# Modeling the carbon balance of Amazonian rain forests: resolving ecological controls on net ecosystem productivity

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Abstract. There is still much uncertainty about ecological controls on the rate and direction of net CO<sub>2</sub> exchange by tropical rain forests, in spite of their importance to global C cycling. These controls are thought to arise from hydrologic and nutrient constraints to  $CO_2$ fixation caused by seasonality of precipitation and adverse chemical properties of some major tropical soil types. Using the ecosystem model ecosys, we show that water uptake to a depth of 8 m avoids constraints to  $CO_2$  and energy exchange from soil drying during five-month dry seasons typical for eastern Amazonian forests. This avoidance in the model was tested with eddy covariance (EC) measurements of CO<sub>2</sub> and energy fluxes during 2003 and 2004 over an old-growth forest on an acidic, nutrient-poor oxisol in the Tapajós National Forest (TNF) in Pará, Brazil. Modeled  $CO_2$  fixation was strongly constrained by slow phosphorus (P) uptake caused by low soil pH. Daytime CO<sub>2</sub> influxes in the model were in close agreement with EC measurements ( $R^2 > 0.8$ ) during both wet and dry seasons. Both modeled and measured fluxes indicated that seasonality of precipitation affected  $CO_2$  and energy exchange more through its effect on radiation and air temperature than on soil water content. When aggregated to a yearly scale, modeled and gap-filled EC  $CO_2$  fluxes indicated that old-growth forest stands in the TNF remained within  $100 \text{ g C} \cdot \text{m}^{-2} \cdot \text{yr}^{-1}$  of C neutrality in the absence of major disturbance. Annual C transformations in *ecosys* were further corroborated by extensive biometric measurements taken in the TNF and elsewhere in the Amazon basin, which also indicated that old-growth forests were either small C sources or small C sinks. Long-term model runs suggested that rain forests could be substantial C sinks for several decades while regenerating after stand-replacing disturbances, but would gradually decline toward C neutrality thereafter. The time course of net ecosystem productivity (NEP) in the model depended upon annual rates of herbivory and tree mortality, which were based on site observations as affected by weather (e.g., El Niño Southern Oscillation [ENSO] events). This dependence suggests that rain forest NEP is strongly controlled by disturbance as well as by weather.

Key words: Brazil;  $CO_2$  exchange; disturbance; ecosys; ecosystem modeling; net ecosystem productivity; rain forest.

## INTRODUCTION

In spite of the importance of  $CO_2$  exchange by Amazonian rain forests to global C cycling, much uncertainty remains about ecological controls on the magnitude and direction of this exchange. Most eddy covariance (EC) studies of  $CO_2$  exchange indicate that these rain forests are C sinks of moderate (100 g  $C \cdot m^{-2} \cdot yr^{-1}$ ; Grace et al. 1996) to large size (300–700 g  $C \cdot m^{-2} \cdot yr^{-1}$ ; e.g., Malhi et al. 1998, Andreae et al. 2002, Araújo et al. 2002). However these findings may be affected by inadequate correction for  $CO_2$  emissions suppressed by stable at-

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to aggregate site estimates of net C exchange to regional scales.

Some of this variation has been attributed to seasonal effects of precipitation, with the dry season either raising (Saleska et al. 2003, Goulden et al. 2004), lowering (Malhi et al. 1998, Araújo et al. 2002, von Randow et al. 2004), or not affecting (Carswell et al. 2002) net CO<sub>2</sub> uptake. The maintenance of rapid  $CO_2$  uptake and transpiration during the dry season has been attributed to deep rooting patterns of Amazonian forests that allow excess precipitation received during the wet season to be transpired during the dry season (Nepstad et al. 1994). Ecosystem models used to calculate net C exchange by rain forests have simulated limitations to CO<sub>2</sub> fixation during the dry season imposed by declining soil water content ( $\theta$ ) that were not apparent in EC measurements (e.g., Tian et al. 1998, Botta et al. 2002), indicating that deep soil hydrology and its effects on net C exchange are not yet being accurately modeled.

Here we test (1) whether the ecosystem model ecosys (Grant 2001) can simulate deep rooting under Amazonian conditions using a root submodel in which the vertical distribution of root length is not prescribed, but rather driven by shoot-to-root C transfers governed by access to resources from the atmosphere  $(O_2)$ , shoot (fixed C), and soil (water, nutrients) (Grant 1998) and (2) whether rooting calculated by this submodel allows *ecosys* to simulate the more rapid  $CO_2$  and energy exchange in EC measurements recorded during the fivemonth dry season than during the seven-month wet season in the TNF (da Rocha et al. 2004, Goulden et al. 2004, Hutyra et al. 2007). We extend this testing with estimates of seasonal and annual C exchange (wood growth, litterfall, and soil and plant respiration) and of C stocks (living phytomass, CWD) from biometric measurements in the TNF. We then use ecosys to examine long-term (100 years) changes in forest net ecosystem productivity (NEP) with forest age and weather following disturbance. This work extends earlier studies of forest age effects on NEP in boreal (Grant et al. 2006a, 2007a) and temperate (Grant et al. 2007b) ecosystems.

## MODEL DEVELOPMENT

#### General

*Ecosys* is an hourly time-step model with multiple canopy and soil layers that provide a framework for different plant and microbial populations to acquire, transform, and exchange resources (radiation, water, C, N, and P). The model is constructed from algorithms representing basic physical, chemical, and biological processes that determine process rates in plant and microbial populations interacting within complex biomes. These algorithms interact to simulate complex ecosystem behavior across a wide range of spatial and biological scales. The model is designed to represent terrestrial ecosystems under a range of natural and anthropogenic disturbances and environmental changes at patch (spatially homogenous one-dimensional) and landscape (spatially variable two- or three-dimensional) scales. A comprehensive description of *ecosys* with a detailed listing of inputs, outputs, governing equations, parameters, results, and references can be found in Grant (2001). A more detailed description of model algorithms and parameters most relevant to simulating temperature, water, and nutrient effects on rain forest NEP is given below, with reference to equations and variable definitions found in Appendices A, B, and C.

## Energy exchange

*Ecosystem energy exchange.*—Ecosystem temperatures are driven by energy exchanges between the atmosphere and terrestrial surfaces, resolved in *ecosys* into those between the atmosphere and the leaf and stem surfaces of each population (e.g., species or cohort) within the plant community and those between the atmosphere and each of the ground surfaces (soil, surface litter, snow) beneath (Grant et al. 1999). Total energy exchange between the atmosphere and terrestrial surfaces is calculated as the sum of exchanges with all plant and ground surfaces. Surface energy exchange is coupled with soil heat and water transfers, including surface runoff (Manning), infiltration (Green-Ampt), macropore flow (Poiseuille), and micropore flow (Richards) (Grant et al. 2004).

Canopy energy exchange.—Canopy energy exchange in ecosys is calculated from an hourly two-stage convergence solution for the transfer of water and heat through a multilayered multi-population soil-rootcanopy system. The first stage of this solution requires convergence to a value of canopy temperature ( $T_c$ ) for each plant population at which the first-order closure of the canopy energy balance (net radiation [ $Q_n$ ]; sensible heat flux [H]; latent heat flux [LE; Appendix B, Eq. B.1]; and change in heat storage [G]) is achieved. These fluxes are controlled by aerodynamic ( $r_a$ ) and canopy stomatal ( $r_c$ ) resistances. Two controlling mechanisms are postulated for  $r_c$  that are solved in two successive steps.

First, at the leaf level, leaf resistance,  $r_1$  (Appendix C: Eq. C.4), controls gaseous  $CO_2$  diffusion through each leaf surface when calculating CO<sub>2</sub> fixation (Appendix C: Eq. C.1) from concurrent solutions for diffusion,  $(V_g;$ Appendix C: Eq. C.2) and carboxylation (Vc; Appendix C: Eq. C.3). The value of  $r_1$  is calculated from a minimum leaf resistance ( $r_{lmin}$ ; Appendix C: Eq. C.5) for each leaf surface that allows a set ratio for intercellular to canopy CO<sub>2</sub> concentration  $(C'_i:C_b)$  to be maintained at  $V_{\rm c}$  under ambient irradiance, air temperature  $(T_{\rm a})$ , atmospheric  $CO_2$  concentration ( $C_a$ ), and zero canopy water potential ( $\psi_c$ ) ( $V'_c$ ). This ratio will be allowed to vary diurnally as described in Gross primary productivity below when  $\psi_c$  is solved in the second stage of the convergence solution, described under Plant water relations below. Values of  $r_{lmin}$  are aggregated by leaf surface area to a canopy value  $r_{\rm cmin}$  for use in the energy balance convergence scheme (Appendix B: Eq. B.2).

Second, at the canopy level,  $r_c$  rises from  $r_{cmin}$  at zero  $\psi_c$  from step 1 above through an exponential function of canopy turgor potential ( $\psi_t$ ; Appendix B: Eq. B.3), calculated from  $\psi_c$  and osmotic water potential ( $\psi_{\pi}$ ; Appendix B: Eq. B.4) during convergence for transpiration vs. water uptake.

# Plant water relations

After convergence for  $T_c$  is achieved, the difference between canopy transpiration  $(E_c)$  from the energy balance (Appendix B: Eq. B.1) and total water uptake  $(U_c; Appendix B: Eq. B.5)$  from all rooted layers in the soil is tested against the difference between canopy water content from the previous hour and that from the current hour (Appendix B: Eq. B.13). This difference is minimized in each iteration by adjusting  $\psi_c$ , which in turn determines each of the three terms in Appendix B: Eq. B.13: (1)  $E_c$  (Appendix B: Eq. B.1) through  $r_c$  from  $\psi_t$  and  $\psi_{\pi}$  (Appendix B: Eq. B.4), (2) U from the difference between  $\psi_c$  and soil water potential ( $\psi_s$ ) across soil and root hydraulic resistances ( $\Omega_s$  and  $\Omega_r$ , respectively) in each rooted soil layer (Appendix B: Eq. B.6), and (3) canopy water content through canopy capacitance  $(X_c)$  derived from plant water potential-water content relationships. Root resistances are calculated from root radial and axial resistivities using root lengths and surface areas from a root system submodel driven from shoot-root C transfers (Grant 1998). Because  $r_c$ and  $T_c$  both drive  $E_c$ , the canopy energy balance described under Energy exchange above is recalculated for each adjusted value of  $\psi_c$  during convergence.

## Gross primary productivity

After successful convergence for  $T_c$  and  $\psi_c$  (described in Plant water relations above), Vc is recalculated from that under zero  $\psi_c$  (V') to that under ambient  $\psi_c$ . This recalculation is driven by stomatal effects on  $V_{g}$ (Appendix C: Eq. C.2) from the increase in  $r_{\text{lmin}}$  at zero  $\psi_c$  (Appendix C: Eq. C.5) to  $r_c$  at ambient  $\psi_c$  (Appendix C: Eq. C.4), and by non-stomatal effects ( $f_{\psi}$ ; Appendix C: Eq. C.9) on CO<sub>2</sub>-limited carboxylation (V<sub>b</sub>; Appendix C: Eq. C.6) and light-limited carboxylation ( $V_i$ ; Appendix C: Eq. C.7) (Grant and Flanagan 2007). The recalculation of  $V_{\rm c}$  is accomplished through a convergence solution for  $C_i$  and its aqueous counterpart ( $C_c$ ) at which  $V_{g}$  (Appendix C: Eq. C.2) equals  $V_{c}$  (Appendix C: Eq. C.3) (Grant and Flanagan 2007). The CO<sub>2</sub> fixation rate of each leaf surface at convergence is added to arrive at a value for gross primary productivity (GPP) by each plant population in the model (Appendix C: Eq. C.1). The  $CO_2$  fixation product is stored in nonstructural C pools ( $\sigma_{\rm C}$ ) in each branch.

## Autotrophic respiration and growth

*Carbon oxidation.*—The temperature-dependent oxidation of these nonstructural pools ( $R_c$ ; Appendix C: Eq. C.13) drives autotrophic respiration ( $R_a$ ; Appendix C: Eq. C.12) by all branches, roots, and mycorrhizae.

Oxidation of nonstructural C by roots and mycorrhizae is constrained by  $O_2$  uptake ( $U_{O2}$ ; Appendix C: Eq. C.13b), calculated by solving for aqueous  $O_2$  concentrations at root and mycorrhizal surfaces ( $[O_{2r}]$ ) at which convection and radial diffusion through the soil aqueous phase plus radial diffusion through the root aqueous phase (Appendix C: Eq. C.13d) equals active uptake driven by  $O_2$  demand from  $R_c$  (Appendix C: Eq. C.13c) (Grant 2004). The diffusion processes are driven by aqueous  $O_2$  concentrations sustained by transport and dissolution of gaseous  $O_2$  through soil and roots (Grant 2004) and are governed by lengths and surface areas of roots and mycorrhizae (Grant 1998). Thus  $R_c$  is coupled to  $O_2$  reduction by all root and mycorrhizal populations according to  $O_2$  availability.

Plant maintenance and growth.-Oxidation of nonstructural C is first used to meet maintenance respiration requirements ( $R_m$ ; Appendix C: Eq. C.15), then any excess is expended as growth respiration (Rg) constrained by branch, root, or mycorrhizal  $\psi_t$  (Appendix C: Eq. C.16). Growth respiration drives the conversion of branch  $\sigma_C$  into foliage, twigs, branches, boles, and reproductive material according to organ growth yields  $(Y_g)$  and phenology-dependent partitioning coefficients (Appendix C: Eq. C.19) and the conversion of root and mycorrhizal  $\sigma_{\rm C}$  into primary and secondary axes according to root and mycorrhizal growth yields. Because branch  $\psi_t$  is usually lower than root  $\psi_t$ , branch  $R_g$ declines relatively more with soil drying than does root  $R_{\rm g}$ , slowing oxidation of  $\sigma_{\rm C}$  in branches and allowing more translocation of  $\sigma_{\rm C}$  from branches to roots. This change in allocation of  $\sigma_C$  enables more root growth to reduce  $\Omega_s$ ,  $\Omega_r$ , and  $\Omega_a$  and hence increase U (Appendix B: Eq. B.6), thereby offsetting the effects of soil drying on  $\psi_t$ . Translocation of  $\sigma_C$  thus maintains a functional equilibrium among branches, roots, and mycorrhizae that adapts to changing hydrology.

Maintenance respiration is calculated independently of  $R_{\rm c}$  from the N content in each organ and a function of  $T_{\rm c}$  or soil temperature ( $T_{\rm s}$ : Appendix C: Eq. C.15). When  $R_{\rm m}$  exceeds  $R_{\rm c}$ , the shortfall is met by the respiration of remobilizable C  $(R_s)$  in leaves and twigs or roots and mycorrhizae (Appendix C: Eq. C.14). Respiration of remobilizable C drives the withdrawal of remobilizable C, N, and P (mostly nonstructural protein) from leaves and twigs or roots and mycorrhizae into  $\sigma_N$  and  $\sigma_P$  and the loss of associated nonremobilizable C, N, and P (mostly structural) as litterfall (Appendix C: Eq. C.17). Provision is also made to withdraw remobilizable N or P from leaves and twigs or roots and mycorrhizae when ratios of  $\sigma_N:\sigma_C$  or  $\sigma_P:\sigma_C$ become smaller than those required for growth of new phytomass. This withdrawal drives the withdrawal of associated remobilizable C and the loss of associated non-remobilizable C, N, and P as litterfall. Environmental constraints such as water, heat, nutrient, or O2 stress that reduce  $\sigma_{\rm C}$  and hence  $R_{\rm c}$  with respect to  $R_{\rm m}$ therefore hasten litterfall.

Autotrophic respiration of each branch or root and mycorrhizal layer is the total of  $R_c$  and  $R_s$ , and net primary productivity (NPP) is the difference between canopy GPP (Appendix C: Eq. C.1) and total R<sub>a</sub> of all branches and root and mycorrhizal layers (Appendix C: Eq. C.12). Phytomass net growth is the difference between gains driven by  $R_{g}$  and  $Y_{g}$  and losses driven by  $R_s$  and litterfall (Appendix C: Eq. C.19). These gains are allocated to leaves, twigs, wood, and reproductive material at successive branch nodes and to roots and mycorrhizae at successive primary and secondary axes, driving growth in plant stature. Losses from remobilization and litterfall in shoots start at the lowest node of each branch at which leaves or twigs are present and proceed upwards when leaves or twigs are lost. Losses in roots and mycorrhizae start with secondary axes and proceed to primary axes when secondary axes are lost.

#### Nutrient uptake and translocation

Root and mycorrhizal uptake.-Root and mycorrhizal uptake of N and P  $U_{\rm NH_4}$ ,  $U_{\rm NO_3}$ , and  $U_{\rm PO_4}$  is calculated by solving for solution [NH<sub>4</sub><sup>+</sup>], [NO<sub>3</sub><sup>-</sup>], and [H<sub>2</sub>PO<sub>4</sub><sup>-</sup>] at root and mycorrhizal surfaces at which radial transport by mass flow and diffusion from the soil solution to these surfaces (Appendix A: Eq. A.36a, c, e] equals active uptake by the surfaces (Appendix A: Eq. A.36b, d, f). Path lengths and surface areas for  $U_{\rm NH_4}$ ,  $U_{\rm NO_3}$ , and  $U_{\rm PO_4}$ are calculated from a root and mycorrhizal growth submodel (Grant 1998). Solution  $[NH_4^+]$ ,  $[NO_3^-]$ , and  $[H_2PO_4^-]$  are controlled by precipitation, adsorption, and ion pairing reactions (Grant and Heaney 1997, Grant et al. 2004). If pH is assumed constant in the model, then only a subset of these reactions that directly control NH<sub>4</sub><sup>+</sup>, NO<sub>3</sub><sup>-</sup>, and H<sub>2</sub>PO<sub>4</sub><sup>-</sup> solubility are solved, including precipitation-dissolution of Al(OH)<sub>3</sub>, Fe(OH)<sub>3</sub>, CaCO<sub>3</sub>, AlPO<sub>4</sub>, FePO<sub>4</sub>, Ca(H<sub>2</sub>PO<sub>4</sub>)<sub>2</sub>, CaHPO<sub>4</sub>, and  $Ca_5(PO_4)_3OH$ , cation exchange between  $Ca^{2+}$  and  $NH_4^+$ , anion exchange between adsorbed  $H_2PO_4^-$  and  $HPO_4^{2-}$  and soluble  $H_2PO_4^{-}$ , and ion pairing between  $NH_4^+$  and  $NH_3$ . Solution  $[NH_4^+]$ ,  $[NO_3^-]$ , and  $[H_2PO_4^-]$ are also controlled by vertical and horizontal solute transport (Grant et al. 2004) and by microbial activity including mineralization, nitrification, denitrification, volatilization, and N2 fixation described under Heterotrophic respiration below.

Translocation.—Products of  $U_{\rm NH_4}$ ,  $U_{\rm NO_3}$ , and  $U_{\rm PO_4}$  are added to  $\sigma_{\rm N}$  and  $\sigma_{\rm P}$  in root and mycorrhizal layers where they are coupled with  $\sigma_{\rm C}$  to drive growth of branches, roots, and mycorrhizae as described in *Autotrophic respiration and growth* above. The translocation of  $\sigma_{\rm C}$ ,  $\sigma_{\rm N}$ , and  $\sigma_{\rm P}$  among branches and root and mycorrhizal layers is driven by concentration gradients generated by production of  $\sigma_{\rm C}$  from branch GPP and of  $\sigma_{\rm N}$  and  $\sigma_{\rm P}$  from root and mycorrhizal uptake vs. consumption of  $\sigma_{\rm C}$ ,  $\sigma_{\rm N}$ , and  $\sigma_{\rm P}$  from  $R_c$ ,  $R_g$ , and phytomass growth (Grant 1998). Low  $\sigma_{\rm N}$ : $\sigma_{\rm C}$  or  $\sigma_{\rm P}$ : $\sigma_{\rm C}$ in branches indicate excess CO<sub>2</sub> fixation with respect to N or P uptake for phytomass growth. Such ratios in the model have two effects on GPP: (1) They reduce activities of rubisco (Appendix C: Eq. C.6a) and chlorophyll (Appendix C: Eq. C.7a) through product inhibition (Appendix C: Eq. C.11), thereby simulating the suppression of CO<sub>2</sub> fixation by leaf  $\sigma_{\rm C}$  accumulation widely reported in the literature. (2) They reduce the structural N:C and P:C ratios at which leaves are formed because  $\sigma_{\rm C}$ ,  $\sigma_{\rm N}$ , and  $\sigma_{\rm P}$  are the substrates for leaf growth. Lower structural ratios cause a proportional reduction in areal concentrations of rubisco (Appendix C: Eq. C.6b) and chlorophyll (Appendix C: Eq. C.7b), reducing leaf CO<sub>2</sub> fixation.

Low  $\sigma_N: \sigma_C$  or  $\sigma_P: \sigma_C$  in mycorrhizae and roots indicates inadequate N or P uptake with respect to CO2 fixation. These ratios affect translocation of  $\sigma_{\rm C}$ ,  $\sigma_{\rm N}$ , and  $\sigma_P$  by lowering mycorrhizal-root-branch concentration gradients of  $\sigma_N$  and  $\sigma_P$  while raising branch-rootmycorrhizal concentration gradients of  $\sigma_{\rm C}$ . These changes slow transfer of  $\sigma_N$  and  $\sigma_P$  from root to branch and hasten transfer of  $\sigma_{\rm C}$  from branch to root, increasing root and mycorrhizal growth at the expense of branch growth and thereby raising N and P uptake with respect to CO<sub>2</sub> fixation. High  $\sigma_N:\sigma_C$  or  $\sigma_P:\sigma_C$  in roots and mycorrhizae indicate excess N or P uptake with respect to CO<sub>2</sub> fixation. Such ratios reduce specific activities of root and mycorrhizal surfaces for N or P uptake through a product inhibition function, as has been observed experimentally. Thus the modeled plant translocates  $\sigma_{\rm C}$ ,  $\sigma_{\rm N}$ , and  $\sigma_{\rm P}$  among branches, roots, and mycorrhizae to maintain a functional equilibrium between acquisition and use of C, N, and P by different parts of the plant.

## Heterotrophic respiration

Decomposition.—Organic transformations in ecosys occur in five organic matter-microbe complexes (coarse woody litter, fine nonwoody litter, animal manure [if present], particulate organic matter [POM], and humus) in each soil layer. Each complex consists of five organic states: solid organic matter, dissolved organic matter, sorbed organic matter, microbial biomass, and microbial residues, among which C, N, and P are transformed. Organic matter in litter and manure complexes are partitioned from proximate analysis results into carbohydrate, protein, cellulose, and lignin components of differing vulnerability to hydrolysis. Organic matter in POM, humus, microbial biomass, and microbial residues in all complexes are also partitioned into components of differing vulnerability to hydrolysis.

The rate at which each component of each organic state in each complex is hydrolyzed during decomposition is a first-order function of the active biomass, M, of all heterotrophic microbial populations (Appendix A: Eqs. A.1, A.2). The rate at which each component is hydrolyzed is also a Monod function of substrate concentration (Appendix A: Eqs. A.3, A.4]), calculated from the fraction of substrate mass colonized by M. Hydrolysis rates are controlled by  $T_s$  through an Arrhenius function [A5] and by soil water content ( $\theta$ )



PLATE 1. Flux tower view at the study site in Amazonian Tapajós National Forest. Photo credit: L. R. Hutyra.

through its effect on aqueous concentrations of active microbial biomass [M] (Appendix A: Eqs. A.3, A.4) in surface litter and in a spatially resolved soil profile. Soil temperature and  $\theta$  are calculated from surface energy balances and from heat and water transfer schemes through canopy-snow-residue-soil profiles as described in Energy exchange above. Release of N and P from hydrolysis of each component in each complex is determined by its N and P concentrations (Appendix A: Eqs. A.6, A.7), which are determined from those of the originating litterfall as described in Autotrophic respiration and growth above. Most non-lignin hydrolysis products are released as dissolved organic C, N, and P (DOC, DON, and DOP), which are adsorbed or desorbed according to a power function of their soluble concentrations (Appendix A: Eqs. A.8-A.10).

*Microbial growth.*—The DOC decomposition product is the substrate for heterotrophic respiration,  $R_h$ , by all Min each substrate-microbe complex (Appendix A: Eq. A.13). Total  $R_h$  for all soil layers (Appendix A: Eq. A.11) drives CO<sub>2</sub> emission from the soil surface through volatilization and diffusion. Heterotrophic respiration may be constrained by microbial N or P concentrations,  $T_s$ , DOC, and O<sub>2</sub> (Appendix A: Eqs. A.12–A.14). O<sub>2</sub> uptake by M is driven by  $R_h$ (Appendix A: Eq. A.15) and constrained by O<sub>2</sub> diffusivity to microbial surfaces (Appendix A: Eq. A.16), as described for roots in *Autotrophic respiration and growth* above. Thus  $R_h$  is coupled to O<sub>2</sub> reduction by all aerobic M according to O<sub>2</sub> availability. Heterotrophic respiration not coupled with  $O_2$  reduction is coupled with the sequential reduction of  $NO_3^-$ ,  $NO_2^-$ , and  $N_2O$  by heterotrophic denitrifiers and with the reduction of organic C by fermenters and acetotrophic methanogens. In addition, autotrophic nitrifiers conduct  $NH_4^+$  and  $NO_2^-$  oxidation and  $NO_2^-$  reduction, and autotrophic methanogens and methanotrophs conduct  $CH_4$  production and oxidation.

All microbial populations undergo maintenance respiration R<sub>m</sub> (Appendix A: Eqs. A.17, A.18), depending on microbial N and  $T_s$  as described earlier for plants. Heterotrophic respiration in excess of R<sub>m</sub> is used in growth respiration ( $R_g$ ; Appendix A: Eq. A.19), the energy yield ( $\Delta G$ ) of which drives growth in biomass (M) from DOC uptake according to the energy requirements of biosynthesis (Appendix A: Eqs. A.20, A.21). Maintenance respiration in excess of  $R_{\rm h}$  causes microbial dieback. Biomass also undergoes first-order decomposition ( $D_{\rm m}$ ; Appendix A: Eq. A.22). Internal retention and recycling of microbial N and P during decomposition (Appendix A: Eq. A.23) is modeled whenever these nutrients constrain  $R_{\rm h}$  (Appendix A: Eq. A.12). Changes in M arise from differences between gains from DOC uptake and losses from  $R_{\rm m} + R_{\rm g} + D_{\rm m}$ (Appendix A: Eq. A.24).

*Microbial nutrient exchange.*—During these changes, all microbial populations seek to maintain set minimum ratios of C:N or C:P in M by mineralizing or immobilizing NH<sub>4</sub><sup>+</sup>, NO<sub>3</sub><sup>-</sup>, and H<sub>2</sub>PO<sub>4</sub><sup>-</sup> (Appendix A: Eq. A.25), thereby controlling solution [NH<sub>4</sub><sup>+</sup>], [NO<sub>3</sub><sup>-</sup>],

	Layer (m)									
Property	1	2	3	4	5	6	7	8		
Depth to bottom (m)	0.075	0.225	0.375	0.625	1.375	2.625	4.375	10.375		
Bulk density $(Mg/m^3)$	1.16	1.24	1.26	1.21	1.22	1.26	1.26	1.26		
Sand (g/kg)	588	515	467	426	418	430	430	430		
Silt (g/kg)	20	30	30	0	0	0	0	0		
Clay (g/kg)	392	455	503	574	582	570	570	570		
Coarse fragments $(m^3/m^3)$	0	0	0	0	0	0	0	0		
pH	3.72	4.08	4.08	4.35	4.35	4.35	4.35	4.35		
CEC (cmol <sup>(+)</sup> /kg)	5	5	5	5	5	5	5	5		
AEC (cmol <sup>(-)</sup> /kg)	3	3	3	3	3	3	3	3		
Organic C (g/kg)	21.8	7.85	7.85	3.88	2.0	1.0	0.5	0.0		
Total N (g/Mg)	1500	920	920	454	200	100	50	0		
Total P $(g/Mg)$	215	140	140	110	90	80	80	80		
Exchangeable P (g/Mg)	3.4	1	1	0	0	0	0	0		

TABLE 1. Representative physical and chemical properties of nutrient-poor clay oxisols measured in the Tapajós National Forest in Pará, Brazil, and used in the ecosystem model *ecosys*.

*Notes:* For all properties except depth to bottom, coarse fragments, and AEC, values to 1 m are from Silver et al. (2000); values below 1 m are assumed to be the same as those above 1 m. Values for AEC are from Falcão and da Silva (2004). Abbreviations are: CEC, cation exchange capacity; AEC, anion exchange capacity.

and [H<sub>2</sub>PO<sub>4</sub><sup>-</sup>] that determine root and mycorrhizal uptake in Nutrient uptake and translocation above. If immobilization is inadequate to maintain these minimum ratios, then biomass C:N or C:P may rise, but  $R_{\rm h}$  is constrained by N or P present in the lowest concentration with respect to that at the minimum ratio (Appendix A: Eq. A.12). Non-symbiotic heterotrophic diazotrophs can also fix aqueous N<sub>2</sub> (Appendix A: Eq. A.26) to the extent that immobilization is inadequate to maintain their set minimum C:N, but at an additional respiration cost (Appendix A: Eq. A.27). Changes in microbial N and P arise from DON and DOP uptake plus NH<sub>4</sub><sup>+</sup>, NO<sub>3</sub><sup>-</sup>, and H<sub>2</sub>PO<sub>4</sub><sup>-</sup> immobilization and N<sub>2</sub> fixation, less NH<sub>4</sub><sup>+</sup>, NO<sub>3</sub><sup>-</sup>, and H<sub>2</sub>PO<sub>4</sub><sup>-</sup> mineralization and microbial N and P decomposition (Appendix A: Eq. A.28).

*Humification.*—Carbon, N, and P decomposition products in each organic matter-microbe complex are gradually stabilized into more recalcitrant organic forms with lower C:N and C:P ratios. Products from liginin hydrolysis (Appendix A: Eqs. A.1, A.6) combine with some of the products from protein and carbohydrate hydrolysis in the litterfall and manure complexes and are transferred to the POM complex (Appendix A: Eqs. A.30–A.33). Microbial decomposition products (Appendix A: Eqs. A.22, A.23) from all complexes are partitioned between the humus complex and microbial residues in the originating complex according to soil clay content (Appendix A: Eqs. A.34, A.35).

#### FIELD EXPERIMENT

#### Site description

Experimental work to study net C exchange by Amazonian rain forests was conducted at a site within the Tapajós National Forest (TNF),  $\sim$ 7 km from the 67km road marker on the Santarém-Cuiaba Highway (hereafter "Santarém km 67"),  $\sim$ 70 km south of Santarém (54°58′ W, 2°51′ S; see Plate 1). The TNF is a 450 000-ha area of closed-canopy upland forest with a mean temperature of 25°C and relative humidity of 85%. The forest receives mean annual rainfall of 1909 mm, with a five-month dry season between July and November. The forest is on flat terrain and has a closed canopy with a mean height of  $\sim$ 40–45 m and emergent trees reaching up to 55 m. There are few indications of recent anthropogenic disturbance other than small hunting trails. This forest can be classified as "primary" with abundant large logs, numerous epiphytes, an uneven age distribution, and emergent trees. The soils are nutrient-poor clay oxisols, with low organic matter, exchangeable P, and cation exchange capacity (Table 1; Silver et al. 2000).

## Biometric measurements

Four transects totaling 19.75 ha were established during July 1999 to measure C stocks in primary forest areas near Santarém km 67. Three additional transects totaling 30 ha were established during 2003 near km 72 and km 117 along the Santarém-Cuiaba highway. The transects were designed to capture spatial variations inherent in tropical forests, including those of the common emergent species *Manilkara huberi* (Ducke) Chev., *Hymanaea courbaril* L., and *Tachigalia* spp., considered typical for the region. Locations and sampling protocols and allometric methods for living phytomass and CWD measurements in plots established along these transects were described in Rice et al. (2004) and Pyle et al. (2008).

## Eddy covariance measurements

A 64-m EC tower was operated from April 2001 to January 2006  $\sim$ 6 km west of the 67 km road marker on the BR-163 highway and  $\sim$ 6 km east of the Tapajós River, in an area of largely contiguous forest extending for tens of kilometers to the north and south. All key instruments and data loggers were mounted at 57.8 m on the tower to keep inlet tubes short ( $\sim$ 2 m) in this tall canopy. Flux measurements recorded at 8 Hz were



FIG. 1. (a) Daily total radiation and mean air temperature, (b) hourly precipitation, and (c) hourly soil water content ( $\theta$ ) modeled (lines) and measured (symbols) at Santarém km 67 within the Tapajós National Forest (TNF) in Pará, Brazil, during 2003.

averaged to half-hour values, excluding those recorded at a friction velocity ( $u^*$ ) of <0.22 m/s. The EC measurement protocol is described further in Hutyra et al. (2007) and Saleska et al. (2003). In addition, vertical profiles of CO<sub>2</sub> and H<sub>2</sub>O concentrations were measured at eight levels on the tower (62.2, 50, 39.4, 28.7, 19.6, 10.4, and 0.91 m) to estimate half-hourly changes in canopy CO<sub>2</sub> and energy storage that were added to EC fluxes for comparison with model output.

Soil water contents ( $\theta$ ) were measured every half-hour using time domain reflectometry (TDR) probes (CS-615; Campbell Scientific, Logan, Utah, USA) at depths of 0.05, 0.15, 0.30, 0.50, 1.0, and 2.0 m in each of three locations near the flux tower.

## MODEL EXPERIMENT

*Ecosys* was run with the physical and chemical properties of the nutrient-poor clay oxisols typical of the experimental site (Table 1; Silver et al. 2000) and the biological properties of overstory and understory plant populations in an evergreen tropical rain forest (see Appendices B and C). These biological properties were identical to those in earlier studies of boreal and

temperate broadleaf forests (Hanson et al. 2004, Grant et al. 2006a, b, 2007a, b), except that (1) the deciduous growth habit, in which photoperiod- and temperaturedependent algorithms remobilize overwinter reserves during "leaf-out" and rebuild overwinter reserves during leaf fall, was suppressed so as to simulate an evergreen growth habit; (2) the zone of thermal adaptation was changed from boreal or temperate to tropical by shifting the temperature functions for microbial activity (Appendix A: Eq. A.5), V<sub>c</sub> (Appendix C: Eq. C.10), R<sub>c</sub> (Appendix C: Eq. C.13), and R<sub>m</sub> (Appendix C: Eq. C.15) to the right by 3°C for each 10°C rise in annual mean temperature. This shift raised temperature optima for these processes based on relationships of growth temperatures with temperature responses of carboxylation found in a meta-analysis by Medlyn et al. (2002) and with those of respiration in several studies reported in Larcher (2001).

*Ecosys* was initialized with CWD stocks of 10 kg  $C/m^2$  (standing) and 5 kg  $C/m^2$  (surface), representing stocks remaining after a stand-replacing disturbance. *Ecosys* was seeded with an evergreen overstory and understory and run during model years 1900 to 2005 with repeating cycles



FIG. 2. (a) Daily total radiation and mean air temperature, (b) hourly precipitation, and (c) hourly soil water content ( $\theta$ ) modeled (lines) and measured (symbols) at Santarém km 67 during 2004.

of hourly weather data (radiation,  $T_{\rm a}$ , dewpoint, wind speed, and precipitation) recorded at the EC tower during 2002-2005. This period allowed the simulated forest to regenerate, mature, and attain dynamic C equilibrium well before the end of the model run so as to permit comparison with the old-growth forest in the TNF. During the model run, atmospheric CO<sub>2</sub> concentration  $(C_{\rm a})$  was initialized at 275 µmol/mol and raised hourly at an annual rate of 0.3%, reaching current  $C_a$  by the end of the run. Concentrations of  $NH_4^+$ -N,  $NO_3^-$ -N, and H<sub>2</sub>PO<sub>4</sub><sup>-</sup>-P in precipitation remained at 0.1, 0.05, and  $0.01 \text{ g/m}^3$ , respectively, during the model run so as to approximate precipitation concentrations measured by Lesack and Melack (1991) in the central Amazon. A background mortality rate of 2% per year, based on C stock measurements at Santarem by Pyle et al. (2008), was applied monthly during each year of the model run. This rate was raised to 6% per year during El Niño Southern Oscillation (ENSO) years (1903, 1912, 1917, 1926, 1931, 1935, 1940, 1956, 1965, 1974, 1983, 1988, 1993, and 1998), based on a review of ENSO-caused mortality in tropical forests by Clark (2004) and on estimates from CWD measurements at Santarem by Pyle et al. (2008). Mortality events were simulated by

removing all plant material from specified fractions of remaining plant populations and adding nonwoody material (leaves, twigs, reproductive material, fine roots, mycorrhizae) to surface and subsurface fine-litter stocks and adding woody material (boles, coarse roots) to standing dead and subsurface CWD stocks. In addition, herbivory was simulated as daily removals of standing leaf mass to give annual removals of 10%, consistent with those summarized for tropical rain forests by Coley and Barone (1996). Herbivory products were added as litterfall to surface stocks of fine litter and manure. Exchanges of CO<sub>2</sub> and energy and transformations of phytomass and litter stocks simulated during 2003-2005 of the model run were compared with EC and biometric measurements recorded near Santarém km 67 during 2003-2005. Model performance was evaluated through regression analyses in which agreement between measured and modeled fluxes of LE and CO2 was indicated by slopes and intercepts not greatly different from 1 and 0, respectively. Based on random errors in EC flux measurements derived over forested sites by Richardson et al. (2006), slopes and intercepts within 0.1 of 1 and within 15  $W/m^2$  (LE) or 1  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup> (CO<sub>2</sub>) of 0 could be considered acceptable. Agreement was also indicated by root mean squares for



FIG. 3. Vertical profiles of soil water content ( $\theta$ ) measured (symbols) and modeled (lines) during the wet season (day of year [DOY] 75 and 150) and dry season (DOY 225 and 300) at Santarém km 67 in (a) 2003 (modeled vs. measured  $R^2 = 0.69$ , root mean squares for differences [RMSD] = 0.034 m<sup>3</sup>/m<sup>3</sup>) and (b) 2004 (modeled vs. measured  $R^2 = 0.84$ , RMSD = 0.024 m<sup>3</sup>/m<sup>3</sup>).

differences (RMSD) between measured and modeled fluxes not significantly greater than root mean squares for error (RMSE) in the measured fluxes derived over forest stands by Richardson et al. (2006).

## RESULTS

#### Forest hydrology

Soil water uptake.-Dry-season (15 July-15 December) and wet-season (15 December-15 July) precipitation were comparatively low during 2002-2003 (279 and 1316 mm, respectively) and high during 2003-2004 (424 and 1904 mm, respectively), allowing model behavior to be studied under contrasting hydrological conditions during 2003 and 2004. Radiation (Q) and  $T_a$  declined during the wet seasons and rose during the dry (Figs. 1a and 2a). Frequent rains during early 2003 (Fig. 1b) caused measured and modeled  $\theta$  to rise during February (Fig. 1c). The following dry season (Fig. 1b) caused  $\theta$  to decline at progressively greater depths from July to November, although near-surface  $\theta$  was temporarily raised by infrequent rainfall (Fig. 1c). More precipitation during the following wet season (Fig. 2b) caused  $\theta$ to rise earlier during 2004 (Fig. 2c). However, a protracted dry season later in 2004 caused soil drying to persist until the end of the year.

Low precipitation during 2002–2003 caused a zone of drier soil to be modeled at 4 m in early 2003 (Fig. 3a). Water in this zone was replenished by higher precipitation during 2003–2004 (Fig. 3b). Soil water uptake in the model extended to a depth of 8 m during 2004, although most occurred within the upper 4 m. The depth of soil drying in the model was similar to that measured by Bruno et al. (2006) at a nearby site in the TNF where drying extended to a depth of 10 m in 2002 following two years of comparatively low precipitation. Soil water uptake in the model was driven by root length densities (as described in *Plant water relations* above) that

declined exponentially with depth to 9 m. Values of RMSD from regressions of measured on modelled  $\theta$  during 2003 and 2004 (Fig. 3) were not significantly greater than RMSE from regressions of measured  $\theta$  on TDR probe readings during calibration that varied from 0.02 to 0.05 m<sup>3</sup>/m<sup>3</sup> among different probes and depths, indicating no significant disagreement between modeled and measured  $\theta$ .

Energy exchange.—Rises in Q and  $T_a$  during the dry season (Figs. 1a and 2a) caused modeled LE to rise from midday rates of 200–400 W/m<sup>2</sup> under variable  $Q_{\rm n}$ during the late wet season of 2004 (Fig. 4a) to midday rates of 400 W/m<sup>2</sup> under sustained  $Q_n$  during the late dry season (Fig. 4b), consistent with the EC measurements. These rises in LE were driven by rises in vapor pressure deficit (D) during the dry season (Fig. 4c, d). However, modeled rises in LE were constrained by midafternoon declines in canopy stomatal conductance,  $g_{\rm c}$ , when D rose above 1.5 kPa (e.g., days of year [DOY] 294-295 and 299 in Fig. 4d) as observed experimentally in the TNF by da Rocha et al. (2004). Midday  $g_c$  in the model was similar to means of 13 and 12 mm/s for wet and dry seasons calculated in the TNF by da Rocha et al. (2004) from EC flux measurements and an inverted Penman-Monteith equation. These  $g_{c}$ were sustained by comparatively high  $\psi_c$  in the model, predawn values of which declined little from -0.4 MPa in the wet season to -0.5 MPa in the dry season, consistent with earlier measurements in the TNF by Nepstad et al. (2002).

In both years, modeled LE explained ~80% of variation in EC values, with little bias ( $a \rightarrow 0, b \rightarrow 1$ ; Table 2). The RMSD between modeled and measured LE fluxes were similar to random errors in EC LE fluxes of 50–60 W/m<sup>2</sup> estimated from measurements over tall temperate forests by Richardson et al. (2006) for the range of LE fluxes measured in the TNF.



FIG. 4. (a, b) Net radiation ( $Q_n$ ), latent heat (LE), and sensible heat (H) measured (symbols) and modeled (lines) during (a) the late wet season (day of year [DOY] 141–150) and (b) the late dry season (DOY 290–300) at Santarém km 67 in 2004. Positive values represent downward fluxes, negative value upward ones. (c, d) [next page] Vapor pressure deficit (D) measured and canopy stomatal conductance ( $g_c$ ) modeled during (c) the late wet season and (d) the late dry season at Santarém km 67 in 2004.

CO<sub>2</sub> exchange.—More rapid LE vs. H from both EC measurements and the model (Fig. 4) indicated that plant water status did not much constrain CO<sub>2</sub> fixation during either the wet or the dry season, as apparent in maximum CO<sub>2</sub> influxes of  $\sim 20 \ \mu mol \cdot m^{-2} \cdot s^{-1}$  measured and modeled during both seasons in 2004 (Fig. 5a, b). Small midafternoon declines were modeled on days with higher D and hence lower  $g_c$  (DOY 294–295 and 299; Fig. 4d), simulating the slight negative correlation between D and  $CO_2$  influxes found by Malhi et al. (1998). Although modeled CO<sub>2</sub> influxes were usually within 2  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup> of EC values, modeled CO<sub>2</sub> effluxes were sometimes larger than EC values by as much as 5  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup>, even when  $u^* > 0.22$  m/s (e.g., DOY 297–298; Fig. 5b). When  $u^* < 0.22$  m/s, modeled CO<sub>2</sub> effluxes were often larger than gap-filled estimates that replaced EC measurements during dry seasons when CO<sub>2</sub> influxes were larger. In both years, modeled CO<sub>2</sub> fluxes explained >80% of variation in EC measurements (excluding gap-filled values), with little bias  $(a \rightarrow 0,$  $b \rightarrow 1$ ; Table 2). The RMSD between modeled and measured CO<sub>2</sub> fluxes were similar to random errors in

EC CO<sub>2</sub> flux measurements of 2.5–4.5  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup> estimated over temperate forests by Richardson et al. (2006) for the range of CO<sub>2</sub> fluxes measured in the TNF.

In the model, CO<sub>2</sub> uptake was constrained by low nonstructural  $\sigma_P:\sigma_C$  in leaves (Appendix C: Eq. C.11) caused by slow uptake of P by roots caused in turn by low  $[H_2PO_4^-]$  in the soil (Appendix A: Eq. A.36; see also Nutrient uptake and translocation above). Low soil  $[H_2PO_4^-]$  in the model was caused by low pH (Table 1), which forced precipitation of  $H_2PO_4^-$  as AlPO<sub>4</sub> and FePO<sub>4</sub>, and increased protonated anion exchange sites and hence H<sub>2</sub>PO<sub>4</sub><sup>-</sup> adsorption, as found experimentally (Gehring et al. 1999, McGrath et al. 2001). Leaf  $\sigma_P:\sigma_C$ ratios in the model declined with advancing forest age, causing foliar and litterfall P:C ratios to fall below 0.003 and 0.0006, respectively, by 100 years after a standreplacing disturbance when model CO<sub>2</sub> fluxes in Fig. 5 were generated. These P:C ratios were typical of those found by Vitousek and Sanford (1986) and Silver et al. (2000) for P-limited tropical forests growing on nutrientpoor oxisols in the TNF and elsewhere. Leaf P:N ratios in the model declined to 0.045, smaller than values of



FIG. 4. Continued.

0.06 found in P-limited tropical forests by Harrington et al. (2001). Low litterfall P:C and P:N in turn forced immobilization of  $H_2PO_4^-$  by heterotrophic microbial populations during litter decomposition (Appendix A: Eq. A.25), as found experimentally in the TNF by McGroddy et al. (2004). Immobilization further limited root P uptake while retaining P in the organic phase for eventual remineralization.

Seasonal evapotranspiration and net ecosystem productivity.—The rise in hourly LE modeled and measured during the dry season (15 July–15 December; Fig. 4) was apparent as a rise in daily evapotranspiration (ET) from variable rates of ~3 mm/d during the wet season to ones of ~4 mm/d during the dry season in 2003 (Fig. 6a) and 2004 (Fig. 7a). A similar rise in ET has been measured elsewhere in the TNF by da Rocha et al. (2004). These rises were accompanied by ones in NEP from <0 g  $C \cdot m^{-2} \cdot d^{-1}$  (net C source) during the later wet season to >0 g  $C \cdot m^{-2} \cdot d^{-1}$  (net C sink) during the dry season (Figs. 6b and 7b). These rises in ET and NEP from the wet to

TABLE 2. Statistics from regressions of simulated on measured (a, b) and measured on simulated  $(R^2, \text{RMSD})$  hourly latent heat flux (LE) and CO<sub>2</sub> fluxes over an old-growth rain forest at Santarém km 67.

n	$a^{\dagger}$	$b^{\dagger}$	$R^2$ ‡	RMSD‡
5043 4642	$-22 \\ -28$	0.94 0.91	0.83 0.77	57 66
4744 3998	0.72 0.88	0.90 0.94	0.85 0.82	4.4 4.7
	n 5043 4642 4744 3998	$\begin{array}{c cccc} n & a^{\dagger} \\ 5043 & -22 \\ 4642 & -28 \\ 4744 & 0.72 \\ 3998 & 0.88 \end{array}$	n $a^{\dagger}_{\uparrow}$ $b^{\dagger}_{\uparrow}$ 5043         -22         0.94           4642         -28         0.91           4744         0.72         0.90           3998         0.88         0.94	n $a^{\dagger}_{\uparrow}$ $b^{\dagger}_{\uparrow}$ $R^{2}_{+}^{2}_{+}$ 5043         -22         0.94         0.83           4642         -28         0.91         0.77           4744         0.72         0.90         0.85           3998         0.88         0.94         0.82

*Note:* All measured values were recorded at a friction velocity of  $u^* > 0.2$  m/s.

 $\dagger Y = a + bX$  from regression of simulated Y on measured X.

 $\ddagger R^2$ , coefficient of determination; RMSD, root mean square for error from regression of measured Y on simulated X.



FIG. 5. Carbon dioxide exchange measured (solid symbols), gap-filled (open symbols), and modeled (lines) during (a) the late wet season (day of year [DOY] 141–150) and (b) the late dry season (DOY 290–300) at Santarém km 67 in 2004. Positive values represent downward fluxes, negative values upward ones.

the dry seasons were caused by rises in Q and  $T_a$  (Figs. 1a and 2a) that drove rises in CO<sub>2</sub> influxes (Fig. 5). Rises in NEP modeled during the dry seasons were smaller than those in EC-derived NEP because CO<sub>2</sub> effluxes modeled during the dry seasons were larger than gap-filled values (e.g., Fig. 5b).

Annual net ecosystem productivity.—The larger CO<sub>2</sub> effluxes in the model vs. EC measurements (Fig. 5) caused annual GPP and ecosystem respiration,  $R_{eco}$ , in the model to exceed those calculated from gap-filled EC fluxes by  $\sim 15\%$  during 2002–2004 (Table 3) and those for humid tropical forests worldwide reported by Luyssaert et al. (2007). Similarly, litterfall and  $R_h$  were greater than those estimated from biometric measurements in the TNF by Rice et al. (2004) and Pyle et al. (2008). Modeled litterfall and  $R_h$  included sources not amenable to biometric measurements, such as root exudation and humus oxidation. Net primary productivity,  $R_{\rm h}$ , and soil respiration ( $R_{\rm soil}$ ) in the model were also larger than values calculated from biometric and flux chamber measurements for a central Amazonian rain forest reported by Chambers et al. (2004b) and for humid tropical forests worldwide reported by Luyssaert et al. (2007). Carbon use efficiency (CUE = NPP/GPP) in the model was 0.38, larger than one of 0.26 for tropical forests reported in Chambers et al. (2004*b*), but smaller than ones of 0.40–0.45 modeled by *ecosys* for temperate and boreal deciduous forests (Grant et al. 2006*a*, *b*). Soil and root respiration in the model were larger than measurements on root exclusion plots in the TNF by Silver et al. (2005).

Net ecosystem productivity in the model was close to that derived from gap-filled EC fluxes by Hutyra et al. (2007) during 2003, 2004, and 2005, as were the CO<sub>2</sub> fluxes from which NEP was derived (Table 2, Fig. 5). Modeled NEP appeared as net gains in aboveground living phytomass (from growth – mortality), offset by losses in standing dead phytomass and in soil organic carbon (SOC). Such an offset was also modeled by Chambers et al. (2004*a*) after accelerated mortality, as could be caused by an ENSO event. Net phytomass gains were slightly larger than those of  $\sim 60 \pm 40$  g  $C \cdot m^{-2} \cdot yr^{-1}$  derived from tree measurements by Phillips et al. (1998) and Baker et al. (2004) in other mature Amazonian rain forests. The NEP estimated from biometric measurements in the TNF by Rice et al.



FIG. 6. Three-day moving averages of daily evapotranspiration (ET) and net ecosystem productivity (NEP) modeled (lines) and measured by gap-filled eddy covariance (EC; symbols) at Santarém km 67 during 2003.

(2004) and Pyle et al. (2008) indicated a greater C source, attributed to past disturbances that caused CWD stocks to be larger than expected. However all model and EC values for NEP remained within 100 g  $C \cdot m^{-2} \cdot yr^{-1}$  of zero, indicating that this forest stand was likely neither a large sink nor a large source of C.

Centennial net ecosystem productivity.—Aboveground living phytomass in the model rose rapidly following the stand-replacing disturbance with which the model was initialized, attaining stable values of  $\sim 20 \text{ kg C/m}^2$ (Fig. 8a) while  $C_a$  rose from 275 µmol/mol in 1900 to 375 µmol/mol in 2005. The time course of phytomass growth was determined by mortality and herbivory rates during the model run, as was also shown by Moorcroft et al. (2001). Modeled phytomass was greater than the 14.74  $\pm$  0.59 and 14.8  $\pm$  0.33 kg  $C/m^2$  measured in the TNF during 2001 by Rice et al. (2004) and 2003 by Pyle et al. (2008), indicating that disturbance effects on forest productivity in the TNF may not have been fully represented by the annual mortality of 2% in the model based on Pyle et al. (2008). Stocks of standing dead wood and surface residue (much of it CWD) in the model each stabilized at  $\sim$ 5 kg C/m<sup>2</sup> after 100 years, greater than total CWD stocks measured in the TNF of 4.8  $\pm$  0.5 kg C/m<sup>2</sup> by Rice et al. (2004) during 2001 and 4.0  $\pm$  0.4 kg C/m<sup>2</sup> by Pyle et al. (2008) during 2003. The CWD stocks declined during 2003-2005 (Table 3) as the modeled forest recovered from more rapid mortality during the last ENSO event in 1998. The ratio of annual CWD litterfall (Table 3) to surface CWD stocks indicated a surface litter turnover in the model of  $0.12 \text{ yr}^{-1}$ , which is in the mid-range of values for CWD of differing densities given in Rice et al. (2004). Fine root mass in the model (from functional equilibrium of  $\sigma_{\rm C}$ ,  $\sigma_{\rm N}$ , and  $\sigma_P$  exchange between roots and branches described under Nutrient uptake and translocation above) varied seasonally from 0.40 to 0.45 kg  $C/m^2$ . These root masses were similar to ones of 0.37-0.39 kg C/m<sup>2</sup> measured to a depth of 6 m in the eastern Amazon by Trumbore et al. (2006), although only 0.17 kg  $C/m^2$  of the measured values was considered to be living.

During the first 10 years after stand-replacing disturbance, modeled NEP remained negative (net C source) while litterfall from regenerating phytomass failed to replenish post-disturbance litter stocks declin-



FIG. 7. Three-day moving averages of daily evapotranspiration (ET) and net ecosystem productivity (NEP) modeled (lines) and measured by gap-filled eddy covariance (EC; symbols) at Santarém km 67 during 2004.

ing with  $R_{\rm h}$  (Fig. 8b). This  $R_{\rm h}$  drove initial immobilization and later remineralization of litter P that respectively slowed and later hastened root P uptake, which lowered and then raised foliar P content, CO<sub>2</sub> fixation, and tree growth. Modeled NEP reached maximum values of ~450 g  $C \cdot m^{-2} \cdot yr^{-1}$ , similar to one of 590  $C \cdot m^{-2} \cdot yr^{-1}$  measured in the central Amazon by Malhi et al. (1998), during rapid tree growth between 10 and 30 years after disturbance. Net ecosystem productivity declined thereafter because rising litterfall from living and dying trees increased litter stocks and hence  $R_{\rm h}$ . This post-disturbance sequence of rising and falling NEP corresponds to that modeled in N-limited temperate (Grant et al. 2007b) and boreal (Grant et al. 2006a, 2007a) forests, but on a contracted timescale because higher temperatures at the TNF hastened organic C, N, and P transformations.

Litterfall modeled in the TNF was accelerated by more rapid mortality (6%) imposed during ENSO years in the model, which hastened transfers from living phytomass to standing dead phytomass and surface residue (Fig. 8a). These transfers raised  $R_h$  and thereby lowered NEP for one to two years after each ENSO event (Fig. 8b), after which NEP rose as CWD stocks declined. Successive ENSO events therefore resulted in NEP cycles, the amplitude and duration of which depended on the intensity and frequency of mortality imposed on the model during these events.

## DISCUSSION

## Modeled vs. measured CO<sub>2</sub> fluxes

The model explained >80% of the variation in >8000 CO<sub>2</sub> fluxes measured by EC over the rain forest at Santarém km 67 during 2003 and 2004 (Table 2). The variation in EC fluxes not explained by the model (15–18%) could be partly attributed to random errors in CO<sub>2</sub> flux measurements estimated by Wesely and Hart (1985) to be ~20%. However, a systematic divergence occurred when modeled CO<sub>2</sub> effluxes exceeded measured and gap-filled values (Fig. 5b), as has been found in other model tests against EC measurements (Grant et al. 2006*a*, *b*).

Table 3.	Annual carbon	budgets (g $C/m^2$ )	at km 67 c	of the Tapajó	s National	Forest (TNF	) in Pará,	Brazil,	modeled	by e	cosys
during 2	2003–2005 and e	estimated from ed	dy covarian	ice (EC) and	biometric n	neasurements	(B).				

	2003		2004		2005		Measured	
Budget item	ecosys	EC	ecosys	EC	ecosys	EC	В	
GPP	3634	3171†	3769	3195†	3751	3206†	$3551 \pm 160 \ddagger 3000 \$$	
R <sub>a</sub> Shoot Root	1776 461		1847 470		1824 465		1550§ 264–380¶	
Total	2237		2317		2289		$2323 \pm 144$	
NPP							21009	
Shoot	979		1093		1061		$693 \pm 82 \$ $528 \pm 61 \ddagger 640 \$$	
Root	417		339		401		$ \begin{array}{r} 115 \pm 18 \\ 77 \pm 14 \\ 260 \\ \end{array} $	
Total	1397		1452		1462		$324 \pm 56^+_{\pm}$ $864 \pm 96^+_{\pm}$ $900^{\circ}_{\circ}$	
Litter Shoot, fine	567		578		563		$240 \pm 50$	
Shoot, coarse	507		504		496		$290 \pm 26^{\dagger}^{\dagger}_{230-475^{\dagger}^{\dagger}_{23}}$	
Root, fine	43		60		56		37-79	
Root, exudates	354		317		341		78§§	
Total Change in aboveground C	1471		1459		1456			
Living	+18		+121		+101		$+140 \pm 62  $ +77 $\pm 28^{\dagger}^{\dagger}_{\dagger}$ -80 $\pm 150^{\circ}_{\circ}$	
Dead	-113		-109		-98		00 = 100	
Change in root C	+20		-17		+4			
R <sub>h</sub>	1495		1421		1485		$570 \pm 100   $ $492 \pm 43^{\dagger}^{\dagger}$ $877 \pm 96^{\dagger}$ $850^{\circ}_{\circ}$ $705 \pm 96^{\circ}_{\circ}$	
R <sub>soil</sub>	1956		1891		1950		$1084 \pm 50 \ 12108$	
R <sub>eco</sub>	3732	3262†	3738	3173†	3774	3245†	$3061 \pm 162 \ddagger 2950 \$$	
Change in soil organic C	-27		$+31_{5}$		-38		$0 \pm 50 \# \#$	
NEP	-98	−91 ± 49†	+31	+22 ± 45†	-23	-35 ± 45†	$ \begin{array}{r} -190 \pm 100 \\ -132 \pm 49 \\ \dagger \\ 403 \pm 102 \\ \vdots \\ \end{array} $	

*Note:* Abbreviations are: GPP, gross primary productivity;  $R_a$ , autotrophic respiration; NPP, net primary productivity;  $R_h$ , heterotrophic respiration;  $R_{soil}$ , soil respiration;  $R_{coo}$ , ecosystem respiration; NEP, net ecosystem productivity.

<sup>†</sup> From gap-filled EC measurements as described in Hutyra et al. (2008).

<sup>4</sup> Mean values estimated from EC and biometric measurements at 29 humid tropical forest sites by Luyssaert et al. (2007). § For central Amazonian forests from Chambers et al. (200*b*).

¶ Measured in the TNF during 2000 and 2001 by Silver et al. (2005). Net primary productivity and litter were measured to a depth of 0.1 m.

# Modeled values for shoot coarse litterfall are from standing dead wood.

|| Aboveground C (= annual growth + recruitment – mortality) and  $R_h$  (= respiration by surface coarse woody debris [CWD]) were calculated in the TNF between 1999 and 2001 from Rice et al. (2004).

†† As footnote ||, except from Pyle et al. (2008).

‡‡ Measured in the TNF by Nepstad et al. (2002).

§§ Calculated to a depth of 6 m in eastern Amazonia by Trumbore et al. (2006).
¶¶ From changes in aboveground living phytomass in the TNF between 1984 and 2000 in Miller et al. (2004).

## For eastern Amazonian forests from Trumbore et al. (1995).

|||| Dissolved inorganic and organic C exported in runoff and drainage water. Measured value from catchment in central Amazon by Waterloo et al. (2006).



FIG. 8. (a) Aboveground phytomass, standing dead phytomass, and surface residue, and (b) net ecosystem productivity (NEP) modeled during 105 years after a hypothesized stand-replacing disturbance in 1900. Vertical lines indicate El Niño Southern Oscillation (ENSO) event years during which mortality rates in the model were increased.

Some of this excess may be attributed to lower EC effluxes caused by  $CO_2$  loss under stable boundary layers (friction velocity  $u^* < 0.22$  m/s) that formed frequently during nights with low wind speeds in the TNF (Miller et al. 2004, Hutyra et al. 2008). Modeled  $CO_2$  effluxes did not systematically diverge from EC values recorded under more turbulent conditions ( $u^*$  0.3–0.8 m/s; e.g., measured EC effluxes in Fig. 5).

In the model, CO<sub>2</sub> effluxes were driven by  $R_a$  of CO<sub>2</sub> fixation products  $\sigma_C$  at hourly to daily timescales (Appendix C: Eqs. C.15, C.16) and by  $R_h$  of plant litterfall derived from growth products of  $\sigma_C$  at seasonal to interannual timescales (Appendix A: Eq. A.12). Model coefficients used to calculate  $R_a$  and  $R_h$  were well constrained from basic research in plant and microbial biochemistry (e.g., Waring and Running 1998). Therefore CO<sub>2</sub> effluxes in the model were not independent of CO<sub>2</sub> influxes, but rather were dependent upon these influxes over a range of timescales. Consequently, rises in modeled influxes were followed by rises in modeled and EC influxes rose with radiation and temperature (e.g., Fig. 5b vs. 5a). However, gap-filled

effluxes, which are calculated independently of EC influxes, declined during the dry seasons so that gap-filled daily NEP rose above modeled values (Figs. 6b and 7b). Future gap-filling protocol for  $CO_2$  effluxes should perhaps consider preceding  $CO_2$  influxes.

## Seasonal effects on energy and CO<sub>2</sub> exchange

There have been several reports that evapotranspiration in Amazonian forests is sustained through the dry season from recovery of water more than 2 m below the soil surface by deep-rooted trees (e.g., Nepstad et al. 1994, da Rocha et al. 2004). Evapotranspiration exceeded precipitation by 190–245 mm during each of the 2002–2005 dry seasons. Given the limited waterholding capacity estimated for this clay-rich soil (0.06–  $0.10 \text{ m}^3/\text{m}^3$  estimated from soil properties in Table 1), uptake to 4–8 m would be necessary during dry seasons to meet precipitation deficits while avoiding plant water stress by depleting less than half of plant available water.

In the model, root length densities used to calculate water uptake in each soil layer were not prescribed, but arose from root growth using the nonstructural products of  $CO_2$  fixation and nutrient uptake. These densities declined with distance from sources of  $\sigma_{C}$  in leaves and  $O_2$  in the atmosphere and rose with access to water and nutrients in the soil (Grant 1998). Large belowground transfers of  $\sigma_{\rm C}$  allowed the root model to maintain sufficient root density for water uptake to depths of 8 m or more during the dry seasons (Fig. 3). This deep rooting enabled peak LE effluxes and CO2 influxes of greater than 400 W/m<sup>2</sup> and 20  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup> to be sustained during the entire dry season in the model as was found in EC measurements (Figs. 4 and 5). Seasonality of precipitation therefore had little direct effect on energy and CO<sub>2</sub> exchange, but rather an indirect effect through radiation and temperature (Figs. 6 and 7). However, direct effects of precipitation would be more apparent in the model at sites where deep rooting could not occur, due to inadequate O2 or water in the soil profile (e.g., compacted, rocky, dry, shallow, or poorly or excessively drained soil) or due to inadequate fixed C to drive root growth caused by disturbances of surface vegetation (e.g., mortality, herbivory, tillage) as in Grant and Flanagan (2007). Spatial ag-

gregation of seasonal effects on  $CO_2$  and energy exchange therefore requires that spatial distributions of key soil profile attributes (e.g., Table 1) and surface disturbances be known or estimated.

## Disturbance effects on forest productivity

The ecosys model provided a more comprehensive, detailed, and internally consistent estimate of C transformations in this rain forest ecosystem than was possible through EC or biometric measurements alone (Table 3). Both modeled and gap-filled EC fluxes indicated that old-growth stands in the TNF may change between source and sink in different years, but would remain within 100 g  $C \cdot m^{-2} \cdot vr^{-1}$  of C neutrality in the absence of major disturbance (Table 3, Fig. 8b). Both modeled and biometrically measured changes in ecosystem C stocks (Table 3) indicated that disturbance could cause old-growth stands to become C sources for some time after disturbance. Saleska et al. (2003) attributed the negative NEP found at Santarém km 67 to a recent episode of rapid mortality, possibly caused by drought associated with an earlier ENSO event. Disturbances such as ENSO events also caused marked reductions in NEP of old-growth forests in the model (Fig. 8a, b). Neither modeled, EC, nor biometric estimates suggest that old-growth stands in the TNF were substantial C sinks.

Long-term model results indicated that forest stands may be substantial C sinks, as found by Malhi et al. (1998), during phytomass regeneration for up to 60 years after stand-replacing disturbances (Fig. 8a, b). The time course of regeneration and rising NEP in the model was affected by the size of CWD stocks left after disturbance (Grant et al. 2007*b*; 10 kg C/m<sup>2</sup> standing, 5 kg C/m<sup>2</sup> surface in this study) which determined the subsequent time course of nutrient immobilization and remineralization during forest regeneration. Modeled NEP eventually declined with nutrient immobilization, approaching C neutrality approximately 70 years after stand replacement. If *ecosys* were used in a regional study of C exchange, a mosaic of stands would be modeled at different stages of the regeneration cycle represented in Fig. 8, depending upon regional disturbance history. A few recently disturbed sites would rapidly emit C, some regenerating sites would rapidly absorb C, and most older sites would slowly emit or absorb C. Depending on the relative contributions of these different sites, the NEP of such a mosaic might be consistent with regional NEP inferred from atmospheric inversion studies that indicated a maximum sink of 150 g  $C \cdot m^{-2} \cdot yr^{-1}$  for the central Amazon (Friend et al. 2007).

The time courses of phytomass growth and of NEP were strongly affected by annual mortality and herbivory rates derived from site studies and imposed on the model. Further progress in modeling NEP of Amazonian rain forests will require more detailed estimates of mortality and other disturbances during forest growth cycles under changing weather, as well as a biological basis for modeling mortality and disturbance, perhaps based on depletion of nonstructural C and nutrient reserves caused by high temperatures, water deficits, or herbivory.

## Nutrient effects on forest productivity

The productivity of Amazonian rain forests growing on oxisols has been suggested to be limited by available P (Vitousek and Sanford 1986), as apparent from large C:P ratios found in foliage, roots, and litter in the TNF (Silver et al. 2000). Models used to examine ecological controls on Amazonian forest productivity therefore need to be capable of simulating P limitation and the chemical and biological transformations by which it is caused. Further measurements of soil and plant P stocks and transformations need to accompany those of C during forest life cycles in order to constrain modeling of P constraints on forest productivity.

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## APPENDIX A

Key governing equations for simulating net ecosystem productivity in *ecosys*: heterotrophic respiration (*Ecological Archives* M079-016-A1).

## **APPENDIX B**

Key governing equations for simulating net ecosystem productivity in *ecosys*: plant water relations (*Ecological Archives* M079-016-A2).

#### APPENDIX C

Key governing equations for simulating net ecosystem productivity in *ecosys*: gross primary productivity and autotrophic respiration (*Ecological Archives* M079-016-A3).