoLM_II_scale    | Scheme II: no variable $V_{\max}$ , i.e., the original scaling method is removed from Scheme II  |
| CoLM_II_sm       | Scheme II: no co-limitation, i.e., the smoothing of quadratic equations is removed from Scheme II  |
| CoLM_II_sm_scale | Scheme II: no co-limitation, no variable $V_{\max}$ , i.e., both the smoothing of quadratic equations and the original scaling method are removed from Scheme II |



**Fig. 1** Carbon assimilation rates simulated by different  $A - g_s$  schemes: January (a) and July (b) monthly average from Exp. CoLM\_II; January (c) and July (d) difference (Exp. CoLM\_II minus

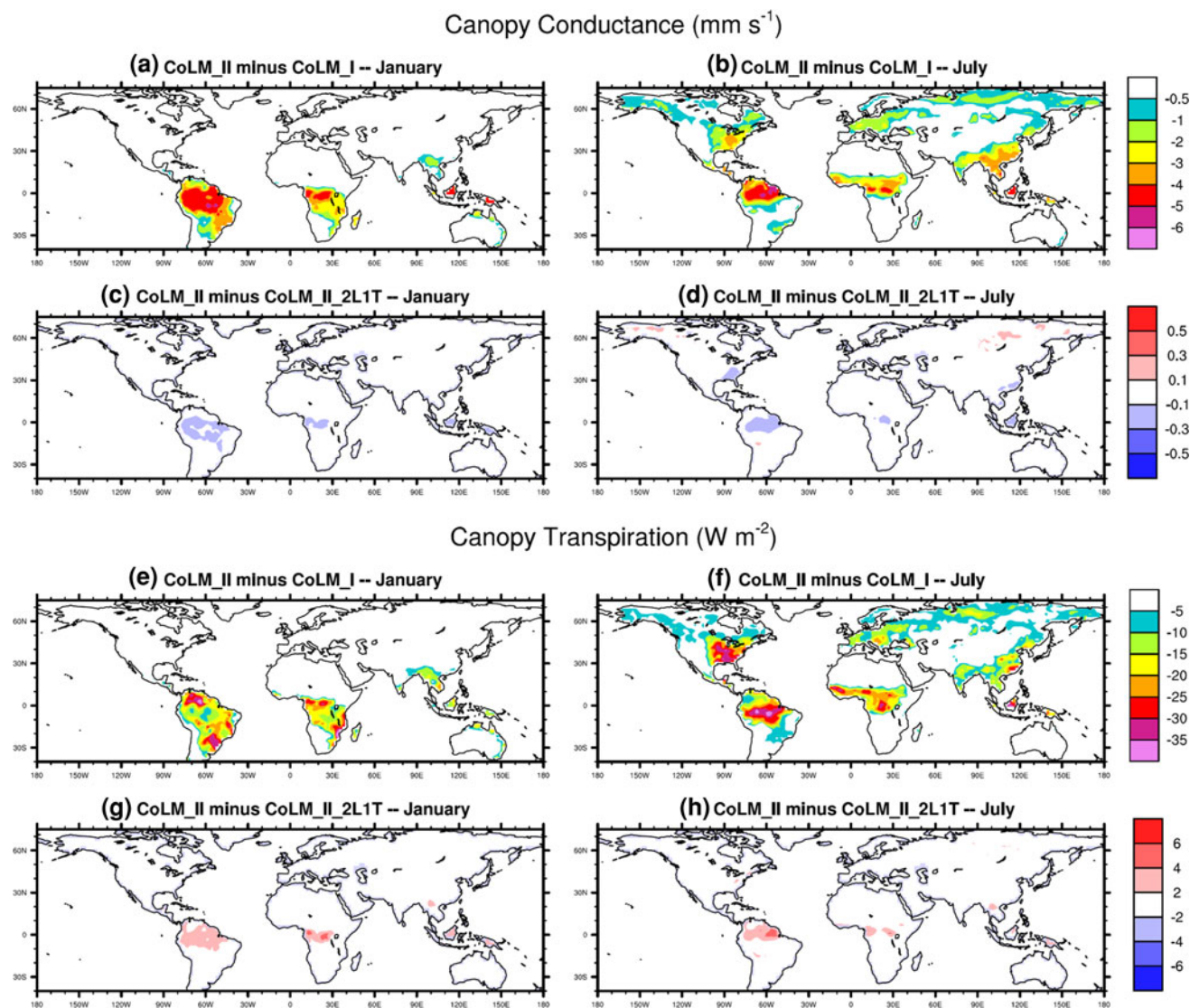
Exp. CoLM\_I); January (e) and July (f) difference (Exp. CoLM\_II minus Exp. CoLM\_II\_2L1T)

## 4 Results and discussion

### 4.1 Impacts of overall differences between parameterizations

Figure 1 presents the global distribution of monthly carbon assimilation rates simulated by CoLM with the two  $A - g_s$  schemes in January and July. It shows that Scheme I produces much larger assimilation rates in both seasons (Fig. 1c, d) than Scheme II. The assimilation rates in Scheme I are nearly twice as large as those in Scheme II in the Tropics and about 70–80% larger in the mid- and

high-latitudes of the North American and Eurasian Continents (Fig. 1a, b). The large differences in the tropics are mainly related to the strong photosynthetic activity of the tropical vegetation. As a result, both the canopy conductance (Fig. 2a, b) and the canopy transpiration (Fig. 2e–f) are also significantly larger in CoLM\_I. The canopy conductance was larger by 3–5 mm/s in both January and July over most tropical regions, but only by  $\sim 1$  mm/s in the northern temperate and boreal regions. Similar increases by up to  $20\text{--}30 \text{ Wm}^{-2}$  were found in the simulated canopy transpiration in the Tropics. The differences of the simulated canopy transpiration have a similar but not



**Fig. 2** Differences in simulated canopy conductance (a–d) and canopy transpiration (e–h)

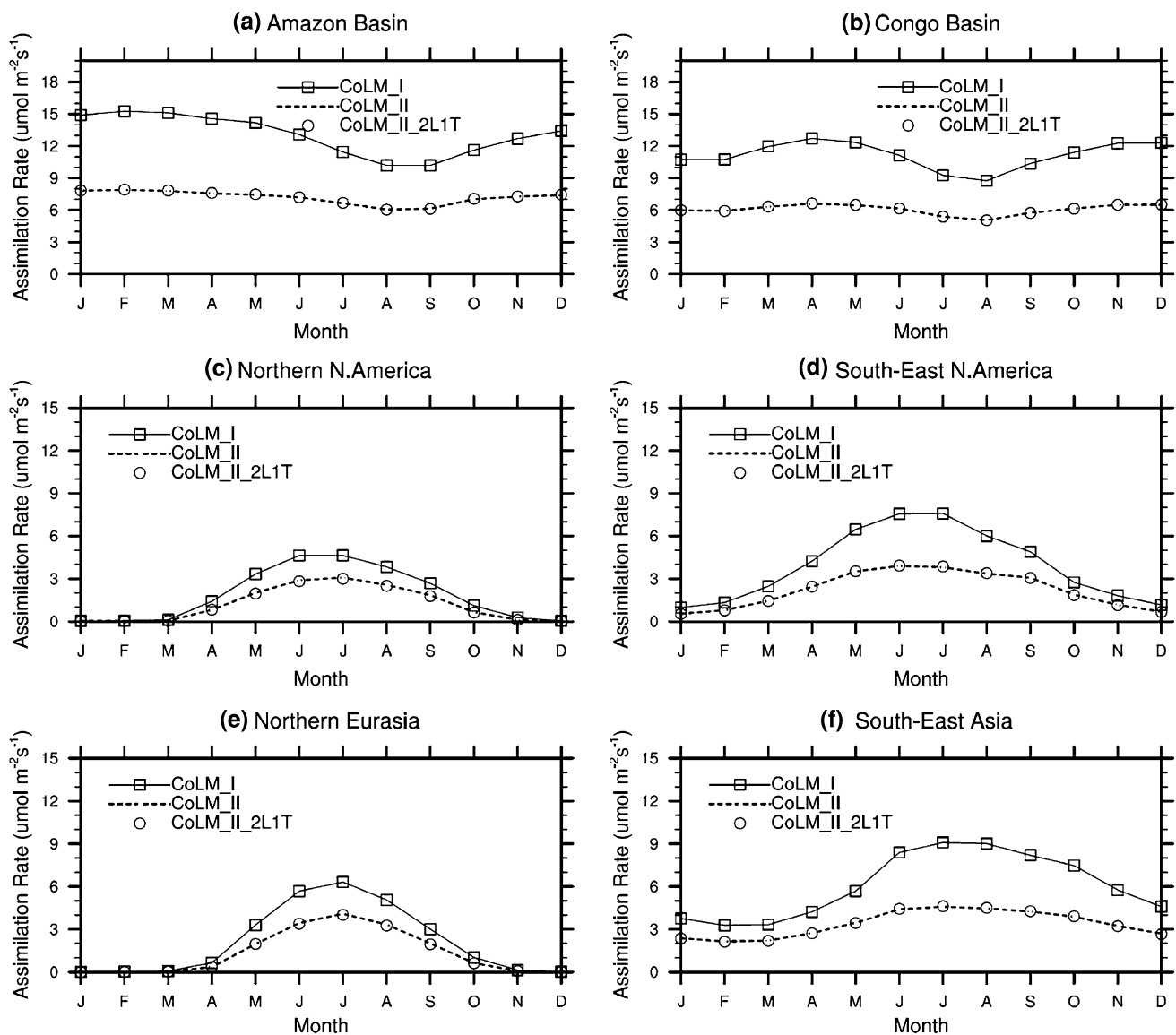
identical pattern as those of the assimilation rates, possibly due to spatial differences in the relevant atmospheric environmental variables.

The seasonal cycles of the simulated assimilation rates and relevant variables averaged over each of six selected regions are further investigated. The assimilation rates estimated by CoLM\_I are evidently much higher than those by CoLM\_II in almost all months over all regions. The differences are largest in the two tropical regions, smallest in the two northern boreal regions, and in-between in the two sub-tropical regions (Fig. 3). The regionally averaged canopy conductance and assimilation rate (Fig. 4) exhibit similar seasonal cycles, with Scheme I giving a relatively larger canopy conductance than Scheme II. Scheme I also gives higher values in simulated canopy transpiration (Fig. 5). The canopy transpiration in the Amazon and

Congo Basins is larger in the dry season but the canopy conductance is larger in the wet season. This seasonal discrepancy is caused by the seasonality of climate factors in those regions. Canopy transpiration is also proportional to the gradient of humidity between leaf and air, and so can increase with decreased canopy conductance if this gradient is large enough. Because the gradient of humidity between leaf and air is 3–4 times larger in the dry than in the wet season, this factor overcomes the decrease of canopy conductance.

Further comparisons between Scheme I and Scheme II were also performed on the basis of different PFTs. The first two panels of Fig. 6 show the simulated differences in carbon assimilation rates for each PFT in January and July, normalized by the CoLM\_II results. In January, the assimilation rate in Scheme I is larger by more than





**Fig. 3** Monthly carbon assimilation rate simulated by Exp. CoLM\_I (square), CoLM\_II (dotted line) and CoLM\_II\_2L1T (circle) averaged over six selected regions. The six regions are Amazon Basin (0–10°S, 50°–70°W), Congo Basin (5°S–5°N, 10°–30°E), Northern North

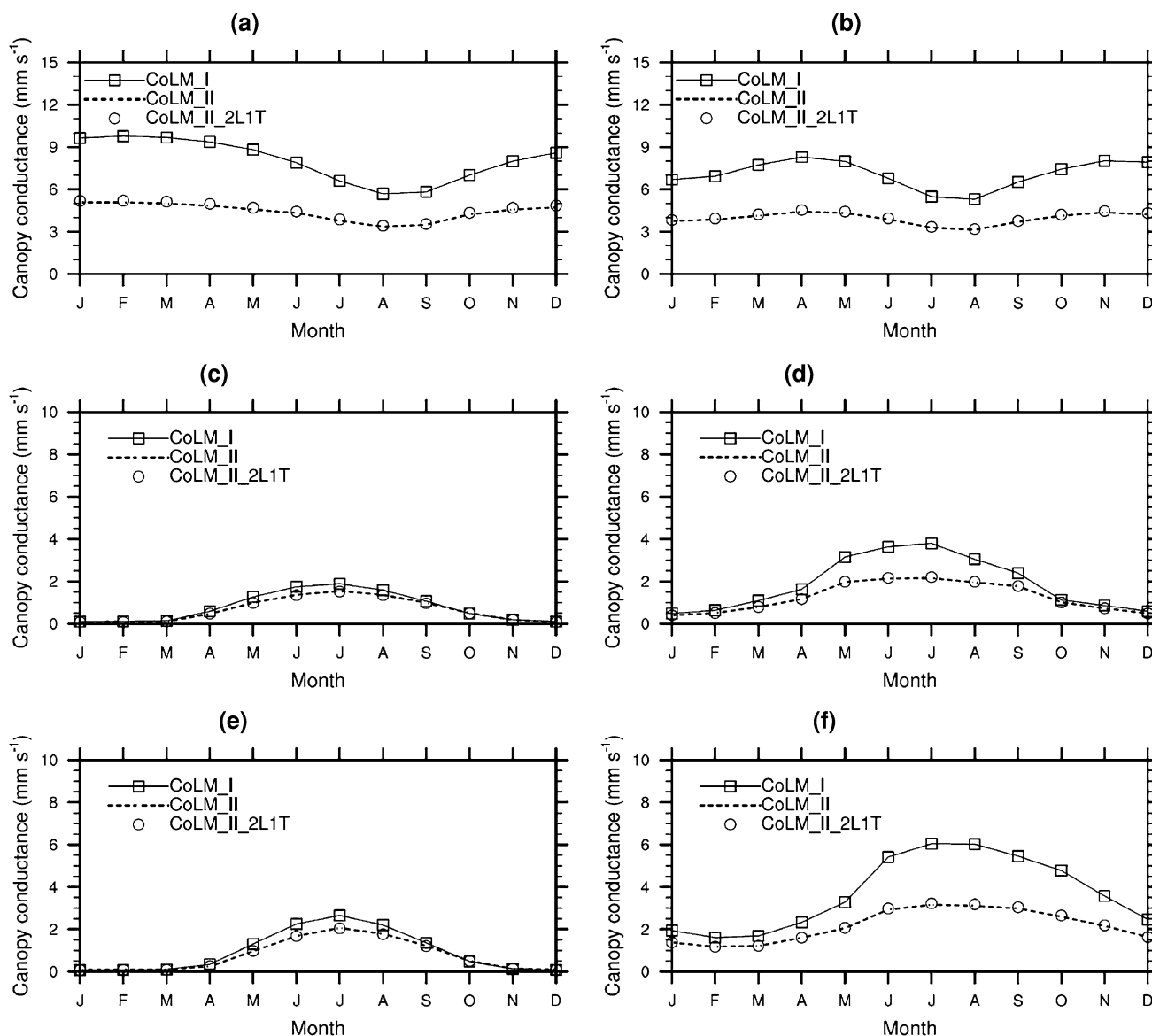
America (50°–70°N, 90°–120°W), South–East North America (30°–50°N, 80°–100°W), Northern Eurasian Continent (50°–70°N, 10°–140°E), and South–East Asia (10°–30°N, 90°–120°E)

60–75% for most PFTs, and even over 100% for C3 grass, C4 grass and crop1 (Fig. 6a). Lower values of about 40% are seen for boreal broadleaf deciduous tree (BDT-Boreal) and temperate broadleaf evergreen shrub (BES-temperate) in July (Fig. 6b). This comparison is less meaningful when the assimilation rates are very small, such as those of NET Boreal, BDT Boreal and BDS Boreal PFTs in January.

#### 4.2 Sunlit/shaded temperature effects

As discussed in Sect. 2, only one common leaf temperature was calculated and used in the calculations of carbon assimilation rates for both sunlit and shaded leaves in

Scheme I. Scheme II calculates and uses separate sunlit and shaded leaf temperatures for the calculation of assimilation rates of the sunlit and shaded canopy. Earlier research has shown that such a treatment could contribute to differences in simulated carbon assimilation rates between one-big-leaf and two-big-leaf models (Wang and Leuning 1998; Dai et al. 2004). In particular, Wang and Leuning (1998) pointed out that sunlit leaves can be several degrees warmer than shaded leaves under sunny and dry conditions, and ignoring this temperature difference will bias the estimates of the carbon assimilation rate, sensible and latent heat. However, they did not quantify such differences.

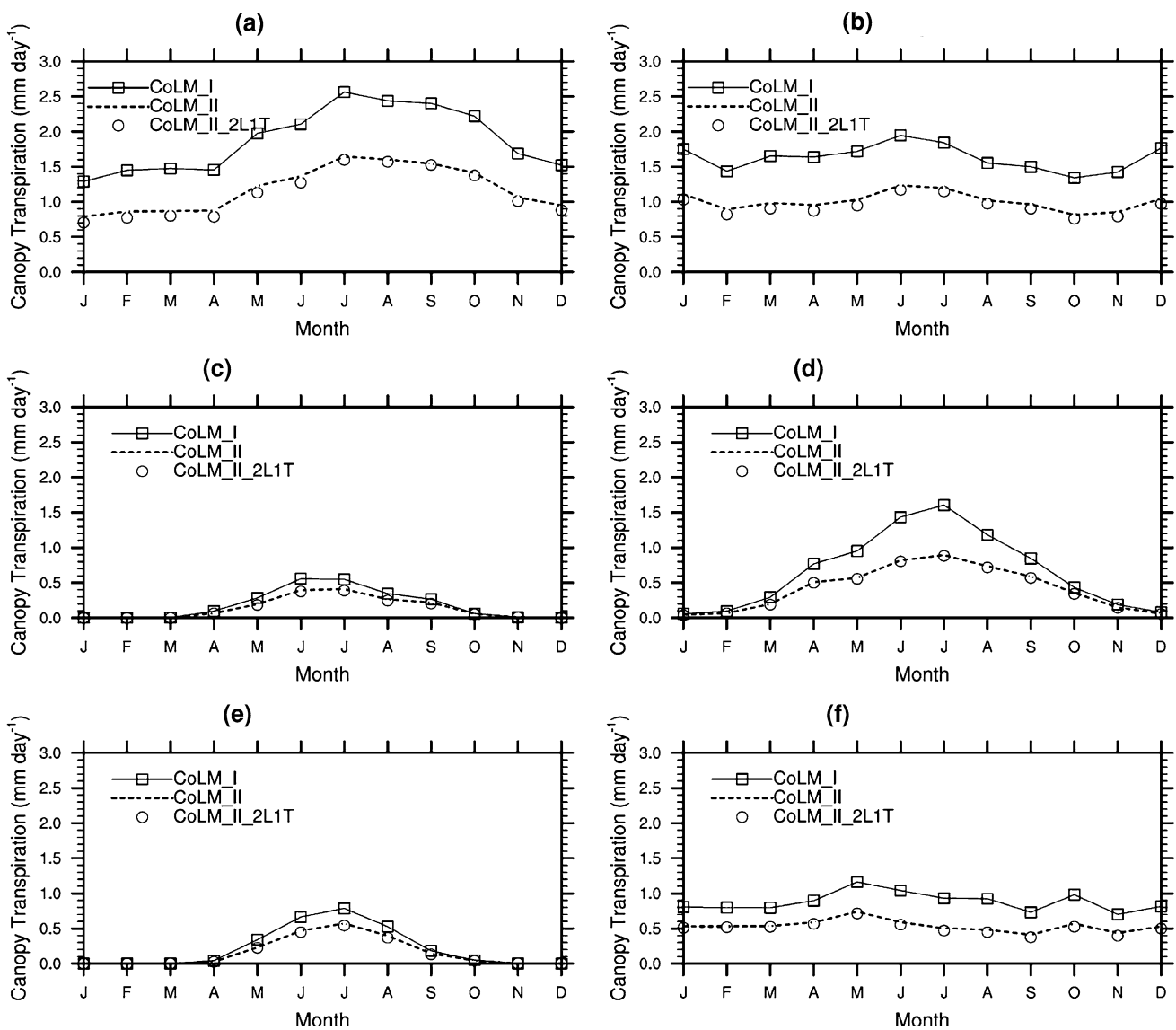


**Fig. 4** As in Fig. 3, but for canopy conductance. **a** Amazon Basin, **b** Congo Basin, **c** Northern North America, **d** South-East North America, **e** Northern Eurasian, **f** South-East Asia

Results simulated by CoLM\_II\_2L1T and CoLM\_II are compared to investigate impacts of the leaf temperature calculation scheme on the carbon assimilation simulation. We find no significant differences in any of the simulated fluxes. For example, the simulated carbon assimilation rate shows only a small difference  $<0.2 \mu\text{mol m}^{-2} \text{s}^{-1}$  over North-East Asia in July (Fig. 1e–f). Similarly, the differences of the simulated canopy conductance (Fig. 2c, d) and canopy transpiration (Fig. 2g, h) are both negligible. This conclusion is further confirmed by replacing one-common leaf temperature scheme in CoLM\_I with the two-leaf temperature scheme. The regionally averaged model results also show that the carbon assimilation rate (Fig. 3), canopy conductance (Fig. 4) and canopy transpiration (Fig. 5)

from CoLM\_II\_2L1T (circle) are nearly indistinguishable from those from CoLM\_II (dotted line). Figure 6c, d show the relative difference (%) in the assimilation rate (CoLM\_II\_2L1T minus CoLM\_II) for each PFT, normalized by the results from CoLM\_II. Though CoLM\_II\_2L1T simulates a carbon assimilation that is slightly lower for most PFTs but larger for several PFTs, such as C3 grass and Crop1, the absolute values of such differences are under 2–4% compared to those simulated by CoLM\_II.

This minor impact of two-leaf temperatures on the carbon assimilation results from two factors: (a) the temperature dependence of the assimilation is not that strong, less than a 10% change for a 1 K temperature change (as inferred from Eq. 4a of Table 1); (b) substantial



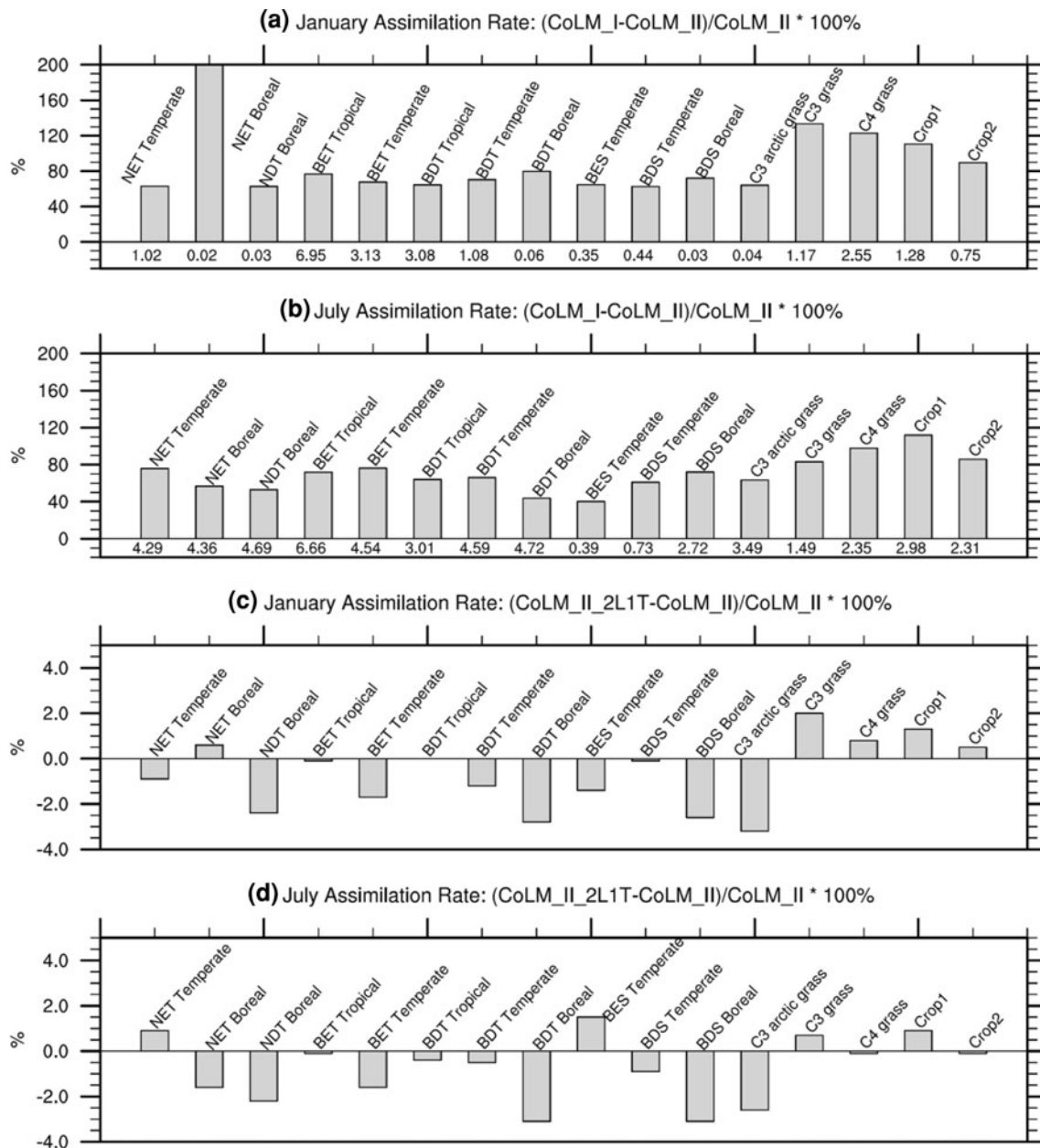
**Fig. 5** As in Fig. 3, but for canopy transpiration. **a** Amazon Basin, **b** Congo Basin, **c** Northern North America, **d** South-East North America, **e** Northern Eurasian, **f** South-East Asia

cancellation occurs because of the near linear dependence of the assimilation on leaf temperature and of the leaf temperature variation on incident radiation. In other words, the area weighted average leaf temperature in Scheme II is about the same as the leaf temperature in Scheme I, and the increase of assimilation for the sunlit leaves in Scheme II is about the same as its decrease for the shaded leaves relative to Scheme I, with weighting by their relative leaf areas. Figure 7 quantifies the differences in the monthly average leaf temperature for each PFT. The two-leaf scheme does give a significant difference in leaf temperature between the sunlit and shaded leaves, producing higher sunlit leaf temperature and lower shaded leaf temperature than the one-leaf scheme. However, the difference between the area weighted average leaf temperature of the two-leaf

temperature scheme and the leaf temperature of one common leaf temperature scheme are negligible (blue dots in Fig. 7).

### 4.3 Smoothing, scaling and residual effects

The above results indicate that the impacts of separate treatment of sunlit versus shaded leaf temperature have a negligible impact. Further investigations are performed below to interpret the differences in the model results in terms of the differences in other three main contributors, i.e., the leaf-to-canopy scaling scheme, the co-limitation methods used to estimate the carbon assimilation rate from three assimilation limiting rates, and parameters of the carbon assimilation sub-model. Because both the canopy



**Fig. 6** Carbon assimilation rates for different PFTs simulated by different  $A - g_s$  schemes. **a** and **b** differences in percentage (Exp. CoLM\_I minus CoLM\_II divided by CoLM\_II), **c** and **d** differences in percentage (CoLM\_II\_2L1T minus CoLM\_II divided by

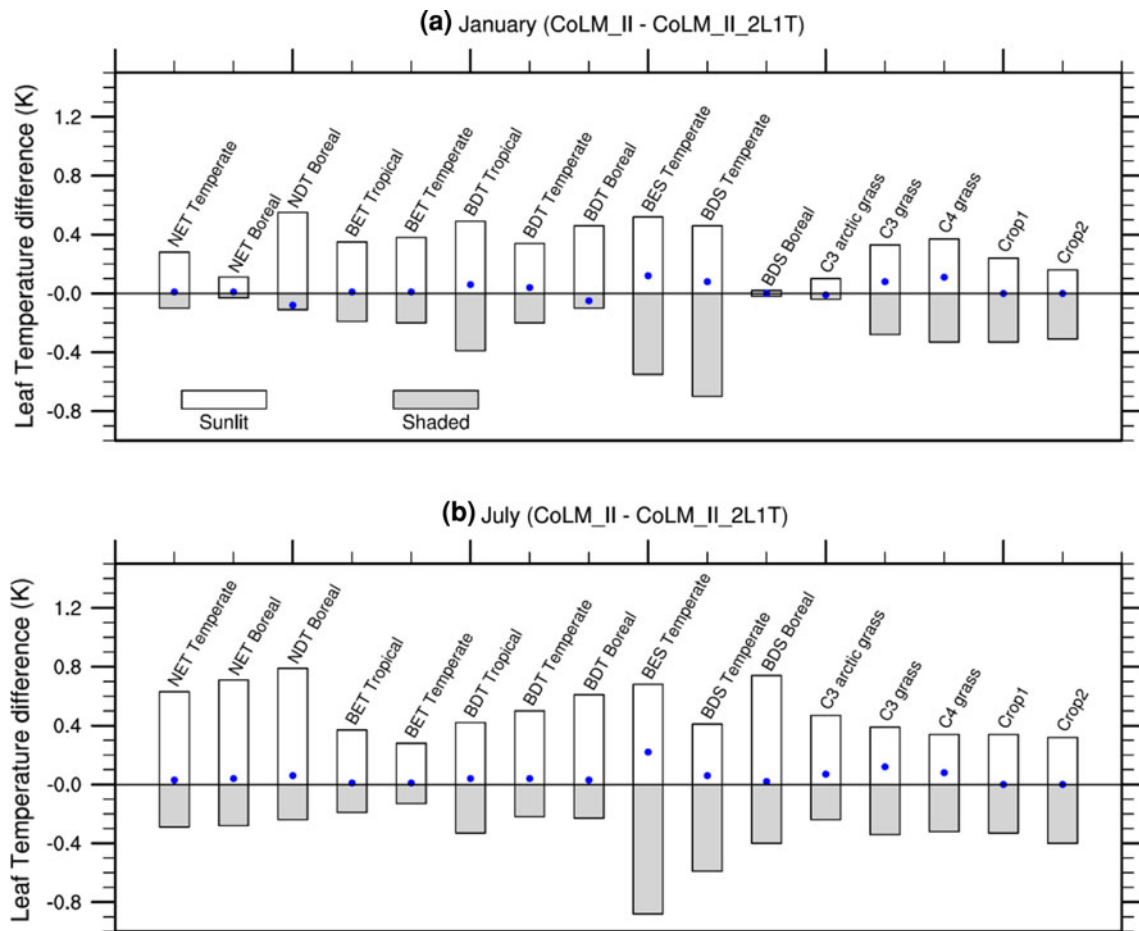
CoLM\_II). The values below the x-axis in **a** and **b** represent monthly average assimilation rates ( $\mu\text{mol m}^{-2} \text{s}^{-1}$ ) for each PFT simulated by Exp. CoLM\_II

conductance and transpiration strongly depend on the carbon assimilation, only the latter flux was investigated here.

For brevity, most of our analyses were only focused on four sampled PFTs, i.e., tropical broadleaf evergreen tree (BET-Tropical) in Amazon basin ( $7^\circ\text{S}$ ,  $67^\circ\text{W}$ ), boreal needle leaf evergreen tree (NET-Boreal) in North America ( $55^\circ\text{N}$ ,  $125^\circ\text{W}$ ), C4 Grass in the subtropics of South America ( $31^\circ\text{S}$ ,  $57^\circ\text{W}$ ), and temperate broadleaf deciduous shrub (BDS-Temperate) in Australia ( $31^\circ\text{S}$ ,  $125^\circ\text{E}$ ). The diurnal variations of the assimilation rates for four selected

PFTs from different sensitivity experiments are shown in Fig. 8. Table 4 lists the monthly assimilation rates and their difference simulated by different testing schemes, which help to quantify the relative contributions of the different treatments used in the two  $A - g_s$  schemes.

Table 4 indicates that much of the difference between CoLM\_I and CoLM\_II occurs from the assumptions about the scaling and smoothing with the former having the larger effect. Table 4 and Fig. 8 show that after removing both the “smoothing” and “scaling” methods



**Fig. 7** Leaf temperatures for different PFTs simulated by Exp. CoLM\_II and CoLM\_II\_2L1T. **a** January and **b** July, in which leaf temperatures for sunlit and shaded leaves from CoLM\_II\_2L1T are

compared to the only one leaf temperature calculated by CoLM\_II. The blue dots represent the area weighted average leaf temperature from the sunlit and shaded leaf temperature

(CoLM\_II\_sm\_scale), the difference between CoLM\_I and CoLM\_II is much smaller. The scaling and smoothing effects contribute to about 70–80% of the differences between CoLM\_I and CoLM\_II except for the NET-Boreal, BDS Temperate and C4 Grass in January when photosynthesis is small. Different treatments for the parameters of the carbon assimilation sub-model, i.e., the temperature dependence of  $V_{max}$  and  $\Gamma^*$ , cause these relatively small residual effects. Compared to the scaling and smoothing effects, the residual effects are smaller except for January C4 Grass.

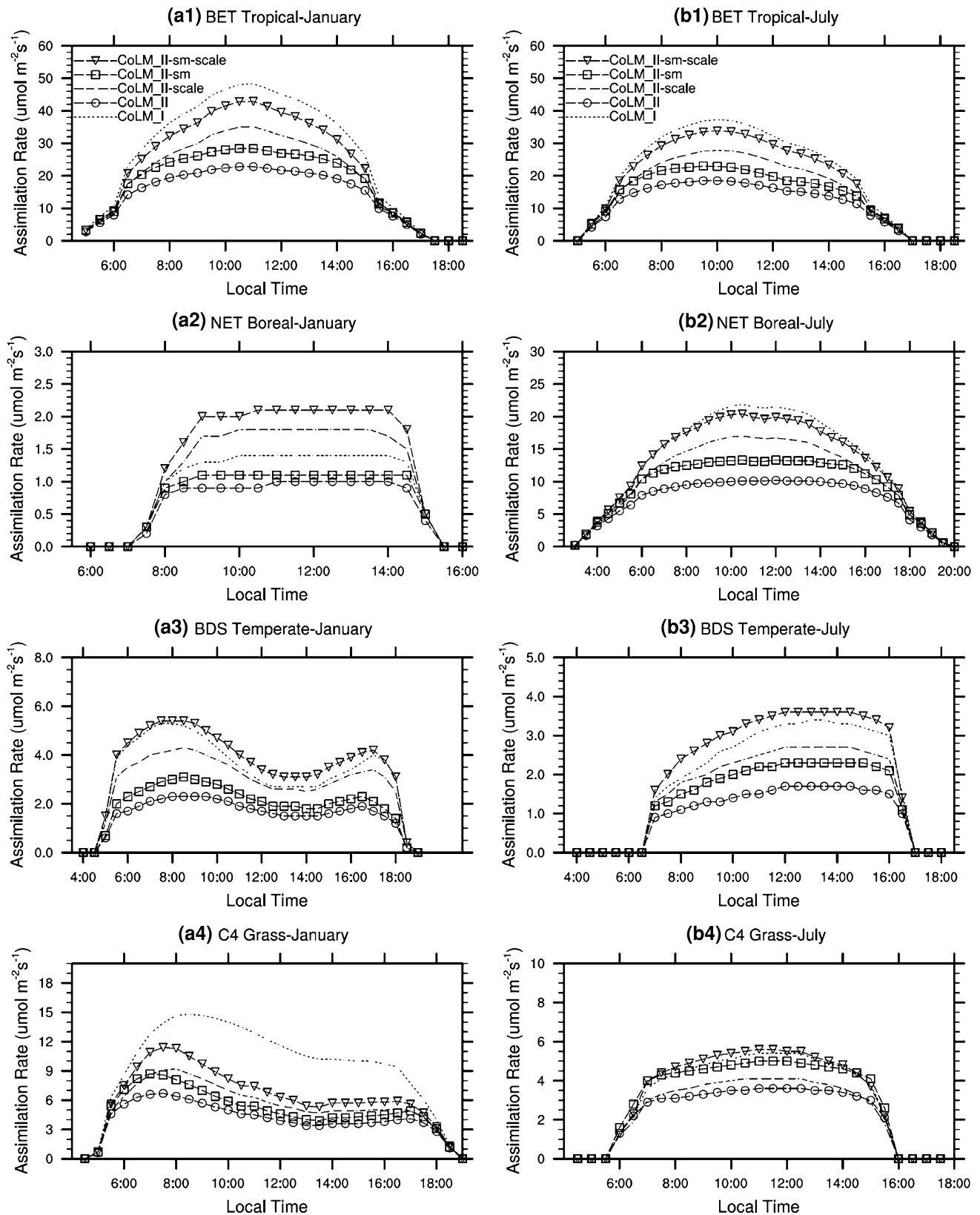
In order to evaluate respective impacts of the scaling and smoothing methods, further investigation are also performed on these effects as described below.

#### 4.3.1 Scaling effects

Scheme I calculates the total carbon assimilation rate using an “average” scheme, in which the total assimilation rate is estimated from the assimilation rates of the sunlit leaves

and shaded leaves per unit LAI multiplied by weight factors  $L_{sun}$  and  $L_{sha}$ . However, Scheme II aggregates separately the assimilation rate from leaves to sunlit and shaded fractions of the canopy through integrating the photosynthetic parameters by using scaling factors  $C_{1sun}, C_{1sha}, C_{2sun}$  and  $C_{2sha}$  (Eqs. 19–20 and 24–25). After replacing the “scaling” scheme of Scheme II with the “average” scheme (CoLM\_II\_scale), the simulated assimilation rate (dashed line) increases (Fig. 8). Except for July C4 Grass case, the increase of the assimilation rates produced by CoLM\_II\_scale is evidently larger than that of CoLM\_II\_sm (square). Compared to the original scheme II (CoLM\_II), the simulated assimilation rate of BET-Tropical, NET-Boreal, BDS-Temperate and C4-grass increases by about 39, 62, 70 and 20%, respectively upon the removal of the “scaling” method (Table 4). On average, the simulated assimilation rate from CoLM\_II\_scale increases by about 40–45% compared to the original scheme II (CoLM\_II). However, some exceptions are found in the C4 Grass case, in which the different treatments for the parameters of the





**Fig. 8** Averaged diurnal cycle of carbon assimilation rates in  $\mu\text{mol m}^{-2} \text{s}^{-2}$  (only daytime) for four selected PFTs simulated by A –  $g_s$  Scheme I and Scheme II as well as different testing schemes of Scheme II. The description of the legend is the same as in Table 3

**Table 4** Differences of monthly assimilation rates ( $\mu\text{mol m}^{-2} \text{s}^{-1}$ ) for BET Tropical, NET Boreal, BDS Temperate and C4 Grass simulated by Scheme I and Scheme II, as well as different tests for Scheme II

| CASE                     | PFT          |       |            |      |               |       |          |       |
|--------------------------|--------------|-------|------------|------|---------------|-------|----------|-------|
|                          | BET Tropical |       | NET Boreal |      | BDS Temperate |       | C4 Grass |       |
|                          | January      | July  | January    | July | January       | July  | January  | July  |
| CoLM_I                   | 15.73        | 12.57 | 0.41       | 9.78 | 2.07          | 1.15  | 5.97     | 1.81  |
| CoLM_II                  | 8.32         | 6.80  | 0.28       | 5.34 | 0.99          | 0.60  | 2.52     | 1.31  |
| CoLM_I-CoLM_II           | 7.41         | 5.77  | 0.13       | 4.44 | 1.08          | 0.55  | 3.45     | 0.50  |
| CoLM_II_sm_scale-CoLM_II | 5.51         | 4.74  | 0.3        | 3.96 | 1.26          | 0.67  | 1.41     | 0.58  |
| CoLM_II_scale-CoLM_II    | 3.18         | 2.72  | 0.22       | 2.50 | 0.81          | 0.35  | 0.81     | 0.11  |
| CoLM_II_sm-CoLM_II       | 1.97         | 1.53  | 0.06       | 1.54 | 0.26          | 0.23  | 0.52     | 0.48  |
| CoLM_I-CoLM_II_sm_scale  | 1.90         | 1.03  | -0.17      | 0.48 | -0.18         | -0.12 | 2.04     | -0.08 |

carbon assimilation sub-model rather than the scaling approach have the most important impact.

The “scaling” factors involved in the two schemes are directly compared to provide further explanations for the differences in model results due to different scaling schemes. We noted that the co-limitation of the electron transport rate used in Scheme II has very limited impacts on the model results, and so do the corresponding scaling factors  $C_{2\text{sun}}$  and  $C_{2\text{sha}}$ . However, the scaling factor  $C_{1\text{sun}}$  and  $C_{1\text{sha}}$  plays a major role in producing the difference in the scaling schemes. Essentially,  $L_{\text{sun}}$  and  $L_{\text{sha}}$  used in Scheme I are equivalent to the scaling factors  $C_{1\text{sun}}$  and  $C_{1\text{sha}}$  (Eqs. 19–20) of Scheme II. Figure 9 shows the scaling factors normalized by  $L_{\text{sun}}$  and  $L_{\text{sha}}$  used in Scheme II. The ratios of  $C_{1\text{sun}}/L_{\text{sun}}$  and  $C_{1\text{sha}}/L_{\text{sha}}$  are evidently  $<1.0$  in all cases, and larger  $L_{\text{sun}}$  and  $L_{\text{sha}}$  are responsible for the larger carbon assimilation rates given by Scheme I. The difference in the estimated assimilation rate caused by the scaling scheme is mainly attributed to the difference between  $C_{1\text{sun}}(C_{1\text{sha}})$  and  $L_{\text{sun}}(L_{\text{sha}})$ . In addition, the seasonality of both  $C_{1\text{sha}}$  and  $C_{1\text{sun}}$ , as well as the sensitivity of the parameter estimations in assimilation sub-models to seasonally varying climate factors, are the main reasons for the seasonal difference between the model results discussed.

#### 4.3.2 Smoothing effects

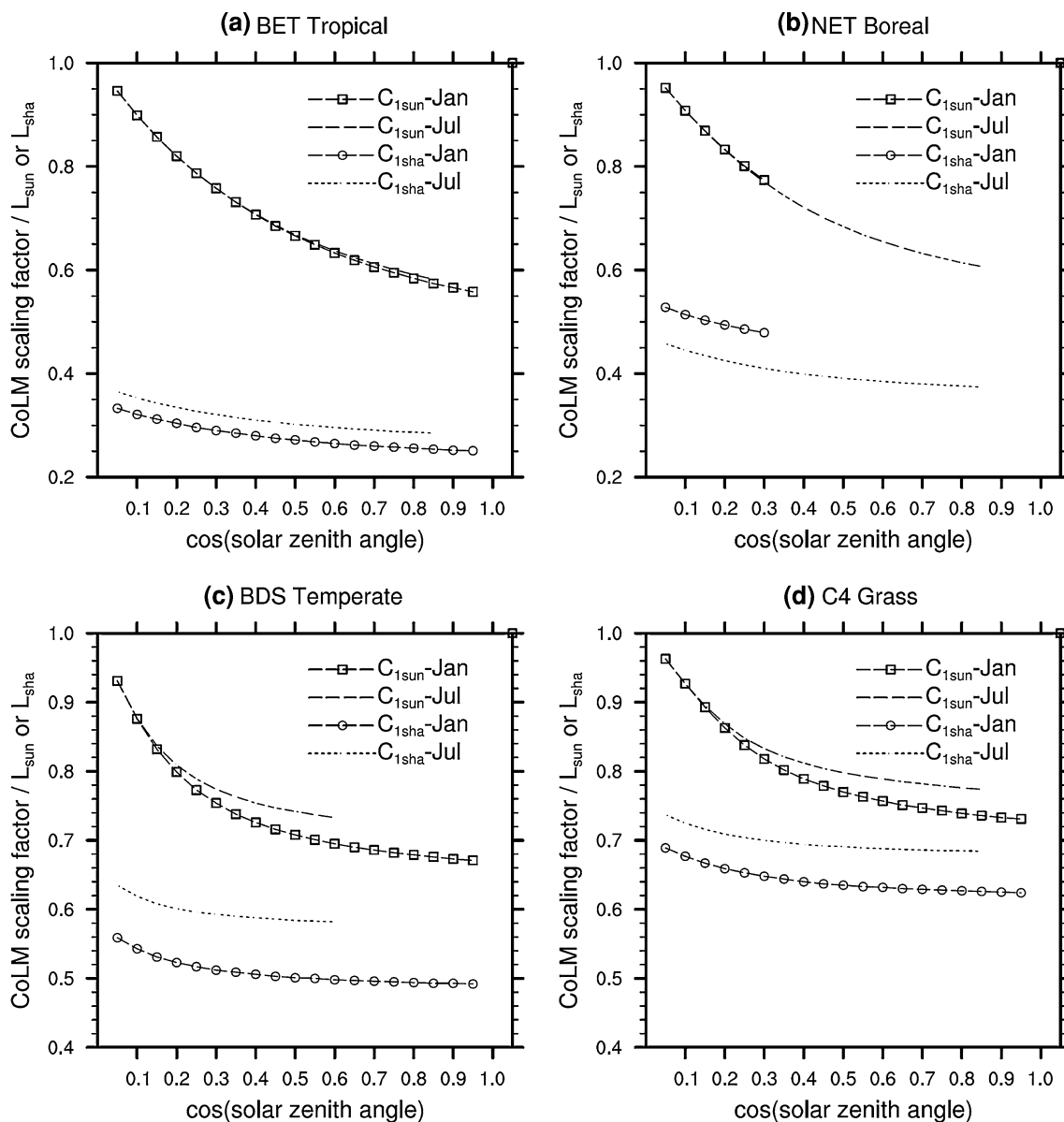
Scheme I estimates the assimilation rate from the minimum of those three limiting factors (the “minimum” method), but Scheme II calculates the assimilation rate by solving two quadratic equations (the “smoothing” method). To examine the impact of the “smoothing” method used by Scheme II, the assimilation rate was recalculated by replacing the “smoothing” method with the “minimum” method as used in Scheme I (CoLM\_II\_sm). The diurnal variations of the assimilation rate simulated by CoLM\_I-I\_sm as well as the original scheme II (CoLM\_II) are shown in Fig. 8. The assimilation rate  $A$  calculated by CoLM\_II

(circle) is evidently lower than that calculated by CoLM\_II\_sm (square). In all cases, the assimilation rates are much larger without the “smoothing” method. Compared to the original Scheme II, the monthly average  $A$  increases by about 23, 25, 27 and 24% for BET-Tropical, NET-Boreal, BDS-Temperate and C4-grass, respectively (Table 4). The monthly average  $A$  increases by about 25% on average after removing the “smoothing” method. Evidently, the “smoothing” method of Scheme II lowers the value of  $A$  significantly compared to the “minimum” method of Scheme I.

In summary, the different treatments in three aspects are mainly responsible for the difference in the carbon assimilation simulations between CoLM\_I and CoLM\_II, and the leaf-to-canopy scaling approach is the largest contributor to the simulation discrepancies. The two-leaf temperature scheme produces distinctly different sunlit and shaded leaf temperatures but has little impacts on the simulation of carbon assimilation. It is not the differences in leaf temperature but rather the amount of leaves illuminated and their photosynthetic capacity that matter. The different methods of co-limitation of assimilation rate show secondary impacts on the results. Except for a few biomes, the residual effects caused by the different methods used to estimate assimilation rate and the different parameter estimations in the carbon assimilation sub-models have smaller impacts on the simulated values of carbon assimilation. It is also noted that different responses induced by PFT-dependent phenological and physiological parameters exist among the sampled PFTs.

## 5 Conclusion

In this paper, we compared the carbon assimilation rate, canopy conductance and canopy transpiration simulated by two carbon assimilation and stomatal conductance ( $A - g_s$ ) schemes, a relatively simple  $A - g_s$  scheme with



**Fig. 9** Scaling factors used by  $A - g_s$  Scheme II for sampled PFTs. **a** BET Tropical ( $L_{AI} = 5.4$  and  $4.8$  January and July, respectively), **b** NET Boreal ( $L_{AI} = 2.75$  for January and  $3.5$  for July), **c** BDS

Temperate ( $L_{AI} = 2.4$  and  $1.8$  January and July, respectively), **d** C3 Grass ( $L_{AI} = 0.6$  for January and  $0.9$  for July)

parameterizations from the NCAR model (Scheme I) and a two-big leaf  $A - g_s$  scheme newly developed by Dai et al. (2004) (Scheme II), to quantify the impacts of different treatments of canopy stomatal conductance and carbon assimilation on the estimations of carbon assimilation and canopy transpiration.

Scheme I was found to differ from Scheme II substantially in its simulated carbon assimilation rate and canopy transpiration. It gives larger estimates for carbon assimilation rate, canopy conductance and canopy transpiration than Scheme II. Its estimates of carbon assimilation are larger by over 60–75% for most PFTs and even above

100% for C3 grass, C4 grass and crop1. Such different model estimates can be attributed to:

1. Different leaf-to-canopy scaling schemes: the “average” scheme used in Scheme I produces a larger carbon assimilation rate than the “scaling” scheme of Scheme II;
2. Co-limitation methods used to estimate carbon assimilation rate from assimilation limiting rates: the “minimum” method of Scheme I gives a larger value than the “smooth” method of Scheme II;
3. Residual effects induced by differences in the carbon assimilation sub-models: Scheme I produces a larger

carbon assimilation rate than Scheme II in most cases and a slightly smaller value for a few biomes.

The leaf-to-canopy scaling method makes a major contribution to the different model results. Introducing co-limitation has a lesser but still important effect. Except for a few biomes, the residual effects due to other parameterization differences have relatively small impacts on the simulated values of carbon assimilation. The two-leaf temperature scheme produces distinctly different sunlit and shaded leaf temperatures but has little impacts on the simulation of carbon assimilation.

Our model-based sensitivity experiments indicate that differences in  $A - g_s$  schemes can produce large differences in the estimate of terrestrial carbon assimilation and canopy transpiration. By identifying major factors and their relative roles in contributing to the resulting model differences, this study provides some very useful information to improve land surface model parameterizations in the estimation of carbon assimilation and canopy transpiration. Models can differ in both their structure and parameters. In this study, parameters have been kept fixed to examine the consequences of structural differences. However, the impacts of structural differences could to a large extent be compensated by parameter adjustment. In particular, assimilation and transpiration are nearly proportional to  $V_{cmax}$ . Scheme I could have fixed  $V_{max}$  to a lower constant value to compensate for its decrease within the canopy and the lack of smoothing in matching the different limiting rates. More generally, simplified models are only likely to reproduce canopy level observations, if constrained by them, when parameter values specified at leaf level recognize within canopy differences.

Previous studies found that the photosynthetic parameters are important sources of uncertainty in the simulation of the vegetation dynamics (Hallgren and Pitman 2000). A large range has also been found in some photosynthetic parameters between species (even among the same species) as estimated from the gas exchange measurements (Wullscheger 1993). Fortunately, FLUXNET provides extensive canopy level data to study the temporal and spatial variability of ecosystem-scale carbon dioxide, water vapor, and energy fluxes (Baldocchi et al. 2001). After such field observations are used to optimize model parameters, further numerical experimentation would be appropriate to identify the consequences of different model parameterizations. Once the parameter values are properly chosen higher order statistics than the climatological means considered here may be needed to evaluate different treatments used in  $A - g_s$  schemes and guide the best choice of a scheme.

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