# Influences of vegetation structure and elevation on CO<sub>2</sub> uptake in a mature jack pine forest in Saskatchewan, Canada

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**Abstract:** Carbon dioxide, water vapour, and energy fluxes vary spatially and temporally within forested environments. However, it is not clear to what extent they vary as a result of variability in the spatial distribution of biomass and elevation. The following study presents a new methodology for extracting changes in the structural characteristics of vegetation and elevation within footprint areas, for direct comparison with eddy covariance (EC) CO<sub>2</sub> flux concentrations. The purpose was to determine whether within-site canopy structure and local elevation influenced CO<sub>2</sub> fluxes in a mature jack pine (*Pinus banksiana* Lamb.) forest located in Saskatchewan, Canada. Airborne light detection and ranging (lidar) was used to extract tree height, canopy depth, foliage cover, and elevation within 30 min flux footprints. Within-footprint mean structural components and elevation were related to 30 min mean net ecosystem productivity (NEP) and gross ecosystem production (GEP). NEP and GEP were modeled using multiple regression, and when compared with measured fluxes, almost all periods showed improvements in the prediction of flux concentration when canopy structure and elevation were included. Increased biomass was related to increased NEP and GEP in June and August when the ecosystem was not limited by soil moisture. On a daily basis, fractional cover and elevation had varying but significant influences on CO<sub>2</sub> fluxes.

**Résumé :** Le dioxyde de carbone, la vapeur d'eau et les flux d'énergie varient dans l'espace et le temps dans les environnements forestiers. Cependant, nous ne savons pas dans quelle mesure ils varient en fonction de la variation des gradients de biomasse et d'altitude. Cette étude présente une nouvelle méthode pour extraire les caractéristiques de la structure de la végétation et les changements d'altitude à partir d'empreintes pour établir des comparaisons directes avec des concentrations de flux de CO<sub>2</sub> calculées par la méthode de covariance des turbulences. Le but de l'étude était de déterminer si la structure de la canopée à l'intérieur d'une station et l'altitude locale influencent les flux de CO<sub>2</sub> dans une forêt mature de pin gris située en Saskatchewan, au Canada. Un lidar aéroporté a été utilisé pour estimer la hauteur des arbres, la profondeur de la canopée, la couverture foliacée et l'altitude dans des empreintes de flux de 30 minutes. Les composantes structurales moyennes et l'altitude issues de ces empreintes ont été reliées aux valeurs moyennes sur des périodes de 30 minutes de la productivité nette de l'écosystème (PNE) et de la production brute de l'écosystème (PBE). La PNE et la PBE ont été modélisées à l'aide d'une régression multiple et, lorsqu'elles on été comparées aux flux mesurés, la prévision des concentrations de flux a été améliorée pour presque toutes les périodes quand la structure de la canopée et l'altitude étaient incluses dans le modèle. L'augmentation de la biomasse était reliée à des augmentations de PNE et de PBE en juin et en août lorsque la teneur en eau du sol ne limitait pas le fonctionnement de l'écosystème. Sur une base journalière, la proportion de couverture et l'altitude avaient une influence variable, mais significative, sur les flux de CO<sub>2</sub>.

[Traduit par la Rédaction]

# Introduction

The eddy covariance (EC) method is commonly used to measure the direction and movement of energy and trace gas (e.g., water, CO<sub>2</sub>) concentrations throughout ecosystems (Baldocchi 2008). Networks of EC systems have been set up at local, biome, continental, and global scales based loosely on the idea that individual nodes are representative of larger

ecosystems. Data from these networks are then sometimes combined with remote sensing data and ecosystem models to determine spatial and temporal variability of  $CO_2$  exchanges within areas that have undergone some prior disturbance (e.g., land management, extreme weather, insect infestation, fire, etc.), and within different stand ages, species types, and in areas of complex terrain (e.g., Heinsch et al. 2006).

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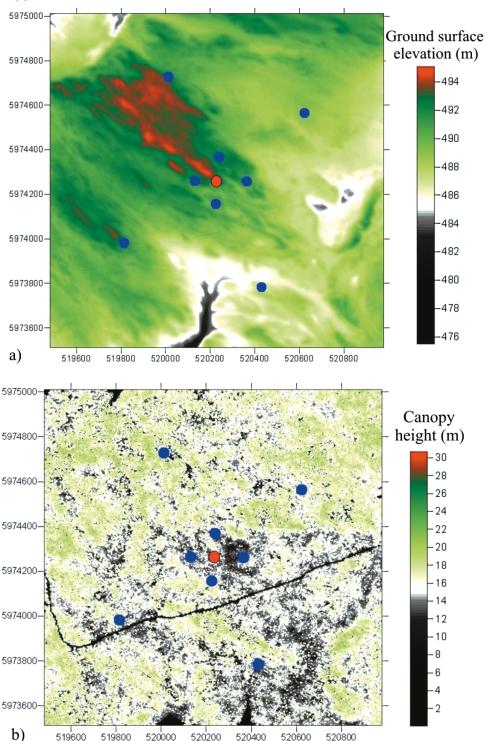
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**Fig. 1.** (*a*) Lidar measured ground surface elevation within 750 m of the flux station with removal of understory and canopy vegetation. (*b*) Lidar measured canopy heights within 750 m of the flux station after removal of topographical influences. Blue circles represent the location of 11.3 m radius measurement plots, and the red circle represents the location of the eddy covariance flux tower (centre). Laser returns have been rasterized to produce a continuous surface digital elevation model (*a*) of the ground returns and a canopy height model of the maximum *z* returns (*b*).



Spatial heterogeneity in canopy structure and elevation may be an important consideration when measuring  $CO_2$  and water fluxes, especially if wind directions do not vary. If the ecosystem is homogeneous, apart from meteorological

influences on the variability of flux, the location of the flux origin should not be important because it would not matter where the winds were originating from. There would be little variability in flux concentration as a result of ecosystem

| Plot<br>No. | UTM northing (zone 13) (m) | UTM easting (m) | Elevation (m) | DBH*<br>(cm) | Tree height (m) | Canopy<br>depth (m) <sup>†</sup> | $LAIe^{\ddagger} (m^2 \cdot m^{-2})$ | Stem<br>density (m <sup>-1</sup> ) | Alder density (m <sup>-1</sup> ) |
|-------------|----------------------------|-----------------|---------------|--------------|-----------------|----------------------------------|--------------------------------------|------------------------------------|----------------------------------|
| 1           | 520238.8                   | 5974368.1       | 494.3         | 15.9         | 15.0            | 6.3                              | 1.50                                 | 0.12                               | 0.03                             |
| 2           | 520224.5                   | 5974155.5       | 495.1         | 14.6         | 13.6            | 6.1                              | 1.45                                 | 0.08                               | 0                                |
| 3           | 520130.9                   | 5974261.7       | 494.1         | 11.7         | 13.0            | 5.9                              | 1.49                                 | 0.17                               | 0                                |
| 4           | 520365.4                   | 5974259.0       | 492.5         | 12.9         | 13.3            | 5.2                              | 1.55                                 | 0.15                               | 0                                |
| 5           | 520623.3                   | 5974564.0       | 489.5         | 17.5         | 15.7            | 8.8                              | 1.82                                 | 0.09                               | 0.03                             |
| 6           | 519813.4                   | 5973981.9       | 491.9         | 16.1         | 14.9            | 8.1                              | 1.52                                 | 0.10                               | 0.02                             |
| 7           | 520430.5                   | 5973784.2       | 487.0         | 11.8         | 11.4            | 6.2                              | 1.21                                 | 0.14                               | 0                                |
| 8           | 520012.7                   | 5974728.1       | 492.4         | 23.6         | 16.4            | 11.2                             | 1.49                                 | 0.04                               | 0.47                             |

Table 1. Mean structural vegetation characteristics measured at eight plots surrounding the flux measurement station at the jack pine site.

\*DBH, diameter at breast height.

<sup>†</sup>Canopy depth = canopy height – canopy base height.

<sup>‡</sup>LAIe, effective leaf area index.

heterogeneity surrounding the EC. However, if the ecosystem is spatially variable, then flux concentrations may vary depending on spatial location and the dominant direction of the winds (Rahman et al. 2001; Chen et al. 2008). In many ecosystems, spatial variations in the availability of soil nutrients and moisture are manifested in the variability of aboveground biomass and exchanges measured by EC (Baldocchi and Meyers 1998; Griffis et al. 2003). If differences in the amount of CO<sub>2</sub> sequestration can be found among ecosystems, then is it true that variations in the amount of biomass may also affect CO<sub>2</sub> and water exchanges within a single ecosystem.

Few studies have directly examined the influence of structural and elevation heterogeneity on fluxes within a single ecosystem (Kim et al. 2006; Chen et al. 2008). Until recently, measuring three-dimensional vegetation structure and ground surface elevation at high resolutions has been difficult. Airborne light detection and ranging (lidar) is an active remote sensing technology that is used to measure canopy structure and ground surface elevation at high resolution. A footprint model may then be used to discretize the variability in canopy structure and elevation at a particular place and time, which can then be correlated with trace gas exchanges measured by EC. The footprint model determines the probability that fluxes originated from a particular place within the ecosystem based on measured atmospheric turbulence (e.g., Foken and Leclerc 2004; Vesala et al. 2008). Each footprint therefore contains the extent in x and y coordinates of the source-sink area and a probability (probability density function (PDF)) that the CO<sub>2</sub> source-sink at x-y will be measured at the sensor.

In this study, vegetation structure and elevation were characterized using lidar within the contours of half-hourly flux footprint areas (approximately 80% of the probability of flux) from Kljun et al. (2004). The objective was to quantify the influences of vegetation structure and elevation on  $CO_2$  concentrations measured by EC, specifically net ecosystem production (NEP) and gross ecosystem production (GEP). Three growing season periods were examined in 2002 at a mature jack pine (*Pinus banksiana* Lamb.) site in Saskatchewan, Canada.

## Methods

#### Study area and site characteristics

The study area consists of a  $\approx$  90-year-old mature jack

pine (OJP) forest (Baldocchi et al. 1997) located near the southern edge of the boreal forest (UTM coordinates: 520230 easting, 5974262 northing), Saskatchewan, Canada. The ground elevation varies between 482 and 494 m throughout the 1000 m radius surrounding the EC flux measurement tower, and tree heights vary by up to 6 m (Figs. 1a and b). The understory is composed of lichens (*Cladina* spp.), bearberry (*Arctostaphylos uva-ursi* L.), cranberry (*Vaccinium vitisideae* L.), and sparse groupings of alder (*Alnus crispa* Ait.). Soils within the site are coarse and well-drained sand with low nitrogen content (Baldocchi et al. 1997). Measurements of forest structure (e.g., canopy height) within eight geolocated forest mensuration plots were used to validate lidar canopy structural attributes within the ecosystem (Table 1).

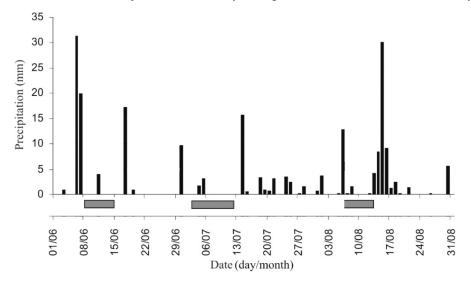
#### **Canopy structure measurements**

Mensuration data (Table 1) were collected over two periods, 9 to 16 May and 25 July to 15 August 2005. Plot locations were selected for spatial representation according to compass cardinal directions at distances of 100 m (May field campaign) and 500 m (July-August field campaign) from the flux measurement station. Each plot has a radius of 11.3 m and follows Fluxnet-Canada protocols for measurements (Fluxnet-Canada 2003). Plot location, tree height, base of live crown height, diameter at breast height (DBH), gap fraction, and effective LAI (LAIe) were measured at each plot. Alder were also counted and measured for height and crown diameter in each cardinal direction. Plot centres were located using survey-grade, differentially corrected global positioning system (GPS) receivers (Leica SR530, Leica Geosystems Inc., Switzerland; Ashtec Locus, Ashtec Inc., Hicksville, New York) with the same base station coordinate as was used for the lidar survey. Geolocation accuracies varied from 1 cm to 1 m, depending on the density of the canopy cover at time of GPS data collection. Plots were geolocated so that lidar data could be directly compared with plot means and individual-tree measurements.

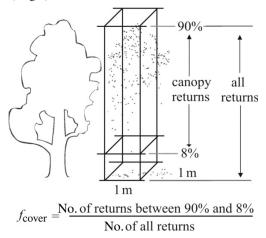
Canopy gap fraction was determined from digital hemispherical photography (DHP) at five locations within each plot (north, south, east, west, and centre), at distances of 11.3 m apart. All photographs were taken during diffuse daytime conditions, or 30 min before dawn or after dusk to reduce the influence of sun brightness and apparent leaf reduction within the photograph (Zhang et al. 2005). Photo-

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Fig. 2. Precipitation (millimetres) recorded at the mature jack pine study site during the 2002 growing season; 2002 was the second of two consecutive drought years in western Canada (Kljun et al. 2006). Grey rectangles mark the duration of the three study periods.



**Fig. 3.** A schematic diagram of the distribution of laser returns within a tree and the methods used to differentiate canopy height (90th percentile), canopy base height (8th percentile), canopy depth (canopy height – canopy base height), and  $f_{cover}$  within a 1 m × 1 m × z (height) column.



graphs were exposed to two f-stops below automatic exposure (normally set between one and four exposure settings and with larger aperture) (Chen et al. 2006). Each individual photograph was processed following sky and vegetation thresholding methods of Leblanc et al. (2005) to obtain estimates of gap fraction and fractional cover (one-gap fraction). DHP version 1.6.1 software was used to process all photographs (S. Leblanc, Canada Centre for Remote Sensing provided to the Fluxnet-Canada Research Network).

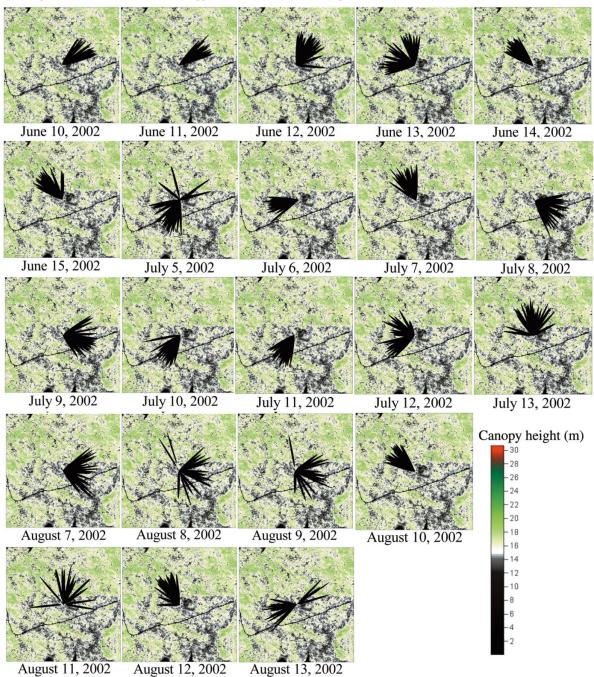
LAIe estimates obtained with mean DHP measurements were 14% and 10% lower than estimates obtained by Chen et al. (2006) at the same site with TRAC and LiCOR LAI-2000 transect methods, respectively. This variability in LAIe estimates was likely due to ecosystem heterogeneity within the study site and to technological differences between the optical methods of Chen et al. (2006) and the DHP method. Although our LAIe estimates differ from those of Chen et al. (2006), they provide reasonably close approximation of LAIe and, more importantly, are indicative of relative differences in canopy fractional cover using lidar.

#### **Flux measurements**

Meteorological, CO<sub>2</sub>, and H<sub>2</sub>O flux measurements at OJP have been collected for 30 min periods each day since 1999 (Griffis et al. 2003; Barr et al. 2006) and in 1994 during the Boreal Ecosystem-Atmosphere Study (BOREAS) (Middleton et al. 1997; Goetz et al. 1999). Three periods of five, nine, and seven days of flux and meteorological data were examined during the 2002 growing season when EC data were available. The selected periods occurred from 10 to 15 June (P1), 5 to 13 July (P2), and 7 to 13 August (P3) (see Fig. 2). These periods (and numbers of days) were chosen (1) to coincide with dry periods during which little to no rainfall occurred; and (2) so that the influence of three different soil moisture regimes could be examined. Mean tree height growth since BOREAS (1994 to 1996) measured in the field was approximately 1 m over an 11-year period (1994-2005) (Gower et al. 1997). Differences in canopy height between summer 2002 (flux measurements) and summer 2005 (field campaigns and lidar data collection) varied by less than 30 cm and were within the range of error of the lidar system.

Meteorological and flux measurements made at OJP are described in detail in Barr et al. (2006) and Kljun et al. (2006). Briefly, above-canopy CO<sub>2</sub> fluxes were measured approximately 28 m above the ground surface using the EC method at 20 Hz and aggregated over 30 min periods. A sonic anemometer (CSAT3, Campbell Scientific Inc., Edmonton, Alberta) and closed-path infrared gas analyzer (LI-6262, LI-COR Biosciences Inc., Lincoln, Nebraska) were used to measure friction velocity and atmospheric CO<sub>2</sub>. Net ecosystem exchange (NEE) (micromoles per square metre per second) was measured by EC, where –NEE was equal to positive NEP (micromoles per square metre per second). A positive NEP indicates that greater amounts of CO<sub>2</sub> were used in photosynthesis than were released via ecosystem res-

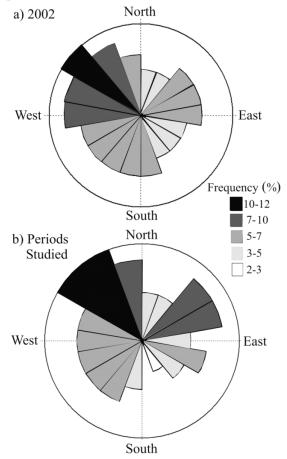
**Fig. 4.** Daily 30 min footprint extent (80% contour lines) and wind direction for the three periods of study are overlaid onto the canopy height models for the mature jack pine study site (shown in Fig. 1*b*) to illustrate variability in canopy height and associated footprint locations for daytime periods (0900 to 1700 hours) (approximately 17 half-hourly periods or 8.5 h/day).



piration ( $R_e$ ). Daytime  $R_e$  (micromoles per square metre per second) was modeled from the relationship between nighttime  $R_e$  and soil temperature (Barr et al. 2006). GEP (micromoles per square metre per second), defined as the uptake of  $CO_2$  by the ecosystem through photosynthesis, was estimated from measured NEP and modeled  $R_e$ , where GEP = NEP +  $R_e$ . A friction velocity threshold greater than 0.35 m·s<sup>-1</sup> was used to filter out periods when wind speeds were too low for accurate estimates of flux concentration.

Uncertainties in measuring CO2 fluxes occur because dur-

ing calm and stable conditions the transfer of  $CO_2$  by nonturbulent exchanges are not detected by the EC system (Massman and Lee 2002; Griffis et al. 2003). EC measurements obtained in early morning (before 0900 local sidereal time (LST)) and late afternoon (after 1700 LST) were not used to determined the relationship between  $CO_2$  fluxes and canopy structure and site elevation because of the difficulty of measuring  $CO_2$  storage in the air column below the EC sensors at those periods of the day (Yang et al. 1999). Nighttime fluxes were also excluded because during often **Fig. 5.** Wind roses of the percent frequency of wind directions at the mature jack pine study site during the year 2002 (a) and for the three periods studied (b).



**Table 2.** Mean canopy structure characteristics and elevation surrounding the EC sensor for each wind-direction quadrant.

| Wind-direction quadrants | Frequency<br>of wind<br>origin (%)* | Mean tree<br>height<br>(m) | Mean<br>f <sub>cover</sub> | Mean<br>elevation<br>(m) |
|--------------------------|-------------------------------------|----------------------------|----------------------------|--------------------------|
| Northwest                | 45                                  | 16.4                       | 0.74                       | 495                      |
| Southwest                | 20                                  | 14.9                       | 0.55                       | 491                      |
| Northeast                | 18                                  | 15.2                       | 0.67                       | 490                      |
| Southeast                | 17                                  | 11.6                       | 0.43                       | 487                      |
| Site mean                | —                                   | 14.8                       | 0.63                       | 491                      |

**Note:** Source of flux areas may be influenced differently depending on wind direction, canopy structure, and elevation.

\*Mean values for the three periods studied.

stable nocturnal conditions the footprint source area sometimes extended beyond the lidar data set. Other issues associated with the accuracy of EC measurements include flux concentration loss due to (1) instrument setup limitations, (2) assumption of near-neutral atmospheric stability; (3) inability to consider the full complexity of EC equations; and (4) two-dimensional and thee-dimensional terrain influences (Massman and Lee 2002). The mean 24 h energy balance closure for each day and each period was determined using the energy balance ratio method (e.g., Wilson et al. 2002). Mean energy balance closure was  $\sim 88\%$  for P1 (standard deviation (SD) =  $\sim 10\%$ ),  $\sim 83\%$  for P2 (SD =  $\sim 8\%$ ), and  $\sim 85\%$  for P3 (SD =  $\sim 14\%$ ), calculated from net radiation ( $R_n$ ), latent heat flux (Le), sensible heat flux (H), and soil heat flux (G). Barr et al. (2006) suggest that an energy balance correction may be applied to CO<sub>2</sub> fluxes so that they are increased relative to the percentage that is underestimated when unable to close the energy balance. This assumes that underestimated energy fluxes are representative of underestimated CO<sub>2</sub> fluxes. Based on this assumption, CO<sub>2</sub> fluxes have been corrected for underestimated energy fluxes and an inability to close the energy balance at OJP and other mature forest sites operated by Fluxnet-Canada (Canadian Carbon Program) at the Boreal Ecosystem Research and Monitoring Sites (BERMS).

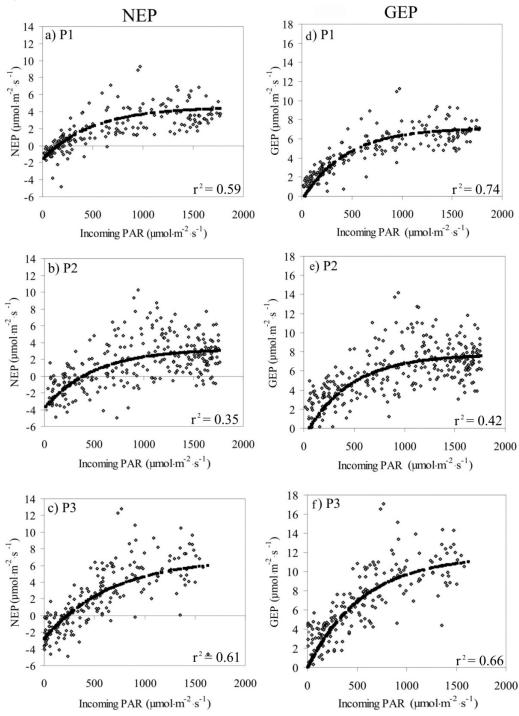
Meteorological variables were also examined to determine the influence of meteorology on flux exchanges prior to examining canopy structure and elevation effects. Measurements included above canopy incoming photosynthetically active radiation (PAR, micromoles per square metre per second), relative humidity (RH, percentage), and air temperature (T<sub>air</sub>, degrees Celsius) (model HMP45C, Vaisala by Campbell Scientific Inc., Edmonton Alberta); soil temperature (T<sub>soil</sub>, degrees Celsius) (CS107b, Campbell Scientific Inc., Edmonton, Alberta); and volumetric soil moisture ( $\theta$ , cubic metres per cubic metre) (CS615, Campbell Scientific Inc., Edmonton, Alberta). Above-canopy incoming and reflected PAR and below-canopy incoming PAR were measured using LI-COR model LI190 (LI-COR Biosciences, Nebraska).  $\theta$  was measured at depths of 30 to 60 cm, and  $T_{\rm soil}$  was measured at depths of 10 cm. RH and  $T_{\rm air}$  were measured above the canopy at a height of 16 m.

#### Lidar data collection and processing

Lidar data were obtained at OJP on 12 August 2005 (Fig. 1) using a scanning discrete pulse return system (ALTM3100, Optech Inc., North York, Ontario). The ALTM3100 is owned and operated by the Applied Geomatics Research Group, Nova Scotia. Up to four laser pulse reflections or "returns" were obtained per laser pulse emitted, at a rate of 71 kHz and at a flying height of 950 m above ground level (a.g.l.). The scan angle was set at  $\pm 19^{\circ}$  with 50% overlap of adjacent flight lines. This enabled penetration of laser pulses through to the base of the canopy, while also obtaining returns on all sides of individual trees (Chasmer et al. 2006). Crosstrack and down-track resolutions, with 50% overlap of scans, were 35 cm ("post spacing", the distance between returns).

Percentile distributions were used to approximate mean tree heights, base of live crown height, and canopy depth (e.g., Lim and Treitz 2004; Chasmer et al. 2006) within footprint PDF contour lines. Height and live canopy base height percentile distributions were calculated on individual returns greater than or equal to 1.3 m above the ground surface so that returns from the ground surface would not influence and shift the percentiles downwards. Percentile distributions were also compared with plot measurements to determine the most accurate and descriptive percentiles to adopt. The 90th and 8th percentiles were most appropriate for determining mean tree height and base of live crown height at the plot level. The resulting values underestimated

**Fig. 6.** Relationships between net ecosystem productivity (NEP) (*a*, *b*, and *c*) and gross ecosystem productivity (GEP) (*d*, *e*, and *f*), and photosynthetically active radiation (PAR) represented by Landsberg light response curves at the mature jack pine study site during the three periods of study: 10–15 June 2002 (*a* and *d*), 5–13 July 2002 (*b* and *e*), and 7–13 August 2002 (*c* and *f*). Relationships are shown for entire days when incoming PAR exceeded 0.1  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup>.



canopy heights by up to 0.94 m and overestimated the base of the live crown heights by up to 0.77 m when compared with plot-level means. Canopy fractional cover ( $f_{cover}$ ) (where 1 = full canopy cover and 0 = no canopy cover) was determined from laser returns based on the ratio of the number of canopy returns to the number of canopy and ground returns:

[1] 
$$f_{\text{cover}} = \frac{\sum P_{\text{canopy}}}{\sum P_{\text{all}}}$$

where  $P_{\text{canopy}}$  is the total frequency of laser pulse returns within the canopy ( $\geq 1.3 \text{ m a.g.l.}$ ), and  $P_{\text{all}}$  is the total frequency of all laser pulse returns from the canopy and ground surface within each 1 m × 1 m × 30 m column. A

| Periods | NEP $P_{\text{max}}$<br>( $\mu$ mol·m <sup>-2</sup> ·s <sup>-1</sup> ) | GEP $P_{\text{max}}$<br>( $\mu$ mol·m <sup>-2</sup> ·s <sup>-1</sup> ) | Mean $\theta$<br>(m <sup>3</sup> ·m <sup>-3</sup> ) | Mean $T_{air}$ (°C) | Mean $T_{soil}$ (°C) | Mean<br>VPD (Pa) | Mean incoming<br>PAR (µmol·m <sup>-2</sup> ·s <sup>-1</sup> ) |
|---------|--|--|---|---------------------|----------------------|------------------|---|
| P1      | 4.5  | 7.1  | 0.82  | 16.8                | 9.2                  | 132              | 767   |
| P2      | 3.2  | 7.7  | 0.54  | 23.7                | 14.4                 | 299              | 955   |
| P3      | 6.8  | 11.6   | 0.068   | 19.0                | 14.3                 | 154              | 523   |

**Table 3.** Mean meteorological conditions and maximum net ecosystem productivity (NEP) and gross ecosystem productivity (GEP) at saturation ( $P_{\text{max}}$ ) during three periods studied.

Note:  $\theta$ , volumetric soil moisture;  $T_{air}$ , air temperature;  $T_{soil}$ , soil temperature; VPD, vapor pressure deficit; PAR, photosynthetically active radiation.

height of 1.3 m was chosen to capture the base of the canopy without including the understory, and also because the lidar is unable to record multiple returns at heights within approximately 1.3 m of the ground. Morsdorf et al. (2006) indicate that  $f_{cover}$  is an effective proxy indicator of variations in foliage density. A schematic diagram of the lidar structure classification is provided in Fig. 3.

#### Footprint data analysis

The footprint parameterization used in this study follows that of Kljun et al. (2004). This parameterization was chosen because (1) it is based on variables that are easy to derive from measurements obtained from EC; (2) it is neither computationally difficult nor time intensive; and (3) it has been thoroughly applied and tested using a variety of meteorological (e.g., varying stability, roughness length, etc.) and technological (instrument measurement height) applications (Kljun et al. 2004).

The footprint parameterization allows for the derivation of the crosswind-integrated footprint  $(\bar{f^y})$  based on the alongwind distance from the EC (*x*), the EC height ( $z_m$ ), roughness length ( $z_0$ ), and the height of the planetary boundary layer (*H*). Directionality and origin of the flux were determined from wind direction. Trace gas advection and diffusion was accounted for in the surface friction velocity ( $u_*$ ), whereas buoyancy and the formation and size of eddies within the planetary boundary layer were determined using the standard deviation of the vertical velocity ( $\sigma_w$ ). Dispersion in the *y* direction (the crosswind distance from the centre line) was calculated using a Gaussian function (Amiro 1998). Roughness length ( $z_0$ ) at OJP was estimated from Choudhury and Monteith (1988) as:

[2] 
$$z_0 = \begin{cases} z_{0s} + 0.28hX^{1/2} & \text{for } 0 \le X \le 0.2 \\ 0.3h\left(\frac{1-d}{h}\right) & \text{for } 0.2 \le X \le 2 \end{cases}$$

and

[3] 
$$d = h[\ln(1 + X^{1/6}) + 0.031 \ln(1 + X^6)]$$

where X = 0.2LAI (1.5 m<sup>2</sup>·m<sup>-2</sup> on average at OJP), h is the mean height of the canopy, and  $z_{0s}$  is the soil surface roughness (=  $0.10h_s$ , where  $h_s$  is the height of the understory (Shuttleworth and Wallace 1985; Monteith and Unsworth 1990). The understory consisted mainly of sporadic and infrequently occurring alder, and in many cases footprints contained little to no understory, and therefore,  $h_s$  was assigned a value of zero. Finally, d is zero plane displacement. Therefore, at OJP  $z_0$  was 1.9 m using the mean measured

tree height of 14.2 m and varied between 1.6 m (for the shortest measured tree, 11.4 m) and 2.2 m (for the tallest measured tree, 16.4 m). The location of maximum daytime flux varied between 176 and 200 m from the flux tower, depending on variability in tree height and  $z_0$ . Because of these slight variations in roughness length and minimal impact on footprint size, mean  $z_0$  for the entire site was based on mean tree height.

Variable wind speed and boundary layer height also affect the length of the footprint (not shown), where increased  $u_*$ and decreased *H* result in footprints located nearer to the EC. Richardson number (Ri) was used to determine approximate stability of the atmosphere (Monteith and Unsworth 1990) based on air temperature and wind speed at 30 min periods during relatively unstable conditions when  $u_*$ was >0.35 m·s<sup>-1</sup>:

[4] 
$$\operatorname{Ri} = (gT^{-1}\partial T_{\operatorname{air}}/\partial z)/(\partial u/\partial z)^2$$

where *T* is absolute temperature (degrees Kelvin), *g* is gravitational acceleration (9.8 m·s<sup>-1</sup>), *u* is wind speed, and *z* is height. The generalized stability factor is calculated as

[5] 
$$F = (1 - 5Ri)^2 - 0.1 \le Ri \le 1$$

and

[6] 
$$F = (1 - 16 \text{Ri})^{0.75}$$
 Ri < -0.1

*F* was used to approximate *H* following tables in Gryning et al. (1987). The maximum along-wind and crosswind distances were used to estimate the area of the footprint and within-footprint mean canopy structure and elevation characteristics. Canopy structure and elevation were then correlated with 30 min mean  $CO_2$  flux concentrations measured by EC.

#### Statistical analysis

To determine whether vegetation structure and elevation affect NEP and GEP, the combined influences of meteorological variables were first examined. Meteorological variables included incoming PAR, RH,  $T_{air}$ ,  $T_{soil}$ , and  $\theta$ . A Landsberg light response curve (Landsberg and Waring 1997; Chen et al. 2002) was used to examine the relationship between incoming PAR and NEP (GEP) during individual periods:

[7] NEP = 
$$P_{\text{max}} \left(1 - e^{-a(\text{PAR} - I_{\text{comp}})}\right)$$

where  $P_{\text{max}}$  is the maximum mean NEP (or GEP) at saturation,  $\alpha$  is the slope of NEP (GEP) as it increases with incoming PAR, and  $I_{\text{comp}}$  is the light compensation point. The residuals of the measured versus modeled flux (NEP<sub>measured</sub> –

**Table 4.** Pearson's correlation coefficients for the relationships between net ecosystem productivity (NEP) and gross ecosystem productivity (GEP), and photosynthetically active radiation (PAR) using the Landsberg light response curve.

|     |        | Incoming     |               |               |                |              |
|-----|--------|--------------|---------------|---------------|----------------|--------------|
|     | Period | PAR          | $T_{\rm air}$ | RH            | $T_{\rm soil}$ | $\theta$     |
| NEP | P1     | 0.77 (0.000) | -0.59 (0.000) | 0.54 (0.000)  | -0.63 (0.000)  | 0.22 (0.02)  |
|     | P2     | 0.59 (0.000) | -0.66 (0.000) | 0.57 (0.000)  | -0.49 (0.000)  | 0.30 (0.000) |
|     | P3     | 0.78 (0.000) | -0.25 (0.004) | -0.072 (0.41) | -0.20 (0.03)   | 0.02 (0.79)  |
| GEP | P1     | 0.86 (0.000) | -0.45 (0.000) | 0.46 (0.000)  | -0.38 (0.000)  | 0.007 (0.94) |
|     | P2     | 0.65 (0.000) | -0.63 (0.000) | 0.58 (0.000)  | -0.42 (0.000)  | 0.30 (0.000) |
|     | P3     | 0.81 (0.000) | -0.25 (0.004) | 0.03 (0.74)   | -0.12 (0.19)   | -0.02 (0.86) |

**Note:** Dominant meteorological variables affecting the residuals of NEP and GEP after accounting for PAR are also included:  $T_{air}$ , air temperature; RH, relative humidity;  $T_{soil}$ , soil temperature;  $\theta$ , volumetric soil moisture. The *p* values for the correlations between NEP and GEP, and the driving variables are given in brackets. Number of observations = 192 (P1), 288 (P2), and 224 (P3).

NEP<sub>modelled</sub>) were then examined to determine the remaining contribution of the most important meteorological variables (RH,  $T_{soil}$ , and  $\theta$ ) to the variability in the flux. This was done using a multiple linear regression (Chen et al. 2002). A linear regression was chosen because it was best able to describe the variability in the residuals. A second multiple linear regression was also performed to examine the combined influences of meteorological variables and the most important canopy structure  $(f_{cover})$  and elevation influences on the flux. Both multiple regression analyses were added (separately) to the  $\ensuremath{\mathsf{NEP}_{modelled}}$  and  $\ensuremath{\mathsf{GEP}_{modelled}}$  and compared with the measured NEP and GEP for each time period. Pearson's r correlation was used to determine the relative correspondence between flux concentration and meteorological driving variables, canopy structure, and elevation as a correlation matrix.

The influence of local meteorology was also assessed by relating wind direction to meteorological driving variables during the periods of study. It could be argued that winds originating from particular directions may bring specific conditions (e.g., a wind originating from the north bringing cold air, a wind originating from the south bringing warm air, changes in humidity from nearby lakes, etc.). that could affect the local meteorological driving variables and photosynthesis. During the periods of study, wind direction had no influence on local meteorology.  $T_{\rm air}$  ranged from ~5 to 30 °C, and a two-sample t test confirms that  $T_{air}$  was unrelated to the origin of wind  $(r^2 = 0.04, p = 0.8)$ . Similarly, RH also had no relationship to wind direction (based on a two-sample t test), and varied between  $\sim 20\%$  and 100%, regardless of wind origin ( $r^2 = 0.05$ , p = 0.72). Therefore, local weather conditions were not dependent on wind direction during the periods studied.

# Results

#### **Footprint climatologies**

Half-hourly filled footprint contour lines during three periods of study were "overlaid" onto the canopy height models derived from lidar (Fig. 4) to illustrate footprint directionality and location within the ecosystem. The main part of the footprint (containing 80% probability of flux) occurred within 500 m of the EC system, whereas footprint areas often extended to 1 km and beyond during stable conditions. Figure 5 illustrates the frequency of wind directions

and flux origins throughout 2002 and during three periods of study. During 2002, approximately 45% of fluxes originated from areas northwest of the EC system. Within these areas elevation, tree height, and leaf area were above the mean values for the site (Table 2). Fluxes from the southwest (20%) and the northeast (18%) originated from areas where vegetation structure characteristics and elevation were average. Seventeen percent of winds originated from southeast quadrants, which typically had lower elevations, shorter trees, and lower leaf area. If winds originated from some directions more than others, the EC system may not have adequately sampled all of the within-site heterogeneity in fluxes. By comparison, during the three periods studied (Fig. 5b), fluxes tended to come from wind directions that were fairly representative of the dominant directions for 2002. Sampling from most directions allowed for comparisons to be made among most parts of the ecosystem.

#### Dominant meteorological driving variables

To determine the relationship between fluxes and spatial variability in biomass and elevation, the influence of meteorological variables on CO<sub>2</sub> uptake needs to first be determined so that structural and spatial influences can be separated from those attributable to changing meteorological conditions. During all three periods, meteorological variables had varying influences on CO<sub>2</sub> fluxes. Landsberg light response curves indicate that NEP and GEP saturated at different levels of PAR depending on the time period within the growing season and available  $\theta$  (Fig. 6). The amount of precipitation received one week prior to and during the periods studied was higher for P1 (58.2 mm) and P3 (23.1 mm) than for P2 (15.7 mm), and P2 had higher  $T_{air}$ than the other two periods. Saturation of NEP and GEP was more pronounced during P1 and P2 and was increasingly linear during P3. Table 3 provides information on mean meteorological conditions per period, incoming PAR,  $\theta$ ,  $T_{air}$ , and the vapor pressure deficit, all of which likely affected NEP and GEP light response curves during the three periods of study.

Saturation of photosynthesis at OJP was consistent with the results of Turner et al. (2003). These authors found that two forests (one conifer and one deciduous) tended to saturate at high levels of absorbed PAR because of the low photosynthetic capacity of shade leaves and possible inhibition of photosynthesis of sunlit leaves during the afternoon.

| Period |                   | Incoming PAR  | $T_{\rm air}$ | RH            | T <sub>soil</sub> | θ             |
|--------|-------------------|---------------|---------------|---------------|-------------------|---------------|
| P1     | Incoming PAR      |               | 0.59 (0.000)  | -0.60 (0.000) | 0.09 (0.19)       | -0.23 (0.002) |
|        | Tair              | 0.59 (0.000)  |               | -0.94 (0.000) | 0.65 (0.000)      | -0.42 (0.000) |
|        | RH                | -0.60 (0.000) | -0.94 (0.000) | _             | -0.62 (0.000)     | 0.34 (0.000)  |
|        | $T_{\rm soil}$    | 0.09 (0.19)   | 0.65 (0.000)  | -0.62 (0.000) |                   | -0.67 (0.000) |
|        | $\theta$          | -0.23 (0.002) | -0.42 (0.000) | 0.34 (0.000)  | -0.67 (0.000)     | _             |
| P2     | Incoming PAR      | _             | 0.42 (0.000)  | -0.51 (0.000) | -0.13 (0.03)      | 0.09 (0.1)    |
|        | T <sub>air</sub>  | 0.42 (0.000)  | _             | -0.69 (0.000) | 0.68 (0.000)      | -0.46 (0.000) |
|        | RH                | -0.51 (0.000) | -0.69 (0.000) | _             | -0.15 (0.01)      | -0.08 (0.18)  |
|        | $T_{\rm soil}$    | -0.13 (0.03)  | 0.68 (0.000)  | -0.15 (0.01)  |                   | -0.80 (0.000) |
|        | $\theta$          | 0.09 (0.1)    | -0.46 (0.000) | -0.08 (0.18)  | -0.80 (0.000)     | _             |
| P3     | Incoming PAR      |               | 0.50 (0.000)  | -0.59 (0.000) | -0.10 (0.16)      | 0.33 (0.000)  |
|        | $T_{\rm air}$     | 0.50 (0.000)  | _             | -0.56 (0.000) | 0.45 (0.000)      | 0.22 (0.001)  |
|        | RH                | -0.59 (0.000) | -0.56 (0.000) | _             | -0.50 (0.000)     | -0.61 (0.000) |
|        | T <sub>soil</sub> | -0.10 (0.16)  | 0.45 (0.000)  | -0.50 (0.000) |                   | 0.18 (0.007)  |
|        | $\theta$          | 0.33 (0.000)  | 0.22 (0.001)  | -0.61 (0.000) | 0.18 (0.007)      |               |

**Table 5.** Pearson's *r* correlation matrix of interacting meteorological driving variables and *p* values (in parentheses).

Note: PAR, photosynthetically active radiation;  $T_{air}$ , air temperature; RH, relative humidity;  $T_{soil}$ , soil temperature;  $\theta$ , volumetric soil moisture.

**Table 6.** Landsberg and multiple regression equations used to predict net ecosystem productivity (NEP) and gross ecosystem productivity (GEP) using meteorological variables.

|     |        |                                       |   | p value | of contrib     | oution   |
|-----|--------|---------------------------------------|---|---------|----------------|----------|
|     | Period | Landsberg equation                    | Multiple regression equation  | RH      | $T_{\rm soil}$ | $\theta$ |
| NEP | P1     | $y = 4.5(1 - e^{-0.002(PAR - 160)})$  | $NEP_{\rm r} = 23.9 + 0.016RH - 1.55 T_{\rm soil} - 129\theta$              | 0.001   | 0.000          | 0.000    |
|     | P2     | $y = 3.2(1 - e^{-0.002(PAR - 400)})$  | $NEP_{\rm r} = -14.8 - 0.04RH + 0.92T_{\rm soil} + 58.9\theta$              | 0.000   | 0.000          | 0.390    |
|     | P3     | $y = 6.8(1 - e^{-0.0015(PAR - 235)})$ | $NEP_{\rm r} = -22.8 + 0.02RH - 1.06T_{\rm soil} - 85\theta$                | 0.039   | 0.005          | 0.816    |
| GEP | P1     | $y = 7.1(1 - e^{-0.0023(PAR - 32)})$  | $\text{GEP}_{\rm r} = 3.10 + 0.01\text{RH} - 0.23T_{\rm soil} - 17.7\theta$ | 0.006   | 0.439          | 0.202    |
|     | P2     | $y = 7.7(1 - e^{-0.0022(PAR - 60)})$  | $\text{GEP}_{\rm r} = -8.4 + 0.05\text{RH} - 0.06T_{\rm soil} + 139\theta$  | 0.000   | 0.769          | 0.051    |
|     | P3     | $y = 11.6(1 - e^{-0.0018(PAR - 10)})$ | $\text{GEP}_{\rm r} = 16.7 + 0.005\text{RH} - 0.49T_{\rm soil} - 140\theta$ | 0.687   | 0.183          | 0.656    |

**Note:** PAR, photosynthetically active radiation; RH, relative humidity;  $T_{soil}$ , soil temperature;  $\theta$ , volumetric soil moisture. The relative importance of each contribution is indicated by the *p* value. Number of observations = 111 (P1), 166 (P2), and 126 (P3).

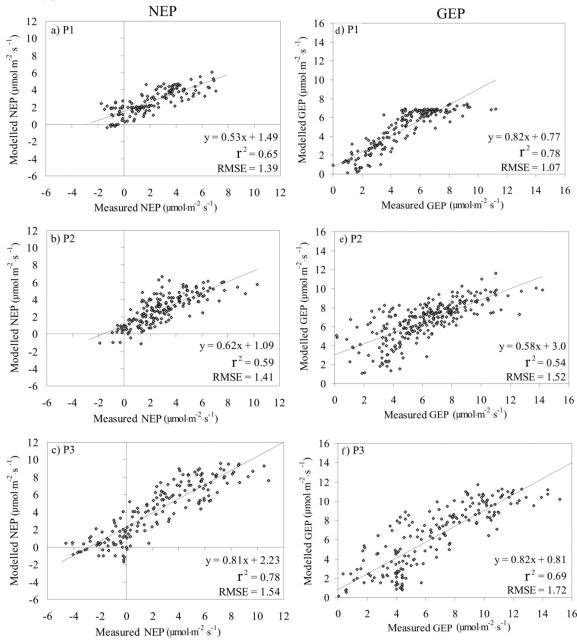
Within-season influences of incoming PAR on  $CO_2$  uptake and lower rates of saturation during P3 (as opposed to P1 and P2) were also found in Hollinger et al. (1999) in a mixed forest. Middleton et al. (1997) found that lower water use efficiency, reduced evapotranspiration, and reduced  $CO_2$ uptake at OJP in June and July 1994 were caused by low soil moisture and stomatal limitations to photosynthesis. They also observed a late summer – early autumn peak in photosynthesis at OJP and attributed this to the maturing of new needles. New needles commence growth in June and are fully developed by mid-July, enabling increased photosynthesis in August (Middleton et al. 1997).

Incoming PAR accounted for the greatest variability in NEP and GEP during the three periods studied (Table 4) but had the least influence during P2 when NEP and GEP were highly variable. After removing the influence of PAR on NEP and GEP using the Landsberg equation, the residuals of the variance of NEP and GEP were affected by  $T_{\rm air}$ , RH,  $\theta$ , and  $T_{\rm soil}$  to varying degrees. Table 4 summarizes the relationships and significance between the driving variables and NEP and GEP, respectively, during the three periods studied.

Interacting influences between meteorological variables and CO<sub>2</sub> fluxes cannot be ignored (Chen et al. 2002). Incoming PAR,  $T_{air}$ , RH,  $T_{soil}$ , and  $\theta$  all covaried with each other to some degree (Table 5). Incoming PAR correlated strongly with RH, to a lesser extent with  $T_{air}$ , and very little with  $T_{soil}$  and  $\theta$ .  $T_{air}$  also correlated strongly with RH and  $T_{\rm soil}$ , whereas RH correlated less strongly with  $T_{\rm soil}$ . If each variable is assessed individually with the residuals of NEP and GEP, after removing the influence of incoming PAR,  $T_{\rm air}$  and RH typically have similar but opposite influences on the residuals (Table 4). This result suggests that  $T_{air}$  was typically low and RH was high when NEP and GEP residuals were positive (i.e., when the Landsberg equation underestimated NEP and GEP).  $T_{soil}$  and  $\theta$  also had similar relationships with NEP and GEP residuals, but they were not as pronounced as those of  $T_{air}$  and RH (Table 4). The influence of  $T_{soil}$  was similar to that of  $T_{air}$ , and  $T_{soil}$  was negatively related to increases in NEP and GEP residuals during all periods, whereas  $\theta$  had the opposite relationship with the residuals (i.e,  $T_{soil}$  was low, and  $\theta$  had greater water content during periods of increased CO<sub>2</sub> uptake). Similar results were also found at three Douglas-fir (Pseudotsuga menziesii (Mirb.) Franco) sites of varying ages in Chen et al. (2002), where  $T_{soil}$  and  $T_{air}$  were also negatively related to increases in the residuals of NEP (increased temperature equals decreased NEP).

Meteorological variables RH,  $T_{soil}$ , and  $\theta$  were combined using a multiple linear regression with the residuals of in-

**Fig. 7.** Relationships (adjusted  $r^2$ ) between net ecosystem productivity (NEP) (*a*, *b*, and *c*), gross ecosystem productivity (GEP) (*d*, *e*, and *f*), and modeled estimates obtained using the Landsberg equation and multiple regression of the residuals presented in Table 6 during the three periods of study: 10–15 June 2002 (*a* and *d*), 5–13 July 2002 (*b* and *e*), and 7–13 August 2002 (*c* and *f*). Relationships are shown for entire days when incoming photosynthetically active radiation (PAR) exceeded 0.1  $\mu$ mol·m<sup>-2</sup>·s<sup>-1</sup>.



coming PAR from the Landsberg approach (Table 6). These variables were used because there was the least interaction between them and they described the greatest combined variability in  $CO_2$  flux. RH was able to describe much of the variability in  $T_{air}$ , resulting in the exclusion of  $T_{air}$  from the analysis.  $T_{soil}$  was included, and even though it was used to derive GEP, it did not greatly covary with GEP during the periods examined (r = -0.02 for P1; -0.36 for P2; -0.18 for P3). The multiple regressions were performed on the residuals of PAR versus NEP and GEP for each study period because the Landsberg curve provided the best description of the relationship (Table 6). Regression equations were

then added to the Landsberg equation for each study period and were plotted against measured NEP and GEP in Fig. 7. In all cases, inclusion of meteorological driving variables (apart from incoming PAR) improved the prediction of NEP and GEP.

# Within-footprint vegetation structural and elevation influences on CO<sub>2</sub> fluxes

Does the inclusion of canopy structure and elevation improve estimates of NEP and GEP compared with estimates obtained with meteorological variables only? Within a multiple linear regression,  $f_{cover}$  and elevation were com-

**Table 7.** Multiple regression equations used to predict net ecosystem productivity (NEP) and gross ecosystem productivity (GEP) using meteorological variables, canopy fractional cover ( $f_{cover}$ ), and elevation (Elev.), added to the residuals of the Landsberg equation (represented by NEP<sub>r</sub> and GEP<sub>r</sub>) (Table 6).

|     |        |  | p value of contribution |                |          |                 |       |
|-----|--------|--|-------------------------|----------------|----------|-----------------|-------|
|     | Period | Multiple regression equation   | RH                      | $T_{\rm soil}$ | $\theta$ | $f_{\rm cover}$ | Elev. |
| NEP | P1     | $NEP_r = 158 + 0.01RH - 1.54T_{soil} - 224\theta + 0.27Elev. + 9.95f_{cover}$      | 0.23                    | 0.000          | 0.001    | 0.041           | 0.21  |
|     | P2     | $NEP_{r} = -1.9 + 0.08RH - 1.44T_{soil} - 153\theta + 0.041Elev. + 8.36f_{cover}$  | 0.000                   | 0.000          | 0.05     | 0.10            | 0.63  |
|     | P3     | $NEP_{r} = 0.7 - 0.02RH - 1.60T_{soil} - 1091\theta + 0.17Elev. + 18.5f_{cover}$   | 0.25                    | 0.004          | 0.36     | 0.020           | 0.32  |
| GEP | P1     | $GEP_{r} = 167 + 0.009RH - 0.84T_{soil} - 224\theta - 0.30Elev. + 10.45f_{cover}$  | 0.15                    | 0.000          | 0.000    | 0.025           | 0.15  |
|     | P2     | $GEP_{r} = -22.3 + 0.08RH - 0.88T_{soil} - 20.6\theta - 0.05Elev. + 8.88f_{cover}$ | 0.000                   | 0.000          | 0.79     | 0.071           | 0.53  |
|     | Р3     | $GEP_r = 19.6 + 0.003RH - 0.84T_{soil} - 826\theta - 0.075Elev. + 16.4f_{cover}$   | 0.85                    | 0.15           | 0.11     | 0.032           | 0.66  |

Note: RH, relative humidity;  $T_{soil}$ , soil temperature;  $\theta$ , volumetric soil moisture. The relative importance of each contribution is indicated by the *p* value. Number of observations = 111 (P1), 166 (P2), and 126 (P3).

bined with the meteorological driving variables RH,  $T_{\rm soil}$ , and  $\theta$ , and incoming PAR (the Landsberg approach) for each of the periods studied (Table 7). Canopy structure indicators and elevation covaried to some degree. Mean canopy height was strongly positively correlated with mean canopy depth (r = 0.94, p = 0.000) and  $f_{\rm cover}$  (r = 0.64, p = 0.000), and canopy depth was correlated with  $f_{\rm cover}$  (r = 0.71, p =0.000). Canopy height was not significantly correlated with elevation (r = 0.16, p = 0.07), but  $f_{\rm cover}$  tended to be negatively correlated with elevation (r = -0.38, p = 0.000). Of all the structural attributes,  $f_{\rm cover}$  best described the variability in NEP and GEP. Modelled NEP and GEP, based on the multiple regression with the inclusion of meteorological variables,  $f_{\rm cover}$ , and elevation, were compared with measured values in Fig. 8.

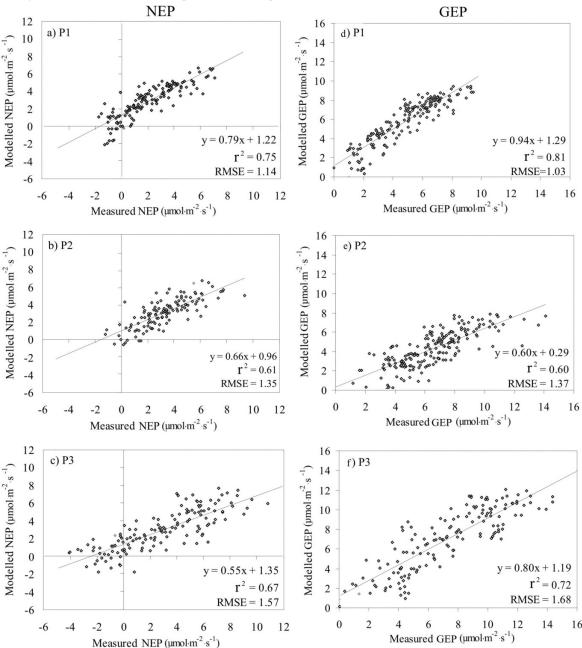
The inclusion of  $f_{cover}$  was sometimes a more important component of the flux than daily variability in  $\theta$  (P3, and to a certain extent P2) and RH (P1 and P3) (Table 7). Elevation, however, was not an important part of the combined influence on fluxes, as demonstrated by the p values in Table 7. During most periods studied,  $f_{cover}$  improved predictions of NEP and GEP (when comparing  $r^{\bar{2}}$  and the root mean square error (RMSE) of Figs. 8 and 9). During P1, predictions of NEP and GEP were improved by 10% and 5%, respectively, when meteorological variables were included, and by an additional 15% and 4% when  $f_{cover}$  and elevation were included. Meteorological influences (apart from incoming PAR) were less important in P1 than in the other two periods.  $f_{cover}$  had a larger influence than meteorological driving variables on NEP (15% vs. 10%), but a slightly less important influence on GEP (4% vs. 5%). In P2, including additional parameters resulted in smaller improvements in the predictions, with the exception of the meteorological variables, which improved the Landsberg predicted NEP and GEP by 68% and 29% (NEP and GEP). Meteorological variables had a dominant influence on fluxes during P2, whereas  $f_{cover}$  and elevation had relatively minor influences, improving modelled NEP and GEP by an additional 3% and 11%, respectively. Much of the variability in fluxes during P2 remained unexplained, even after inclusion of meteorological variables and canopy structure and elevation. During P3,  $f_{cover}$  and elevation worsened the prediction of NEP by 16% compared with that modeled using meteorological driving variables alone (which improved NEP and GEP prediction by 28% and 4%), whereas GEP was only slightly improved by 4% when  $f_{cover}$  was included. Small improvements to modeled NEP and GEP from  $f_{cover}$  and elevation also resulted in lower RMSE.

On a daily basis rather than by study periods, canopy structure and elevation had varying correspondence with measured NEP and GEP (Fig. 9), perhaps because of sensitivity of fluxes to the vegetation characteristics of the maximum source area and available resources. We expect that areas with more biomass (e.g., foliage amounts) would be positively related to increased CO<sub>2</sub> uptake by vegetation because more leaves would be photosynthesizing. An assessment of light response curves during four days with similar meteorological conditions (7 and 8 July and 9 and 10 August), when fluxes came from opposite directions within the ecosystem, yields direct evidence of the influences of canopy structure and elevation on fluxes. On 7 July and 10 August, fluxes originated from the northwest part of the ecosystem: areas with relatively high leaf area, tall trees, and higher elevation. On 8 July and 9 August, fluxes originated from the east and southeast parts of the ecosystem: areas with relatively low leaf area, shorter trees, and low elevation. Light response curves for NEP and GEP on 7 July and 10 August (not shown) indicate that areas with more biomass, located at higher elevations, had greater ability to photosynthesize than areas with less biomass. A t test confirms that significant differences in light response curves exist between dates where fluxes originated from high biomass areas and dates where fluxes originated from low biomass areas (p < 0.01). Differences in Landsberg curve descriptors  $P_{\text{max}}$  and  $I_{\text{comp}}$  are demonstrated in Table 8 for specific dates.

Of the 22 days studied, 13 (59%) and 9 (41%) of the days showed significant (p < 0.01) positive relationships between increased biomass and increased NEP and GEP, respectively. Four and five additional days were also positively correlated with NEP and GEP, but did not have a significant influence. The opposite relationships were found on 5 and 8 days (NEP, GEP), where increased biomass was also related to increased atmospheric CO<sub>2</sub> concentrations, but only 2 and 3 days were significant (p < 0.01). The best correspondence between CO<sub>2</sub> uptake and increased biomass occurred during P1 and P3 when photosynthesis was not limited by  $\theta$ , high mean  $T_{air}$ , and incoming PAR.

NEP and GEP were also significantly negatively affected by increased elevation (or vice versa) for 10 and 8 of 22 days, respectively (where p < 0.01) (Fig. 9). Negative relationships occurred mostly during P2 and P3, corresponding

**Fig. 8.** Relationships (adjusted  $r^2$ ) between measured net ecosystem productivity (NEP) (*a*, *b*, and *c*) and gross ecosystem productivity (GEP) (*d*, *e*, and *f*), and modeled estimates of the NEP and GEP obtained with the Landsberg equation and multiple regression of the residuals presented in Table 6 (including  $f_{cover}$  and elevation) during three periods of study: 10–15 June 2002 (*a* and *d*), 5–13 July 2002 (*b* and *e*), and 7–13 August 2002 (*c* and *f*). Relationships are shown for periods between 0900 and 1700 hours local time.

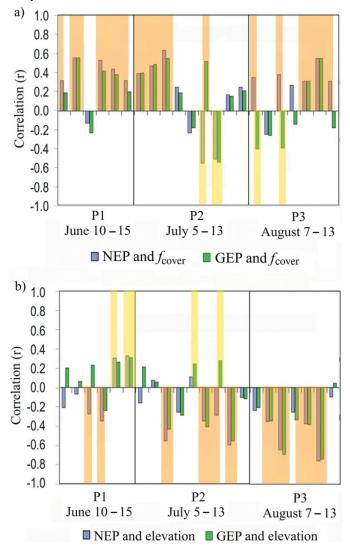


with high mean  $T_{air}$  and  $T_{soil}$ . For example, on 13 June 2002, GEP (and NEP) were negatively affected by fluxes originating from areas of higher elevation (Fig. 4). June 13 was also the warmest day of the week, with a mean  $T_{air}$  of 21.8 °C; mean  $T_{air}$  was 13.5 °C for the days prior to June 13 and 19.2 °C for the following days. Warmer days with increased  $T_{soil}$  typically resulted in a negative correspondence between elevation and CO<sub>2</sub> fluxes. In this case  $T_{soil}$  provides a general estimate of ecosystem  $T_{soil}$  variability over time because it is only measured in one location. Mean  $T_{air}$  and  $T_{soil}$  were greatest during P2 ( $T_{air} = 23.7$  °C,  $T_{soil} = 14.4$  °C) and P3 ( $T_{air} = 19.0$  °C,  $T_{soil} = 14.3$  °C) on days when elevation and

NEP and GEP were significantly related. Cooler and wetter periods during P1 showed limited correspondence between CO<sub>2</sub> fluxes and elevation.

### **Discussion and conclusions**

In this study, we found that  $CO_2$  fluxes varied spatially and temporally as a result of variations in meteorological variables, canopy biomass, and elevation within a jack pine ecosystem. Why does the relative importance of interactions between  $CO_2$  fluxes, and canopy structure and elevation vary on a daily basis and throughout each period? This may **Fig. 9.** Bar graph of Pearson's *r* correlations between daily net ecosystem productivity (NEP) and gross ecosystem productivity (GEP), and (*a*) canopy fractional cover ( $f_{cover}$ ) and (*b*) elevation ( $n = \sim 17$  per day but may vary because of low surface friction velocity ( $u_*$ )). Orange and yellow bars represent *p* values <0.01. In Fig. 9*a*, 13 of 22 (NEP) and 9 of 22 (GEP) days are significantly correlated with areas of increased  $f_{cover}$ , whereas the opposite is found on 2 of 22 (NEP) and 3 of 22 (GEP) days. In Fig. 9*b*, 2 of 22 (NEP) and 3 of 22 (GEP) days are significantly correlated with areas of higher elevations, whereas 10 of 22 (NEP) and 8 of 22 (GEP) days are significantly correlated with areas in biomass (e.g., greater foliage) should be positively correlated with increased NEP and GEP.



be due, in part, to sensitivity of fluxes to the characteristics of vegetation within the maximum source location of the fluxes and available resources. Footprint estimates indicate that the greatest contribution of measured fluxes typically originated from up to 150 to 300 m from the tower. Trees were typically shorter within 150 m east and southeast of the EC system (mean canopy height = 13.6 m), whereas trees were taller west and northwest of the tower (mean canopy height = 15.2 m) (Fig. 1). Canopy  $f_{cover}$  was also low, ranging from 0.36 to 0.45 in all directions within 150 m of the EC.

At distances of 150 to 350 m of the EC, the ecosystem becomes more spatially variable. Mean tree heights ranged from 12.5 m (southeast of the EC) to 18.4 m (northwest of the EC), resulting in  $\sim 32\%$  difference in mean tree height within the two parts of the ecosystem from which CO<sub>2</sub> fluxes likely originated.  $f_{\rm cover}$  also varied significantly, ranging between 0.36 and 0.81 at spatial resolutions of 1 m. The mean foliage fractional cover was higher to the northeast and northwest of the EC, and lower to the southeast and southwest of the site (Table 2). Even on a daily basis, the amount of biomass sampled by EC can vary greatly at OJP, depending on the source location of fluxes. Maximum source area locations can vary over space, as do vegetation and elevation characteristics. When vegetation and meteorological variables are combined, their effects on fluxes can also differ (Fig. 9). At OJP, Baldocchi et al. (2000) found that between 25% and 35% of incoming solar radiation reached the forest floor. Similarly, Griffis et al. (2003) suggested that approximately 70% of solar radiation was absorbed by the canopy at this site. In our study, spatial mapping of  $f_{cover}$  by airborne lidar at 1 m resolution showed that light penetration to the ground surface can be as little as 19% in areas of high  $f_{\text{cover}}$ , and as great as 64% in areas of low  $f_{cover}$ . These relatively large differences in the spatial variability of light absorption by canopies and penetration to the ground may explain the variable influences on  $CO_2$ exchanges from different parts of the ecosystem. Future studies should examine the areal extent of classified  $f_{cover}$ , tree height, and elevation within footprints, not only footprint means, as examined in this study.

Over the course of several days, canopy structure and elevation exhibited strong influences on  $CO_2$  fluxes during P1 and to a lesser extent during P3, but had relatively little influence during P2. This was perhaps because of limited availability of resources and saturation of photosynthesis by high amounts of mean incoming PAR. Canopy structural influences on  $CO_2$  fluxes were typically less important than meteorological variables, but during many days, canopy structure, especially  $f_{cover}$ , explained a comparatively large proportion of the variance of NEP and GEP.

In this study, assessment of mean elevation within footprints was simplistic. For example,  $CO_2$  fluxes may be affected by slope curvature, leading to either wetting or drying of soils, thereby affecting tree growth, photosynthesis, and  $R_e$  (e.g., Baldocchi et al. 1997; Baldocchi and Meyers 1998). Elevation is not necessarily indicative of microtopographic features affecting fluxes of  $CO_2$  within the landscape because microtopography is also dependent on the spatial distribution of small hills and valleys, slope, and aspect. The effects of microtopographic features could be taken into account by incorporating local ground morphology, slope curvature (concave vs. convex), and aspect to properly classify upland and lowland areas and their attributes.

Based on this limited analysis and the variability in wind directions illustrated in Fig. 4 for the entire year of 2002, flux measurements at this site may not be equally measuring fluxes from all parts of the ecosystem surrounding the EC flux station. Winds typically originate from upland areas,

**Table 8.** Net ecosystem productivity (NEP) and gross ecosystem productivity (GEP) light response curve characteristics for 4 days with similar meteorological conditions when footprints originated from opposite parts of the ecosystem (high biomass vs. low biomass (canopy fractional cover ( $f_{cover}$ ), tree height), and higher elevation (upland) versus lower elevation (lowland)).

|                | P <sub>max</sub> (µm | iol·m <sup>−2</sup> ·s <sup>−1</sup> ) | I <sub>comp</sub> (μ | mol·m <sup>-2</sup> ·s <sup>-1</sup> ) | Daily to<br>(µmol∙r | otal flux<br>n <sup>-2</sup> ·s <sup>-1</sup> ) | _                              |
|----------------|----------------------|--|----------------------|--|---------------------|---|--------------------------------|
| Date           | NEP                  | GEP                                    | NEP                  | GEP                                    | NEP                 | GEP   | Mean footprint characteristics |
| 7 July 2002    | 3.1                  | 7.5                                    | 450                  | 273                                    | 44.9                | 166.8   | High biomass, upland           |
| 8 July 2002    | 2.3                  | 6.7                                    | 470                  | 350                                    | 40.1                | 151.7   | Low biomass, lowland           |
| 9 August 2002  | 5.8                  | 9.7                                    | 390                  | 125                                    | 87.3                | 194.4   | Low biomass, lowland           |
| 10 August 2002 | 8.5                  | 11.8                                   | 310                  | 50                                     | 92.4                | 199.6   | High biomass, upland           |

Note:  $P_{\text{max}}$ , maximum mean NEP (or GEP) at saturation;  $I_{\text{comp}}$ , light compensation point.

which have slightly different canopy structural characteristics than low-lying areas. Differences in the variability in NEP could be influenced, to some degree, by differences in canopy and ground surface characteristics within the site. Rahman et al. (2001) found that EC underestimated gross  $CO_2$  fluxes by 5% at OJP because biomass tended to be lower within the immediate vicinity of the EC than in the surrounding ecosystem (also found here). Fluxes at more heterogeneous sites may have an increased dependency on canopy structure and elevation. Along with meteorological variables, canopy structure and elevation may be a key factor in determining whether the annual carbon balance of a vegetated ecosystem is a net annual source or sink. Further research over extended (e.g., annual) periods is needed to determine if this is the case.

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