

Sources of carbon monoxide and formaldehyde in North America determined from high-resolution atmospheric data

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Received: 24 April 2008 – Accepted: 30 April 2008 – Published: 11 June 2008

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Published by Copernicus Publications on behalf of the European Geosciences Union.

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We analyze the North American budget for carbon monoxide using data for CO and formaldehyde concentrations from tall towers and aircraft in a model-data assimilation framework. The Stochastic Time-Inverted, Lagrangian Transport model for CO (STILT-CO) determines local to regional-scale CO contributions associated with production from fossil fuel combustion, biomass burning, and oxidation of volatile organic compounds (VOCs) using an ensemble of Lagrangian particles driven by high resolution assimilated meteorology. In most cases, the model demonstrates high fidelity simulations of hourly surface data from tall towers and point measurements from aircraft, with somewhat less satisfactory performance in coastal regions and when CO from large biomass fires in Alaska and the Yukon Territory influence the continental US.

Inversions of STILT-CO simulations for CO and formaldehyde show that current inventories of CO emissions from fossil fuel combustion are significantly too high, by almost a factor of three in summer and a factor two in early spring, consistent with recent analyses of data from the INTEX-A aircraft program. Formaldehyde data help to show that sources of CO from oxidation of CH₄ and other VOCs represent the dominant sources of CO over North America in summer.

1 Introduction

Carbon monoxide is a key species for both atmospheric chemistry and public health; it was one of the original six criteria air pollutants, and many urban areas remain either in non-attainment status or at risk (US EPA, 2007b). Effective emissions control strategies require accurate emission inventories and models that can forecast concentrations across the US. Carbon monoxide also plays important roles in ozone production, in regulating concentrations of OH radicals, and indirectly in climate forcing (Thompson, 1992; Daniel and Solomon, 1998; Warneke et al., 2006).

Primary emissions of CO arise from incomplete combustion. Motor vehicle exhaust

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accounts for 85–95% of fossil fuel sources (US EPA, 2007a). Other major sources include biomass burning and secondary production from oxidation of methane and other volatile organic compounds (VOCs) emitted from both anthropogenic sources, wetlands, and vegetation (Granier et al., 2000; Goldstein and Galbally, 2007). The principal sink for CO is oxidation by the OH radical, giving a mean atmospheric lifetime of two months (Logan, 1981).

The present paper develops a model-data fusion framework to provide accurate CO source magnitudes on regional/continental scales and to attribute source strengths to specific processes. Despite a long history of emissions estimates, substantial uncertainty remains in knowledge of carbon monoxide sources (IPCC, 2001). Several recent studies have indicated that EPA's 1999 National Emissions Inventory (NEI-1999) may overestimate anthropogenic CO emissions by 50%–300% (Parrish, 2006; Turnbull et al., 2006; Warneke et al., 2006; Hudman et al., 2008). Attempts to estimate another major CO source – secondary production from biogenic VOC emissions – stretch back as far as the 1970s (Zimmerman, 1979; Guenther et al., 1995, 2006; Stewart et al., 2003; Chang et al., 2005; Simon et al., 2006). VOCs are emitted by anthropogenic and biogenic sources, but biogenic VOC emissions, particularly isoprene and monoterpenes from plants, constitute 80% of the total source (Oliver et al., 2001).

Recent studies have attempted to improve knowledge of VOC sources by using remote sensing measurements of formaldehyde (e.g. Palmer et al., 2003, 2006). Nevertheless, the magnitude and distribution of VOC sources remain very controversial. For example, the commonly-used GEIA biogenic VOC inventory differs from prior estimates by as much as a factor of five (Guenther et al., 1995).

The combination of remote sensing and in situ data for CO and formaldehyde can help distinguish production of CO from different sources. When methane and VOCs decay to CO, both decay to a common intermediate species: formaldehyde (HCHO) (Duncan et al., 2007). The atmospheric lifetime of formaldehyde is only a few hours or less, and the CO yield is near unity (Palmer et al., 2003; Duncan et al., 2007). Formaldehyde data have been used to validate emissions estimates of VOCs and CO

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in a number of recent studies (Abott et al., 2003; Palmer et al., 2003; Martin et al., 2004; Shim et al., 2005; Millet et al., 2006, 2008; Palmer et al., 2006).

Sources of CO from biomass fires are also poorly constrained. According to the IPCC, biomass burning contributes 15–30% of all global CO emissions (IPCC, 2001).

Individual fires can be vast and persist for significant periods of time. For example, during one episode, Canadian fires enhanced carbon monoxide concentrations over Ireland by almost 60% (Forster et al., 2001). A variety of methods have been used to estimate biomass burning sources of CO: historical written fire records (e.g. Liu, 2004), inverse models (e.g. Wotowa and Trainer, 2000), and satellite data (e.g. Pfister et al., 2005; Wiedinmyer et al., 2006). Remote sensing instruments have been used to quantify monthly or even daily variations in biomass burning emissions (Duncan et al., 2003; Ito and Penner, 2004; Wiedinmyer et al., 2006). However, even after careful processing and assessment, satellite estimates still differ markedly from historical fire records; one of the most recent satellite estimates (Wiedinmyer et al., 2006), disagrees with its predecessors by as much as a factor of two. Uncertainties in emissions estimates arise from uncertainties in fuel loadings (estimates of biomass per area), in combustion efficiency (fraction of biomass burned), and the inability of satellites to detect fires through cloud cover (Wiedinmyer et al., 2006).

Lagrangian models like STILT-CO are particularly well-suited to determine the magnitude and distribution of CO sources. If a measurement site is located in a rural area, the carbon monoxide record will show distinct peak event periods separated by discrete non-peak periods. The peaks reflect transport from intense localized sources (urban areas, fires). The background arises because CO has an atmospheric lifetime of about two months – enough time to transport the pollutant over long distances, but not enough time for the pollutant to build up to very high levels (Pfister et al., 2004). If the model overestimates or underestimates peak pollution events, the results suggest well-defined adjustments to the original emissions inventories.

Time-inverted Lagrangian models have been used in a number of studies to characterize regional pollution sources for a variety of trace gases. Moody et al. (1998) de-

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5 fined patterns of backward particle trajectories and matched these transport patterns with fluctuations in pollution measurements taken at Harvard Forest in Massachusetts. Vermeulen et al. (2006) used the Lagrangian model COMET on small spatial scales (5×5 km to 10×20 km) to explain the observed variance in methane concentrations at measurement sites downwind of urban sources in Europe. Warneke et al. (2006) applied Lagrangian modeling to carbon monoxide using the FLEXPART model to estimate CO concentrations at measurement sites in New England. Warneke et al. (2006) modeled CO only from anthropogenic and biomass burning sources with no photochemical loss; FLEXPART obtained a model-measurement fit with $r^2=0.30-0.45$ and inferred that EPA's NEI-99 inventory may be too high by 50% in Boston/New York urban outflow.

15 The present paper develops the Stochastic Time-Inverted Lagrangian Transport Model for CO (STILT-CO), incorporating anthropogenic emissions, biogenic VOCs, biomass burning emissions, and associated atmospheric chemical processes into an hourly model of CO and formaldehyde concentrations over North America at a high spatial resolution (45 km). STILT-CO allows us to create very detailed representations of carbon monoxide and formaldehyde concentrations in time and space, which can be compared to a wide variety of observations from tall towers and aircraft. We then use a Bayesian optimization technique to refine current estimates of anthropogenic CO emissions and CO production from VOC emissions. We also examine more generally some of the challenges in source-receptor Lagrangian modeling that arise, for example, in coastal areas.

2 Methodology

2.1 The STILT-CO model

25 The Stochastic Time Inverted Lagrangian Transport Model (STILT) of Lin et al. (2003) and Gerbig et al. (2003) is a Lagrangian Particle Dispersion model (LPDM) that forms

the foundation for STILT-CO. STILT calculates concentrations of a trace gas at a single point, known as a receptor point, defined as a location in space and time that corresponds to a measurement (e.g. at a tall tower or on an aircraft flight). A series of ambient air measurements taken every hour at a tower for one day would count as 24 different receptor points, all with the same location but at different times. A time-inverted LPDM releases an ensemble of imaginary air parcels or particles from the receptor point that travel upwind (backward in time), and the trace gas sources that these particles encounter while traveling upwind are then used to calculate concentrations at the receptor point. The very detailed rendition of concentration fluctuations provided by the LPDM can be validated against individual measurements taken at the receptor, providing a powerful framework for assessing upwind surface or volume sources. The following sections describe in detail the STILT transport model and its subsequent application to carbon monoxide and formaldehyde concentrations.

2.1.1 The modeled advected boundary condition

The STILT lateral tracer boundary condition, developed by [Gerbig et al. \(2003\)](#), uses CO and CH₄ levels observed at Pacific stations of the NOAA monitoring network to derive a boundary condition for all altitudes at the 145° W meridian. Most particles (>65%) released in our domain cross the 145° W boundary after six days or less, while some of the remainder may stay a long time in the domain ([Gerbig et al., 2003](#)). When a particle reaches the terminal time step set in the model (typically 10 days), or when it reaches 145° W, the boundary condition is taken from its latitude and altitude projected, if needed, onto the 145° W meridian ([Gerbig et al., 2003](#)). The boundary condition has daily temporal resolution and 2.5° latitude by 0.5 km altitude spatial resolution ([Matross et al., 2006](#)). Because the lifetime of formaldehyde is a few hours or less, we set formaldehyde to zero at the boundary.

To form the lateral tracer boundary condition, [Gerbig et al. \(2003\)](#) used CO and CH₄ measurements from three different monitoring stations on the NOAA GMD network: Cape Kumakahi, Hawaii; Cold Bay, Alaska; and Barrow, Alaska. [Matross et al. \(2006\)](#)

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supplemented these measurements with aircraft data over Carr, Colorado; Poker Flats, Alaska; and Park Falls, Wisconsin. These data were interpolated over all latitudes and times on the western domain boundary. (Gerbig et al., 2003) then used a Green's function fit to available aircraft data over the Pacific in order to derive a boundary condition to all altitudes. Transport of CO and CH₄ from the boundary in STILT allows for chemical loss due to oxidation in transit to the receptor point, as outlined in Sects. 2.1.5 and 2.1.6.

2.1.2 The STILT meteorological transport model

The STILT model calculates the incremental change in the concentration of a trace gas at a receptor point with location \mathbf{x}_r and time t_r , $\Delta C(\mathbf{x}_r, t_r)$, by multiplying the spatially and temporally resolved source $S(\mathbf{x}, t)$ (units: $\mu\text{mol m}^{-2} \text{s}^{-1}$), by the influence function $I(\mathbf{x}_r, t_r | \mathbf{x}, t)$ (units: $\text{ppm}/(\mu\text{mol m}^{-2} \text{s}^{-1})$) of the source location on the receptor point and integrating over the domain V (Eq. 1, term 1). The second term in Eq. (1) provides the contribution from the advection of the initial tracer field, taken from the boundary condition (Lin et al., 2003).

$$\Delta C(\mathbf{x}_r, t_r) = \int_{t_0}^{t_r} dt \int_V d^3x I(\mathbf{x}_r, t_r | \mathbf{x}, t) S(\mathbf{x}, t) + \int_V d^3x I(\mathbf{x}_r, t_r | \mathbf{x}, t_0) C(\mathbf{x}, t_0) \quad (1)$$

$$I(\mathbf{x}_r, t_r | \mathbf{x}, t) = \frac{\rho(\mathbf{x}_r, t_r | \mathbf{x}, t)}{N_{\text{tot}}} \quad (2)$$

To calculate the influence I of a particular location (\mathbf{x}, t) in space and time, the model divides the density of particles computed by the LPDM at (\mathbf{x}, t) , $\rho(\mathbf{x}_r, t_r | \mathbf{x}, t)$, by the total number of particles, N_{tot} , released backward in time from the receptor (see Eq. 2) (Lin et al., 2003).

The model computes the source function $S(\mathbf{x}, t)$ associated with a surface flux $F(\mathbf{x}, t)$ by distributing mass emitted at the surface through the atmosphere to a mixing height h , set as a fraction of the planetary boundary layer (PBL) height. Gerbig et al. (2003)

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found that varying h between 10% and 100% of the planetary boundary layer (PBL) did not significantly affect model results. We set this initial mixing height for surface sources equal to half the PBL height in the current paper.

Equation (1) can be made more directly applicable to surface fluxes by integrating over the grid elements and time step of the model (t), to obtain Eq. (3). Here $\Delta C_{m,i,j}(\mathbf{x}_r, t_r)$ is the contribution to the concentration increment from the volume element at the surface due to gases emitted between time t_m and t_m+t . $f(x_i, y_j, t_m)$ is the footprint function defined by the expression in brackets. The total incremental concentration change due to all surface sources in the domain, $\Delta C_a(\mathbf{x}_r, t_r)$, is obtained by summing over all m , i , and j (Eq. 4). Equation (4) accounts for direct CO emissions at the surface with flux F_a (1st term), CO produced from the chemical degradation of VOCs emitted from the surface with flux F_b (2nd term), and CO loss by reaction with OH to CO_2 (3rd term). The second term includes a chemistry function $R(x_i, y_j, t_m|\mathbf{x}_r, t_r)$ that accounts for creation of CO due to chemistry on precursor gases (emission fluxes F_b) during particle transit to the receptor, and the third term describes CO loss due to chemistry en route to the receptor point (OH oxidation with rate constant k_{OH}). Summing over all footprint elements for different CO and VOC sources yields the concentration due to surface sources that is seen at the receptor. An analogous approach is taken for formaldehyde.

$$\Delta C_{m,i,j}(\mathbf{x}_r, t_r) = \left[\frac{m_{\text{air}}}{(h\rho(x_i, y_j, t_m))} \int_{t_m}^{t_m+\tau} dt \int_{x_i}^{(x_i+\Delta x)} dx \int_{y_j}^{(y_j+\Delta y)} dy \int_0^h dz l(\mathbf{x}_r, t_r|\mathbf{x}, t) \right] \cdot F(x_i, y_j, t_m) = f(\mathbf{x}_r, t_r|x_i, y_j, t_m)F(x_i, y_j, t_m) \quad (3)$$

$$\Delta C_a(\mathbf{x}_r, t_r) = \sum_{i,j,m} \{ f(x_i, y_j, t_m)F_a(x_i, y_j, t_m) + f(x_i, y_j, t_m)F_b(x_i, y_j, t_m) \int_{t_m}^{t_r} R(x_i, y_j, t_m|\mathbf{x}_r, t) dt - f(x_i, y_j, t_m)F_a(x_i, y_j, t_m) \int_{t_m}^{t_r} k_{\text{OH}}[\text{OH}] dt \} \quad (4)$$

The domain for the STILT model over North America extends from 11° N latitude to 70° N and from -145° longitude to -51°. The transport grid size is 45 km and the

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surface emissions fluxes are gridded with maximum resolution of 1/6° latitude by 1/4° longitude. All particle trajectories are run ten days backward in time, or until the particles they leave the domain, whichever is shorter.

STILT utilizes a dynamic re-gridding scheme when calculating the influence footprint.

5 As particles track far from the receptor, the footprint covers larger areas and the statistical probability of finding a particle in a particular grid square becomes small. The STILT-CO model produces results with less statistical noise by dynamically aggregating the grid of surface fluxes as the particle ensemble disperses (Gerbig et al., 2003).

10 We initially used three assimilated meteorological drivers to run the particle ensembles back in time: the final data assimilation of the National Centers for Environmental Prediction model (FNL) (Stunder, 1997), the Eta Data Assimilation System 40 km (EDAS-40) (NOAA ARL, 2004), and the Brazilian adaptation of the Regional Atmospheric Modeling System (BRAMS) (Pielke et al., 1992; Cotton et al., 2004; Sanchez-Ccoyllo et al., 2006). The FNL and EDAS-40 fields produced substantial mass violation, and therefore, BRAMS is the primary meteorological driver used for all model runs.

Our BRAMS core model (v. 3.2) is strongly based on RAMS solver, with several optimizations for faster solution, developments for enhanced portability, and new parameterizations for convection (shallow and deep) and turbulence. We modified the diagnostic outputs from BRAMS to ensure mass conservation to very high accuracy and applied a specific mass conservation fix from Medvigy et al. (2005). The domain consisted of a single, 45-km horizontal resolution grid, covering most of North America. The simulated period was from 1 February 2004 to 1 March 2005. The vertical coordinate was terrain-following with a resolution ranging from 150 m at the bottom of the domain to 850 m at the top of the domain (20 600 m maximum altitude).

25 Interactions between the atmosphere, biosphere, and soil were solved using LEAF-3 surface sub-model (Walko et al., 2000). Sub-grid convective clouds were parameterized using the Grell and Devenyi (2002) scheme, from which we retrieved mass fluxes due to convection, entrainment and detrainment. We also computed the average ver-

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tical Lagrangian time scale, based on [Hanna \(1982\)](#), and retrieved the boundary layer height, following [Vogelezang et al. \(1996\)](#). The model timestep was 60 s. The variables needed for STILT were output every 10 min to ensure consistency between RAMS and STILT transport and to enhance mass conservation.

5 2.1.3 Overview of CO and HCHO sources

STILT-CO incorporates primary CO sources at the surface from two distinct processes: fossil fuel combustion and biomass burning, plus volume sources of CO produced from the oxidation of biogenic VOCs emitted at the surface. The CO model also accounts for CO production from the oxidation of methane and CO loss due to oxidation to CO₂. The formaldehyde model incorporates HCHO from anthropogenic formaldehyde sources, from the decay of biogenic VOCs, and from methane decay. The formaldehyde model also accounts for HCHO losses to CO via oxidation and photolysis. We assume negligible HCHO loss due to deposition. The following sections describe the surface flux emissions inventories and the chemistry mechanisms within the model.

15 2.1.4 Surface fluxes

The STILT-CO model utilizes a variety of different emissions inventories for the purpose of comparing different source estimates. This paper primarily relies upon the US EPA's 1999 National Emissions Inventory (NEI-1999) for anthropogenic CO and formaldehyde emissions ([US EPA, 2004](#); [Frost and McKeen, 2007](#)). Two other inventories for anthropogenic CO provide comparison: an EPA 1993 northeastern regional inventory interpolated across the United States using the correlation between CO and NO_x emissions ([Benkovitz et al., 1996](#); [Gerbig et al., 2003](#)) and the Emissions Database for Global Atmospheric Research 2000 inventory (EDGAR-2000) ([Netherlands EAA, 2005](#)). The EDGAR-2000 inventory has a 1° lat. × 1° deg. lon. resolution whereas both EPA inventories have been re-gridded from counties to a 1/6 deg. lat. by 1/4 deg. lon. resolution. The EPA-1993 and EDGAR-2000 inventories average emissions over the

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year; the STILT-CO model then applies hourly and weekday/weekend scaling factors (Ebel et al., 1997). The NEI-1999 gives average hourly emissions rates over summer months and weekday/weekend scaling factors are applied.

For biogenic VOC emissions, STILT-CO uses the MEGAN (Model of Emissions from Gases and Aerosols from Nature) inventory (Guenther et al., 2006). The MEGAN framework calculates ecosystem-specific emissions scaled to leaf area, light, and temperature. Here we use GEOS-Chem (<http://www.as.harvard.edu/chemistry/trop/geos/index.html>), a global Eulerian atmospheric chemistry model driven by GEOS-4 meteorological fields, to calculate MEGAN fluxes for STILT-CO simulations. We utilize biogenic isoprene, monoterpenes, acetone, and alkenes emissions over the North American continent with a 2-hourly, $2^{\circ} \times 2.5^{\circ}$ resolution. Figure 1 displays a map of mean midday biogenic VOC fluxes over North America from 1 June to 15 August from the MEGAN inventory (Millet et al., 2006; Hudman et al., 2008).

The EDGAR 1995 inventory provides anthropogenic emissions estimates of methane (Netherlands EAA, 1995). The biomass burning component of the STILT-CO model uses daily satellite estimates of biomass burning from Wiedinmyer et al. (2006), who used the MODIS Aqua and Terra satellites to identify fires of size 100 m^2 or larger in North America. The Wiedinmyer et al. (2006) study produces a daily 1 km by 1 km grid estimate of biomass burning emissions across North America ($10\text{--}71^{\circ} \text{ N}$ and -175 to -55° W). The emissions were subsequently regrided to a $1/6 \times 1/4$ degree latitude/longitude resolution for the STILT-CO model.

2.1.5 VOC chemistry

In order to reduce the computational expense of the Lagrangian model, VOC chemistry in the STILT-CO model is simplified from the VOC reactions that occur in nature. We follow as tracers isoprene, monoterpenes, acetone, and higher order alkenes, and represent their decay to HCHO, CO, and finally CO_2 . Reactions (1–3) show the simplified model chemistry. Because not all carbon atoms in VOCs are converted to HCHO or CO, the model applies a yield factor (α) to Reaction (R1). The yield of CO from

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HCHO is subsequently assumed to be one. The model utilizes yield factors of 0.28 (Palmer et al., 2006), 0.15 (Granier et al., 2000), 0.25 (Somnitz et al., 2005), and 0.24 (Duncan et al., 2007) for isoprene, monoterpenes, acetone, and alkenes, respectively. The yield factor for isoprene is based upon low NO_x concentrations, the condition most likely to prevail over the domain sampled by the WLEF tower (see Fig. 8). We take mean VOC decay lifetimes to formaldehyde from empirical satellite formaldehyde column observations: seven hours for isoprene and five hours for monoterpenes (Palmer et al., 2006). We also use a decay lifetime to formaldehyde for acetone of 15 days (Singh et al., 2004; de Reus et al., 2003). These lifetimes scale inversely with diurnal fluctuations in OH from Martinez et al. (2003).



Equations (5–8) show how VOCs decay to HCHO in the STILT-CO model, where k_1 is the decay constant for VOCs, j_2 is the decay constant of HCHO, k_3 is the oxidation rate constant for CO from NASA's Jet Propulsion Laboratory (2006), and α represents the yield factor. HCHO loss rates are taken from the GEOS-Chem model on a 2-hourly 2×2.5 degree lat.-lon. resolution, and CO and CH₄ loss rates are calculated from chemical rate equations. Integrating Eqs. (5–7) gives an expression for the increment of CO at the receptor associated with input of VOCs at time t prior the measurement (corresponding to $t_r - t_m$, see Eq. 8). The analogous closed-form expression is used for formaldehyde concentrations at the receptor.

$$d \frac{[\text{HCHO}]}{dt} = \alpha k_1 [\text{VOC}] - j_2 [\text{HCHO}] \quad (5)$$

$$[\text{HCHO}](t) = \frac{k_1 \alpha [\text{VOC}]_{t=0}}{(k_1 - j_2)} (e^{-k_1 t} - e^{-j_2 t}) \quad (6)$$

$$d \frac{[\text{CO}]}{dt} = j_2[\text{HCHO}] - k_3[\text{OH}][\text{CO}] \quad (7)$$

$$[\text{CO}](t) = \frac{\alpha[\text{VOC}_{t=0}](k_1 * j_2)}{(j_2 - k_1)(j_2 - k_3[\text{OH}])} (e^{-j_2 t} - e^{-k_3[\text{OH}]t}) - \frac{\alpha[\text{VOC}_{t=0}](k_1 * j_2)}{(j_2 - k_1)(k_3[\text{OH}] - k_1)} (e^{-k_1 t} - e^{-k_3[\text{OH}]t}) \quad (8)$$

2.1.6 Additional model chemistry

5 In addition to VOC chemistry, the model incorporates chemistry from CH₄ loss to HCHO, HCHO loss to CO, and CO loss to CO₂. These reactions are included in calculating the CO advected boundary condition, CO and HCHO from the CH₄ boundary condition and surface fluxes, and chemical losses of HCHO surface fluxes. The model calculates CH₄ losses using the reaction constant from [NASA JPL \(2006\)](#) and 2-hourly OH concentrations from the GEOS-Chem model.

2.2 Model optimization framework

15 Inverse modeling provides a powerful tool for using hourly model results to improve emissions estimates and reduce the uncertainty in these inventories. Many existing studies use inverse models to characterize CO sources (e.g. [Kasibhatla et al., 2002](#); [Heald et al., 2003](#); [Petron et al., 2004](#); [Pfister et al., 2005](#)). None of these previous inversions use regional-scale Lagrangian models where source-receptor relationships are highly resolved and transparent.

20 The Bayesian inversion framework used here closely follows the framework of [Gerbig et al. \(2003\)](#) and [Matross et al. \(2006\)](#) in their studies of CO₂ fluxes from vegetation. Here we optimize for overall scaling factors for the anthropogenic CO, biomass burning, and biogenic VOC inventories respectively, incorporating estimates of prior uncertainties in the model and emissions inventories in order to produce a posteriori emissions

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scaling factors. This optimization cannot correct for problems in the spatial distribution of emissions or errors in the transport field, as discussed below.

Following the general inverse methods outlined by Rogers (2000), CO measurements at a tall tower can be related to CO surface sources through the following equation:

$$\mathbf{y} = \mathbf{K} * \mathbf{\Gamma} + \boldsymbol{\varepsilon} \quad (9)$$

where \mathbf{y} is the hourly measured concentration at the tall tower, \mathbf{K} is the Jacobian matrix relating the vector of measured values to the state vector, $\mathbf{\Gamma}$ is the vector of a posteriori scaling factors, and $\boldsymbol{\varepsilon}$ is a vector of errors in the measurements and hourly model results. In the inversion framework, the state space refers to the elements being optimized by the inversion, in this case anthropogenic CO emissions, biogenic VOC emissions, and biomass burning estimates. The non-state space refers to elements other than those being optimized. More specifically, Eq. (10) calculates the a posteriori scaling factors and Eq. (11) calculates the a posteriori uncertainty in trace gas sources.

$$\mathbf{\Gamma}_{\text{post}} = (\mathbf{K}^T \mathbf{S}_{\varepsilon}^{-1} \mathbf{K} + \mathbf{S}_{\text{prior}}^{-1})^{-1} (\mathbf{K}^T \mathbf{S}_{\varepsilon}^{-1} \mathbf{y} + \mathbf{S}_{\text{prior}}^{-1} \mathbf{\Gamma}_{\text{prior}}) \quad (10)$$

$$\mathbf{S}_{\text{post}} = (\mathbf{K}^T \mathbf{S}_{\varepsilon}^{-1} \mathbf{K} + \mathbf{S}_{\text{prior}}^{-1})^{-1} \quad (11)$$

In Eq. (10), \mathbf{y} is the measured CO source signal at the tower: the hourly tall tower CO measurements minus the modeled lateral tracer boundary condition. For a given model run with m hourly data points, \mathbf{y} is a vector of length m . The Jacobian matrix \mathbf{K} of dimensions $m \times n$ relates the measurements to the state vector (where n is the number of factors being optimized). In this case, the first column of the matrix contains the modeled CO fossil fuel signal (for all m receptor points). The second and third columns list the modeled CO signal from VOCs and from biomass burning respectively.

$\mathbf{\Gamma}_{\text{prior}}$, a vector of length n , represents the a priori scaling factors in the state space. Because none of the sources are scaled prior to the inversion, the $\mathbf{\Gamma}_{\text{prior}}$ vector is set to one. $\mathbf{\Gamma}_{\text{post}}$, calculated in Eq. (10), gives the a posteriori scaling factors that optimize

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the CO sources in the state space. The Bayesian framework presented here produces three a posteriori scaling factors to scale the CO source from anthropogenic emissions, VOCs, and biomass burning, respectively.

The $\mathbf{S}_{\text{prior}}$ matrix with dimensions $n \times n$ is the prior error covariance matrix of the elements in the state space. The diagonal elements of the matrix represent the uncertainty in each of the three elements. EPA does not provide error estimates for the NEI-1999, so the uncertainty is estimated at 60% in accordance with the inventory error as estimated by [Hudman et al. \(2008\)](#). [Wiedinmyer et al. \(2006\)](#) and [Pfister et al. \(2005\)](#) estimate uncertainty in the biomass burning inventory a factor of two. Therefore, we use 100% as the a priori uncertainty in the biomass burning estimates. For the CO contribution from VOCs, we use an uncertainty of 30%. ([Palmer et al., 2006](#)) used the GOME satellite to validate the MEGAN biogenic VOC inventory. They find that during the summer of 2001, MEGAN falls within 30% of isoprene measurements inferred from satellite-measured HCHO columns. To obtain the variance for the $\mathbf{S}_{\text{prior}}$ matrix, we multiply these relative uncertainties by the respective CO signal and then square the result to obtain the weighted variance. The errors in the different source emissions are uncorrelated, so we set the non-diagonal elements of the covariance matrix at zero. The \mathbf{S}_{post} matrix (dimensions $n \times n$) given in Eq. (11) lists the a posteriori uncertainty of the elements in the state space.

\mathbf{S}_{ε} is the covariance matrix for all non state space elements (dimensions $m \times m$). Non state space errors include uncertainties in the lateral tracer boundary condition, tall tower CO measurements, and the number of particles used in the STILT-CO model. The variance, or diagonal elements of \mathbf{S}_{ε} , can be represented by the following equation:

$$\mathbf{S}_{\varepsilon} = \mathbf{S}_{\text{obs}} + \mathbf{S}_{\text{background}} + \mathbf{S}_{\text{part}} + \mathbf{S}_{\text{eddy}} + \mathbf{S}_{\text{transp}} + \mathbf{S}_{\text{aggr}} \quad (12)$$

We neglect non-diagonal covariance elements in the error covariance matrix. \mathbf{S}_{obs} represents the instrumentation error in observed CO concentrations at WLEF Tower. We estimate the uncertainty in measured CO values at 5 ppb based on the high and low

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calibration values measured at the tower. S_{obs} is therefore $(5 \text{ ppb})_2$. $S_{\text{background}}$ represents error in the modeled background. Gerbig et al. (2003) estimates the uncertainty in modeled background at 22 ppb. S_{part} quantifies the error introduced by using a finite number of particles, in this case 100 particles. Gerbig et al. (2003) estimates S_{part} at 13% of the modeled surface flux CO signal, making $S_{\text{part}} = [0.13 \times (\text{modeled signal})]^2$.

S_{eddy} represents the variance in the data caused by unresolved turbulent eddies within the planetary boundary layer. Entrainment of surface sources into the boundary layer and uneven vertical mixing cause significant variance of CO concentrations within the boundary layer; this unresolved variability is estimated by S_{eddy} . We quantified S_{eddy} by sampling all COBRA-2004 CO aircraft vertical measurement profiles for the PBL within 50 km of the Argyle Tower in Bangor, ME. We subtracted measured CO values at Argyle Tower from CO aircraft measurements averaged over the entire height of the PBL (see Fig. 2). The square of the standard deviation in the mean difference represents the variance of S_{eddy} , 59.1 ppb².

S_{transp} represents the effect of errors in the modeled height of the planetary boundary layer on modeled CO (see Fig. 3). Matross et al. (2006) calculated observed PBL heights for over 900 COBRA-2004 vertical profiles by examining potential temperature profiles. To approximate S_{transp} , we run the STILT transport model a very small step backward in time and record the PBL height as set by the BRAMS meteorological driver. The BRAMS driver sets the PBL at the midpoint between two vertical layers in the meteorological driver, resulting in discreet modeled PBL heights. We calculate percentage bias in modeled PBL height as outlined in Eq. (13), where z_{measured} is the measured PBL height and z_{modeled} is PBL height as modeled by BRAMS. The correlation (r) between modeled and observed PBL height was 0.64. We multiply the variance in the percentage error by the hourly modeled CO fossil fuel and VOC signals at the tall tower. The method presented here follows that of Gerbig et al. (2003) and Matross et al. (2006). The modeled PBL height shows a mean bias of -96 m, relatively small

compared to the typical height of the PBL (1000–2000 m).

$$\text{Percentage error} = \frac{(Z_{\text{measured}} - Z_{\text{modeled}})}{Z_{\text{modeled}}} \quad (13)$$

\mathbf{S}_{aggr} represents the aggregation error, the uncertainty from formulating the state space as a single scalar for the three source components. To make a conservative estimate of \mathbf{S}_{aggr} , we model hourly CO levels at WLEF Tower using both the highest possible inventory resolution and the coarsest resolution for surface fluxes (16 time larger grid cells than the original inventory) (see Fig. 4). The results show an average bias of only 0.67 ppb, but the variance of 89.17 ppb² is comparable to other error variances and is therefore included in the model.

The Bayesian inversion minimizes the cost function adapted from Rogers (2000) given by Eq. (14).

$$\mathbf{J}(\Gamma) = (\mathbf{y} - \mathbf{K}\Gamma)^T \mathbf{S}_{\epsilon}^{-1} (\mathbf{y} - \mathbf{K}\Gamma) + (\Gamma - \Gamma_{\text{prior}})^T \mathbf{S}_{\text{prior}}^{-1} (\Gamma - \Gamma_{\text{prior}}) \quad (14)$$

2.3 Study site descriptions

Two instrumented towers of the NOAA tall tower network and several aircraft missions provide the data for testing the STILT-CO model and for deriving CO emission rates over the Midwest and Northeast of North America. We focus on data from 1 March–15 August 2004, when comprehensive atmospheric observations are available. The 107 m cell phone tower at Argyle, Maine, just north of Bangor (45.03° N, 68.68° W), was the anchor ground station of the CO₂ Boundary-layer Regional Airborne Experiment in Maine (COBRA-2004), an extensive measurement program using the University of Wyoming King Air platform (NOAA ESRL-GMD, 2007). Modeling carbon monoxide at the Argyle Tower allows for direct comparison with a substantial body of previous work on CO₂ modeling at that site. WLEF, a 450 m tall TV tower near Park Falls in northern Wisconsin (45.93° N, 90.27° W) (Bakwin et al., 1998), provides a second important site for assessing the STILT-CO model and the a priori emission inventories. Because

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WLEF lies in the middle of the continent, it sees very different synoptic transport patterns and emission sources than the coastal region near Argyle. WLEF also received significant CO emissions from biomass burning in both northern Canada and in the southeastern US during the study period, summer 2004 (Turquety et al., 2007).

5 COBRA-2004 aircraft missions, originating at Bangor, ME, complement the tower data. There were 59 flights during the summer of 2004 with over 900 vertical measurement profiles (Lin et al., 2006; Matross et al., 2006) recording CO concentrations at 1 Hz. We also use aircraft data on temperature and water vapor to aid in assessing the model boundary condition through comparisons with free tropospheric measurements. Aircraft flights in the Intercontinental Chemical Transport Experiment (INTEX-A) also measured carbon monoxide at 1Hz, along with formaldehyde, and other trace gas concentrations in the troposphere over the continental United States from 1 July to 15 August 2004 (Singh et al., 2006). We examine here INTEX-A vertical measurement profiles within 1000 km of WLEF tower in order to evaluate the model's ability to simulate the transport of CO from surface sources to altitude. Two different instruments aboard the DC8 aircraft reported HCHO data during INTEX-A: from the National Center for Atmospheric Research (NCAR) and from University of Rhode Island (URI). They disagree by ~30%, apparently reflecting a difference in calibration (Heikes et al., 2001; Wert et al., 2003; Roller et al., 2006). This difference creates challenges in validating model results, as discussed in Sect. 3.4.

3 Results and discussion

3.1 STILT-CO model characteristics

Particles traveling ten days backward in time from WLEF may reach as far as Eastern Russia. Figure 5 shows sample particle trajectories for midday on 18 August 2004. The top panel of the figure displays the model influence function color coded by the time since the particles left the tower. The middle panel shows the footprint influencing

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the WLEF Tower at this time, using the full resolution within the model the entire way back in time, whereas the bottom half of the figure shows the influence footprint after dynamically aggregating surface sources and particle locations far from the receptor. With 100 particles sent out from the receptor point, the influence function calculated from an individual particle is disjoint, but a smooth pattern emerges once STILT aggregates surface fluxes and footprints.

The model multiplies the surface source influence by the surface source inventories, and the sum of the influence-weighted surface fluxes is incrementally added to the advected boundary value to obtain the model concentration at the receptor point, as illustrated in Fig. 6.

Gerbig et al. (2003) found a typical standard deviation of $\sim 13\%$ in the CO_2 surface source signal, due to statistical fluctuation associated with the use of a finite ensemble of 100 particles. Since sources tend to be more spatially concentrated for CO than for CO_2 , we tested model simulations using both 100 and 500 particles to determine the number required for accurate simulations. Figure 7 shows a scatter plot of simulated CO and formaldehyde concentrations for INTEX-A aircraft flights using both 100 and 500 particles. At low trace gas concentrations, both plots show relatively little scatter. These points represent model results at high altitudes with small surface flux influence, and particle number makes little difference. Model results for higher CO concentrations represent aircraft receptor points within the planetary boundary layer that experience significant influence from surface fluxes. These results show significantly higher variance; model particle number is associated with incomplete sampling of the surface emissions. The effect on modeled CO of increasing particle number from 100 to 500 was relatively small, however, with a mean difference of only 0.32 ppb for the INTEX-A data and standard deviation of 7.1 ppb. For HCHO, the mean difference and standard deviation were 0.03 ppb and 0.15 ppb, respectively. Since the associated statistical variance is much smaller than other sources of error, the marginal improvement in model performance did not justify the (5 \times) computational cost.

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3.2 Regional CO sources derived from comparing model and data at a tall tower

The WLEF tower saw substantial influence from northern Canada during summer months (Fig. 8). Areas of Nunavut and Northwest Territories in Canada exerted as much influence on WLEF Tower data as air from Indianapolis and Detroit, even though WLEF Tower is over a thousand kilometers closer to these American cities.

The a priori model systematically overestimates CO concentrations at WLEF compared to measurements (Fig. 9). The model time series for both EPA NAPAP 1993 and EPA NEI-1999 show pollution-related peaks well-correlated with observations, indicating good spatial accuracy for the assumed emissions, but the magnitudes of pollution peaks are far too large. The bias appears therefore to be directly attributable to errors in the magnitude of the fossil fuel emissions from the inventories. Model results with EDGAR-2000 reveal large inaccuracies in the inventory both spatially and in terms of total emissions, with peaks and troughs appearing where none exist in the tower measurements (see Fig. 9). Evidently EDGAR-2000 does not represent a good prior for analysis of CO emissions in this region, and we therefore use the most recent EPA-1999 inventory as our prior (results are similar using EPA-1993).

We conducted separate model inversions for the WLEF Tower in spring and summer and produced posteriori scaling factors (λ) simultaneously for three factors: λ_{ff} (anthropogenic CO emissions), λ_{bb} (biomass burning emissions, prior from Wiedinmyer et al., 2006), and λ_{VOC} (prior from the MEGAN inventory). For early summer, prior to the arrival of large signals from boreal biomass fires, the optimal values for λ_{ff} , λ_{bb} , and λ_{VOC} were 0.24 ± 0.07 , 0.50 ± 0.30 , 1.57 ± 0.52 , respectively. (Note, that value of λ_{VOC} is strictly a constraint on MEGHAN fluxes \times Co yield, not on VOC fluxes themselves.).

The scaling factor for VOC emissions in summer was highly correlated with fossil fuel emissions ($r=0.81$), as illustrated in Fig. 10. For this figure, we set fossil fuel scaling factors (x-axis) and VOC scaling factors (y-axis) at prescribed values, and optimized only for biomass burning scaling factors. The cost function has a narrow valley: the minimum fell along a line given by $\lambda_{ff} = -0.11(\lambda_{VOC}) + 0.41$.

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Formaldehyde data, available for INTEX-A flights, provide an additional constraint on the inversion to help determine optimal scaling factors for both VOCs and fossil fuel CO emissions. The contour lines overlaying the surface plot show the root mean squared error of the formaldehyde model result for INTEX-A vertical aircraft profiles with the prescribed set of CO and VOC scaling factors (see discussion in Sect. 3.4, below). Since HCHO emissions from fossil sources are small, model results are almost independent of the scaling factor for fossil fuels. We can therefore find optimum scaling factors on the cost function minimum that also minimize RMSE for the HCHO model for INTEX-A flights near the WLEF tower.

Due to the difference in calibrations for URI and NCAR data, we obtain two different optimal scaling factors (0.65 or 1.2, respectively) for the effective CO sources from VOCs as indicated by fidelity with INTEX-A HCHO data. The corresponding optimal fossil fuel scaling factor changes relatively little (0.3 and 0.34, respectively) for the NCAR or URI calibration. If we use the NCAR results, the minimum cost function lies very close to the global minimum for the three-factor optimization on CO data from WLEF, whereas the lower VOC sources implied by the URI give results that are less consistent. We infer that the HCHO production rates implied by the NCAR calibration for INTEX-A are most consistent with the VOC contributions to CO obtained at WLEF. By this measure the URI calibration appears to be too low.

If we adopt the NCAR calibration on the basis of consistency with WLEF CO data, the optimized scaling factors using CO data from WLEF and HCHO data from INTEX-A are respectively 0.3 ± 0.05 and 1.2 ± 0.4 ($\sim 95\%$ CI) for CO sources from combustion of fossil fuel and from degradation of biogenic VOCs. At WLEF this model has a posterior residual RMS error of 10.4 ppb (compared to an a priori RMSE of 34.4 ppb) and a Pearson's correlation coefficient (r) of 0.81. The upper two panels of Fig. 11 display the a priori and a posteriori time series at WLEF for June and early July, before the advent of high levels of CO from boreal fires (third panel). The bottom panel of Fig. 11 shows the model-generated concentrations of HCHO at WLEF, showing that measurements of formaldehyde at this site would be very effective in distinguishing CO from fossil fuels

versus VOCs.

Our estimated VOC scaling factor (1.2) can be compared to the results of Palmer et al. (2006), who found that during early summer months, MEGAN estimates of VOC emissions were 10% lower than GOME satellite-derived estimates (i.e. scaling factor of 1.1). Our estimate of λ_{ff} also corresponds roughly to the scaling factor $\lambda_{ff}=0.4$ derived independently by Hudman et al. (2008) using INTEX-A data for CO, which we did not use in our optimization.

During the spring, CO emissions from fossil fuel combustion are expected to be higher than in summer, while sources from VOCs and biomass fires are lower. Inversion results for WLEF during the spring indeed indicate a higher CO scaling factor for fossil fuels, 0.55 ± 0.05 , a biomass burning factor of 0.47 ± 0.28 , and a VOC scaling factor of 1.01 ± 0.24 (see Fig. 12 for the a priori and a posteriori time series), suggesting notably stronger seasonal variations than adopted in the inventories (see below). The inversion reduces the cost function from 246.7 to 97.4 (60.5% reduction), with a correlation coefficient (r) of 0.57, and a residual RMS error of 16.2 ppb for hourly data. Since fossil fuel emissions are the dominant source during this period, constraints are strongest for the a posteriori fossil fuel scaling factor (λ_{ff}). There were some biomass fires to the south of the site, only a few hundred km away, and these sources are moderately well constrained. Figure 13 provides a contour plot of the cost function for the spring inversion. The plot for the spring months shows a clearer minimum than for summer, albeit with a fairly large range for λ_{VOC} .

The NEI-99 inventory data is only available for typical mid-week summer days and typical mid-week winter days. We note that the scaling factor λ_{ff} for the NEI-1999 inventory during the summer months (1 June–15 August) makes a much larger reduction than the scaling factor for spring months (1 March–30 April). The a priori inventory was for summer. During colder months in the upper Midwest, CO emissions could be higher because of less efficient combustion from mobile sources, plus sources from home heating using wood fuel. The NEI-99 inventory predicts that total national CO emissions will be slightly lower during winter months than during the summer. On-road

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sources are predicted to be 5% higher during winter months and area sources such as home fuel burning are about three times higher during the winter. But non-road sources such as tractors and construction equipment are estimated to be 97% higher during summer months. Our results from spring months do not reflect an overall increase in emissions from winter to summer and therefore cast doubt on the seasonal adjustments used in NEI-1999, although it is possible that off-road sources are already active in March/April.

The results from WLEF during the spring months could reflect regional differences in the seasonal variability of emissions because the upper Midwest has particularly cold winter and spring months, and more use of wood fuel than other regions (Fernandes et al., 2007). A study by Meszaros et al. (2004) found seasonal adjustments in European CO emissions that predicted 10% higher emissions during spring than during summer. Europe is not as cold as the region around WLEF, so the seasonal trend might be expected to be even larger in Wisconsin.

Figure 14 shows scatter plots of hourly data (model vs observed) for WLEF in summer and spring and for Argyle, ME, in summer, using the a posteriori scaling from WLEF. As discussed below, model results at Argyle Tower are significantly affected by problems in modeling transport near the coast, and INTEX-A model results appear to be significantly influenced by errors associated with the boundary condition. Below we examine model results for these data sets to understand the factors that limit model performance in order to guide future model development and to help design strategies for future observing programs.

3.3 Biomass burning and STILT-CO

In general, STILT-CO appeared to do well at capturing the influence of CO from biomass burning emissions in the near field, but it was inconsistent in capturing emissions influence from very large fires that were far away. The time series from WLEF Tower in spring 2004 (Fig. 12) shows that even during the spring months, biomass burning can substantially influence pollution levels at the tower site. The influence of

biomass burning events in Missouri and Arkansas were accurately characterized by STILT-CO during this time period.

Figure 15, an example from WLEF Tower during August 2004, displays an example where STILT-CO did provide a very detailed, high resolution prediction of distant CO source regions. The particle trajectories left the WLEF Tower, traveled backward in time toward northern Canada, and intersected large forest fires near Great Slave Lake, in the Yukon Territories, and in eastern Alaska. The pollution influence was modestly overestimated. Figure 16 displays a time series from WLEF Tower during the latter half of summer 2004 when WLEF Tower experienced significant pollution from forest fires in Alaska and Northern Canada. Most of the time, the model did find influence from these forest fire influences, but incorrectly computed the magnitude of this influence.

The lack of pyro-convective injection in the model may account, in part, for why the model performed very well on relatively small fires in the near field, but showed mixed performance in capturing the influence of very large fires at a long distance. Small fires may lack the intensity to inject emissions above the PBL. Evidently there are too few fires (especially large fires) well simulated by STILT-CO to produce a reliable inventory scaling factor for biomass burning from the model optimization. Sites closer to the fire region would be needed for this purpose.

3.4 CO concentration trends with altitude: insights from the INTEX-A aircraft campaign

We noted above that formaldehyde data provide a potentially powerful way for independently constraining the influence of summertime emissions of VOCs on CO. The STILT-CO model using the MEGAN inventory and the HCHO yields from Palmer et al. (2006) captures measured HCHO for many INTEX-A vertical aircraft profiles in the US continental interior during summer 2004 (see a posteriori results in Fig. 17), although the results have a fairly large variance (Fig. 18). The vertical profiles of HCHO could validate model chemistry and provide a confirmation of inverse model results independent of fossil fuel and biomass burning CO influence, if the calibration difference could

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be resolved. INTEX-A vertical profiles of CO confirm that the STILT-CO model replicates CO measurements at aircraft receptor points as well as at tall tower sites, using our optimized values $\lambda_{\text{VOC}}=1.2$ and $\lambda_{\text{ff}}=0.3$, although background values in the model appear to be about 20 ppb too low (Fig. 18).

5 3.5 Model limitations: case studies from Argyle Tower, Maine

3.5.1 Coastal meteorology

The correlation between model and measurement is generally much lower at Argyle than at WLEF (RMSE=22.9 ppb, $r=0.40$; Fig. 14). Figure 19 displays a time series of STILT-CO results from Argyle during the summer of 2004. The model missed pollution peaks much more frequently than at WLEF. For example, on 14 July modeled air parcels became caught in low pressure front and just missed urban coastal sources, whereas the observations indicate strong influence from those sources. The model also created pollution peaks that don't exist, such as on 3 June when parcels traveled along an occluded front and pushed too close to coastal urban sources, sources that apparently did not influence Argyle at that time.

The BRAMS assimilated meteorological driver has a 45-km resolution. Many large sources affecting Argyle lie right on the coast, and Argyle itself lies within one grid square of the coast. We infer that our 45-km meteorological grid is not able to reliably resolve the influence of strong, very compact sources that lie on the land-ocean boundary. Over the summer of 2004, an average 54% of particles in each ensemble traveled into the coastal domain for at least a portion of the particle trajectory, a feature that make the receptor at Argyle more difficult to model than WLEF.

The WLEF Tower lies close to large water bodies such as Lake Superior and Lake Michigan. These lakes are large enough to generate land/water mesoscale circulations, but they are much smaller than synoptic scales and exert much less influence on synoptic meteorology than the ocean. Lake Superior also lacks large anthropogenic CO sources on the coastline. Model results for COBRA-2004 aircraft flights near

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the New England coast (not shown) similarly show lower model-measurement fit than INTEX-A aircraft profiles taken in the continental interior.

3.5.2 Advected boundary condition

Previous Lagrangian models of carbon monoxide have used a constant boundary condition (e.g. [Warneke et al., 2006](#)). However, at WLEF Tower, the advected boundary condition varies by as much as 40 ppb over 10 days (see Fig. 12), suggesting the variability in the boundary condition may contribute significantly to variability in observed CO. [Washenfelder et al. \(2006\)](#) drew a similar conclusion for CO₂. Extensive high-altitude measurements (5000–7000 m) from COBRA-Maine airborne near Argyle Tower during the summer of 2004 provide an excellent opportunity to examine the model treatment of the lateral tracer boundary condition in STILT-CO for receptors at the eastern edge of North America ([Lin et al., 2006](#)). During times with relatively little biomass burning influence, these altitudes provide free troposphere trace gas concentrations that often experience little influence from anthropogenic and vegetation fluxes of CO and CO₂. Measurements therefore approximate the lateral tracer boundary condition, within a few ppb for CO and a few ppm for CO₂ ([Matross et al., 2006](#)).

Comparison between modeled and measured CO in the free troposphere near Argyle tower shows substantial scatter (not shown), but in general, the model appears to moderately underestimate the advected boundary concentrations of CO – by 19.5 ppb ± 28.1 ppb. The notable variability in the free troposphere measurements indicates that a variable boundary condition is important. The present version of STILT-CO used a model boundary condition applied at the western edge of the modeled domain because neither measurement stations nor global model results were available to define concentrations at other boundaries. This rough approximation affects Argyle more than WLEF: as the particles traveled backward in time from Argyle Tower during the summer of 2004, 10.5% of particles exited the domain to the North, 3% exited to the East, and 86% remained in the modeled domain. Hence, East Coast receptors need to be modeled using a different approach for the boundaries, as has been done for CO₂

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by using Carbon Tracker concentrations (Peters et al., 2007) (Matross, 2006¹). Global Eulerian models such as GEOS-Chem may provide another option for boundary conditions in Lagrangian modeling.

3.6 Relative importance of combustion CO and formaldehyde sources

5 According to our analysis, at WLEF during the summer of 2004, anthropogenic emissions accounted for only 31% of CO contributions to observation concentrations, biogenic VOCs contributed 21.2%, methane decomposition accounted for 35.3%, and biomass burning for 12.7% (see Fig. 20). In the formaldehyde model, primary emission sources accounted for only 0.4% of modeled atmospheric HCHO while VOC and methane decomposition accounted for 70.8% and 28.8% of advected HCHO, respectively.

The regional influence of VOCs as determined by the STILT-CO model is generally consistent with recent literature. Hudman et al. (2008) Hudman et al. (2008) found that biogenic VOCs contributed 56% of the CO source over the continental US during the summer. Granier et al. (2000) found that VOCs contributed 21% of the global CO burden over the course of the a year, and Holloway et al. (2000) found biogenic VOCs to be 27% of the global CO source. Hudman et al. (2008) estimated a higher VOC contribution because they did not include the methane CO source in calculating the relative significance of different sources. STILT-CO gives a regional perspective for CO sources in the central US, complementing at very high resolution earlier attempts to refine CO sources (e.g. Parrish, 2006; Palmer et al., 2006; Warneke et al., 2006; Hudman et al., 2008). The results show that VOC (CH₄ and biogenic compounds) sources of CO significantly exceed anthropogenic CO emissions during summer months, even in areas of relatively lower biogenic VOC emissions such as in Wisconsin and the upper Midwest. The model reveals that estimates of anthropogenic CO sources in current inventories

¹Matross, D.: Regional scale land-atmosphere carbon dioxide exchange: data design and inversion within a receptor, Ph.D. thesis, Harvard University, 2006.

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are too high by up to a factor of three in summer and a factor of two in spring.

4 Conclusions

STILT-CO produces hourly results for carbon monoxide concentrations that closely correlate with measurements at a variety of different tall tower sites. The model performs particularly well in the continental interior, resolving the influence of fossil fuel combustion, degradation of VOCs and CH₄, and forest fires (when biomass burning events lie within a few hundred km). STILT-CO can give accurate hourly concentration levels throughout the lower troposphere at high spatial and temporal resolutions, providing strong tests of source inventories on scales spanning regional to continental.

Our results showed that the fossil fuel inventories were spatially accurate, at least within the fairly broad footprint of the WLEF tower, as inferred from the very good model measurement fit at WLEF during the first half of the summer, when biomass burning contributions are relatively small. When using models of trace gases with more diffuse sources, like CO₂ (e.g. Gerbig et al., 2003; Matross et al., 2006), it can be difficult to differentiate between model errors that are caused by trace gas sources and those caused by modeled meteorology. STILT-CO provides a powerful diagnostic tool for models of trace gases like CO₂ that have more diffuse sources because it helps distinguish when model-data differences reflect errors in transport, versus errors in the underlying emission field.

Model results demonstrate that current fossil fuel emissions inventories systematically overestimate surface sources, by roughly a factor of three in summer for EPA's NEI-1999, and a factor of two in spring. The seasonal adjustment factors in NEI-1999 also appeared to be inaccurate according to our analysis, at least for the upper Midwest. VOC emissions estimates from Guenther et al. (2006) (multiplied by the HCHO yield) appeared to be reasonably accurate, as inferred from both CO and HCHO simulations.

Data from sites in the continental US showed limited ability to validate biomass burn-

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ing emissions estimates because sampling errors and transport errors overshadowed errors in estimated emission rates for regions in Alaska and northern Canada, where very large sources at long distances represent major contributors. Analysis of data from tower sites in north-central Canada, closer to these sources, could be very effective in validating emissions estimates for these large fires.

Trace gas modeling of any kind is difficult in coastal regions like the Eastern Seaboard because most meteorological drivers do not perform well at the ocean-land interface. Especially where the sources of the modeled trace gas are diffuse, these transport problems may not be readily apparent. But for CO, with concentrated source regions on the coast, the problems are obvious. Any modeling study must approach coastal areas with caution, unless the study can assure accurate simulation of coastal meteorology.

Lateral tracer boundary conditions require close attention. A variable modeled boundary condition is crucial to modeling regardless of the spatial resolution of the model result. The boundary condition holds special importance when building models intended for examining trace gas sources on regional scales. Without an accurate, time-varying boundary condition, a source-receptor model can not accurately characterize emissions estimates because the modeled fossil fuel signal can be conflated with background errors.

Our study demonstrates that, from only one tall tower receptor site, the high-resolution STILT-CO model can produce very detailed information on emission sources and meteorology over a large geographic area. The model can also accurately test and correct emissions inventories for a large portion of the continent. STILT-CO shows wide promise to model carbon monoxide and other trace gases to determine sources and sinks with high accuracy and reliability, applicable to any trace gas that undergoes relatively simple chemistry during transport.

Acknowledgements. We thank NOAA scientists Stuart McKeen and Gregory Frost for providing the EPA NEI 1999 inventory data. Paul Novelli also provided crucial data from NOAA GMD measurement sites. We are grateful to Christine Wiedinmyer for her help with the biomass

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burning inventory. Without the help of Daniel Jacob from Harvard, this project would not have been nearly as successful. We thank RCC Atlantic, Inc. and Unicel for access to the transmitter tower in Argyle, Maine and the State of Wisconsin Educational Communications Board for use of the WLEF-TV transmitter tower and facilities in Park Falls, Wisconsin. Dan Baumann and John Lee provide local technical support for the tower sites, and Peter Bakwin, Conglong Zhao and Bill Munger made substantial contributions to tower measurement effort. Paul Novelli provided calibrated CO standards for the tower measurements.

This research would not have been possible without a Harvard University Center for the Environment Grant and the Harvard Dean's Summer Research Award. This work was supported by NSF Award ATM-0221850 (Biocomplexity in the Environment) and by grants DE-FG02-07ER64358 (US Dept. of Energy), NNX06AE83G (NASA) and NCC5-684 to Harvard University. The opinions expressed herein are not represented as expressing the views of any of the sponsoring agencies.

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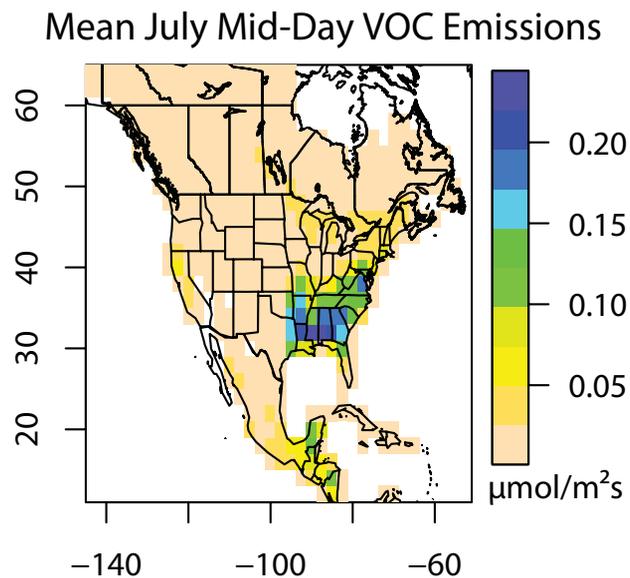


Fig. 1. Mean midday vegetation VOC fluxes over North America from the MEGAN inventory (Guenther et al., 2006). The highest VOC emissions occur over the American Deep South.

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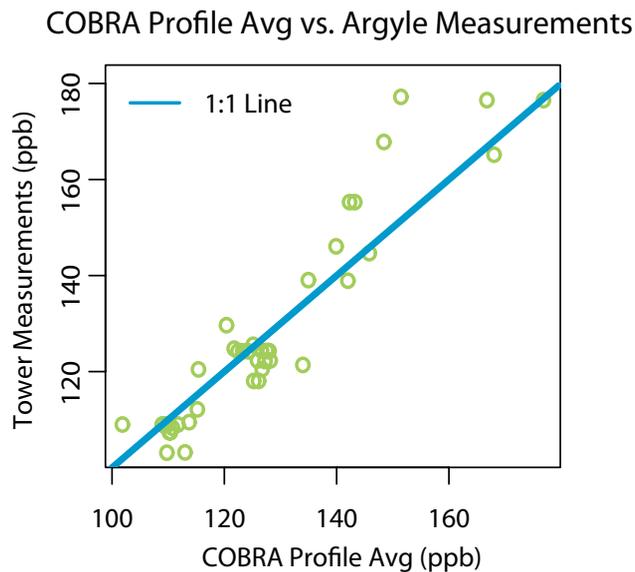


Fig. 2. Argyle Tower CO measurements plotted against mean CO values in the PBL taken from COBRA-2004 aircraft measurements within 50 km of the tower. The mean bias between COBRA and Argyle measurements is -0.423 ppb and the standard deviation is 7.8 ppb.

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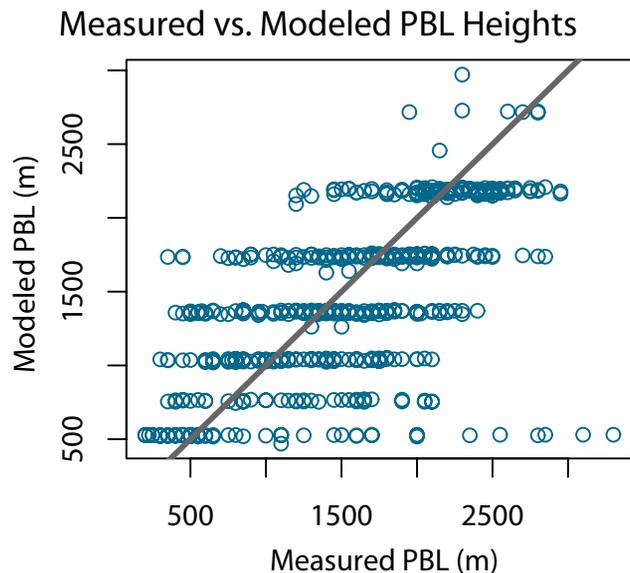


Fig. 3. Height of the PBL as measured in COBRA aircraft profiles is plotted against the PBL height set by the BRAMS domain. The grey line is a 1:1 line superimposed over the data.

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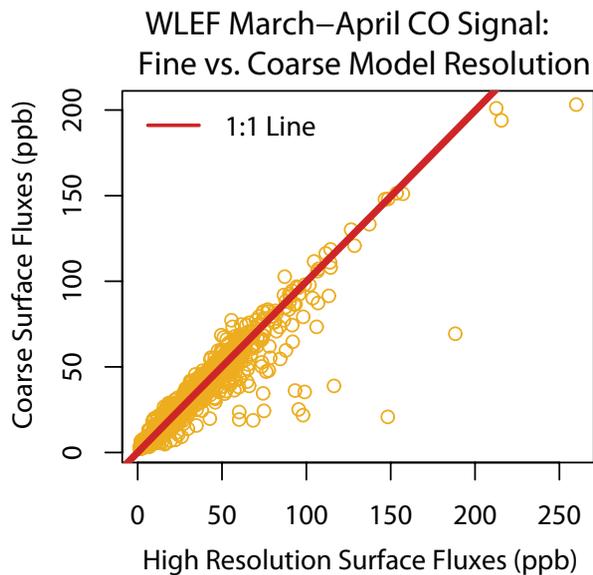


Fig. 4. A plot showing the hourly modeled CO signal with surface fluxes at the highest and lowest resolutions. This plot shows the modeled CO signal, meaning that the results do not include CO from the boundary condition. The red line is a 1:1 line superimposed over the data.

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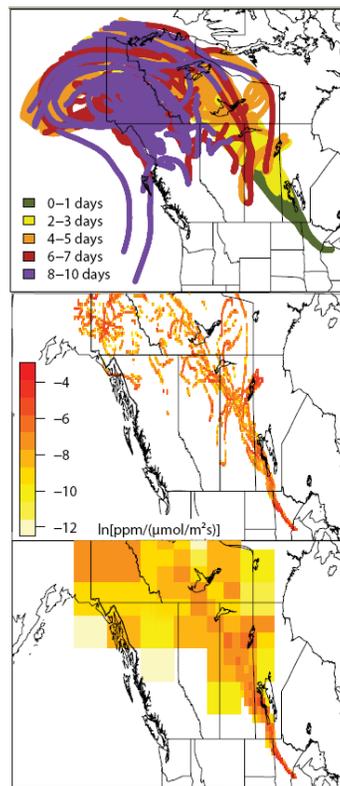


Fig. 5. An example of STILT-CO particle trajectories from 18 August 2004. The top panel of the figure shows the particles traveling backward in time away from the WLEF tower. The particles are color-coded by time away from the tower. The middle panel shows the logarithmic influence footprint in units $\ln(\text{ppm}/(\mu\text{mol}/\text{m}^2\text{s}^{-1}))$ with the maximum resolution while the bottom panel displays the logarithmic influence footprint with dynamic gridding.

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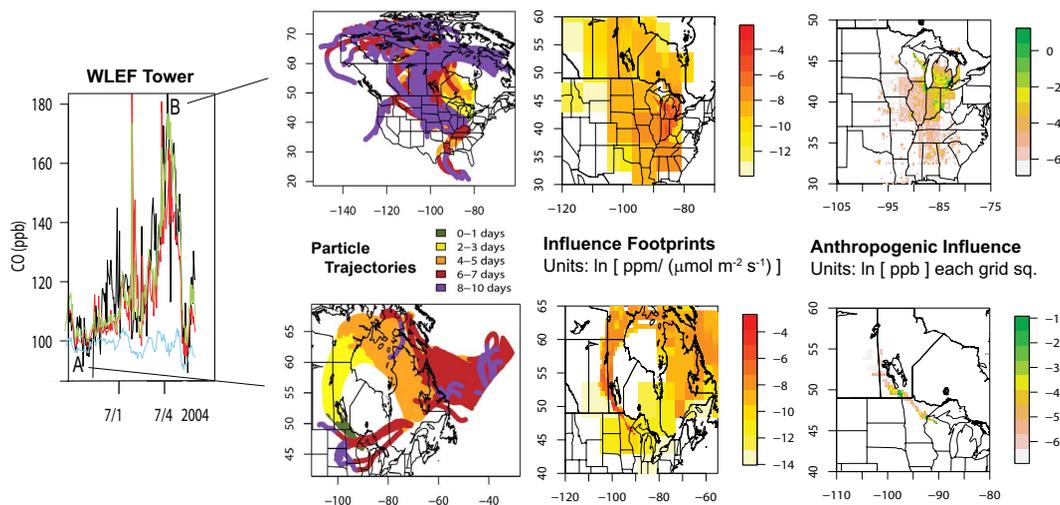


Fig. 6. An illustration of how the particle trajectories and influence footprint work in tandem to produce modeled hourly concentrations. Particle trajectories are color coded by time away from the tower. The influence footprint is multiplied by the emissions inventories to produce the enhancement maps. The enhancement contributions are then summed over the entire modeled domain to produce modeled hourly concentrations. Period A illustrates a time of low concentrations whereas period B is highly influenced by urban areas such as Detroit and Chicago.

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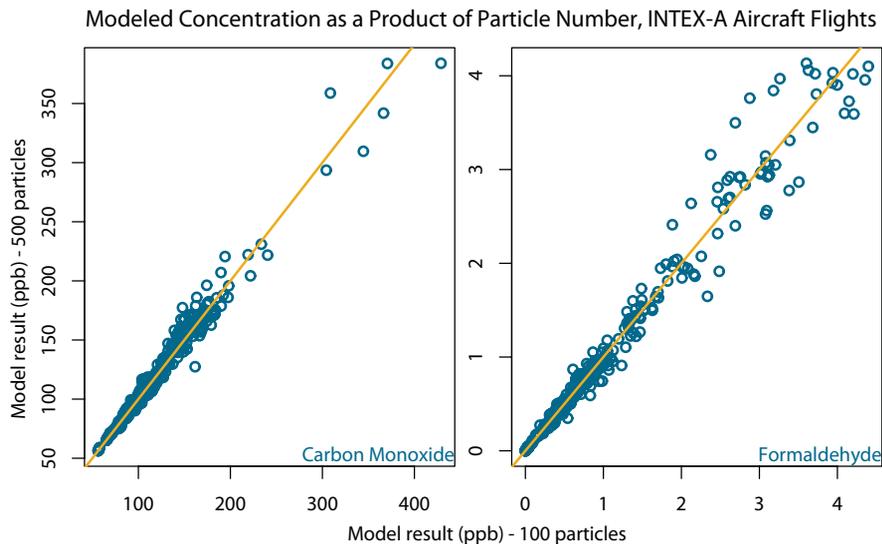


Fig. 7. Model results for the INTEX-A aircraft missions as a product of the number of particles used in model simulations.

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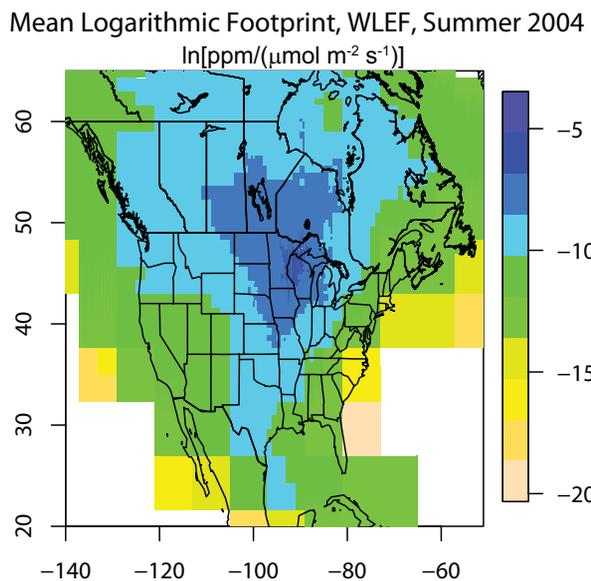


Fig. 8. The mean influence footprint in units $\ln(\text{ppm}/(\mu\text{mol m}^{-2} \text{s}^{-1}))$ for the WLEF Tower averaged over the summer of 2004.

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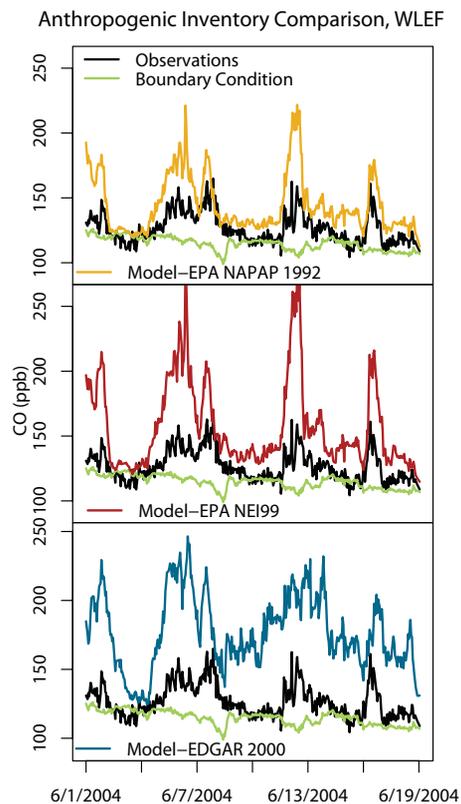


Fig. 9. A comparison of CO concentrations computed by several a priori anthropogenic CO emissions inventories. All inventories overestimate anthropogenic CO concentrations.

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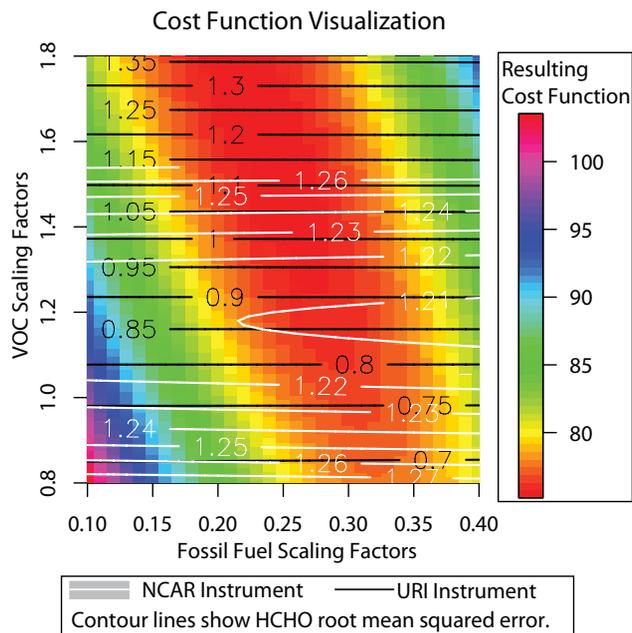


Fig. 10. A visualization of the Bayesian inversion cost function at WLEF for the summer months. The fossil fuel and VOC scaling factors are set to discrete values. The biomass burning scaling factor is allowed to float with the inversion. The surface plot shows that there is no clear single optimum in the Bayesian Inversion. The contour lines show the RMSE of model results for INTEX-A formaldehyde aircraft profiles near the WLEF tower. Based on this plot, we choose a final fossil fuel scaling factor of 0.3 and a VOC factor of 1.2.

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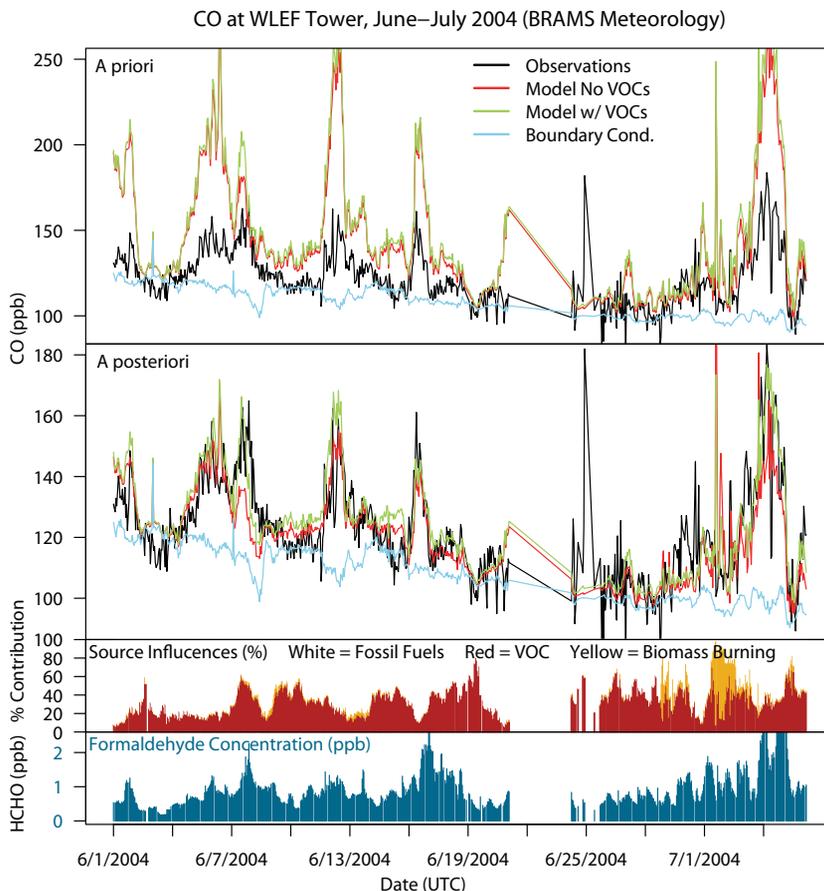
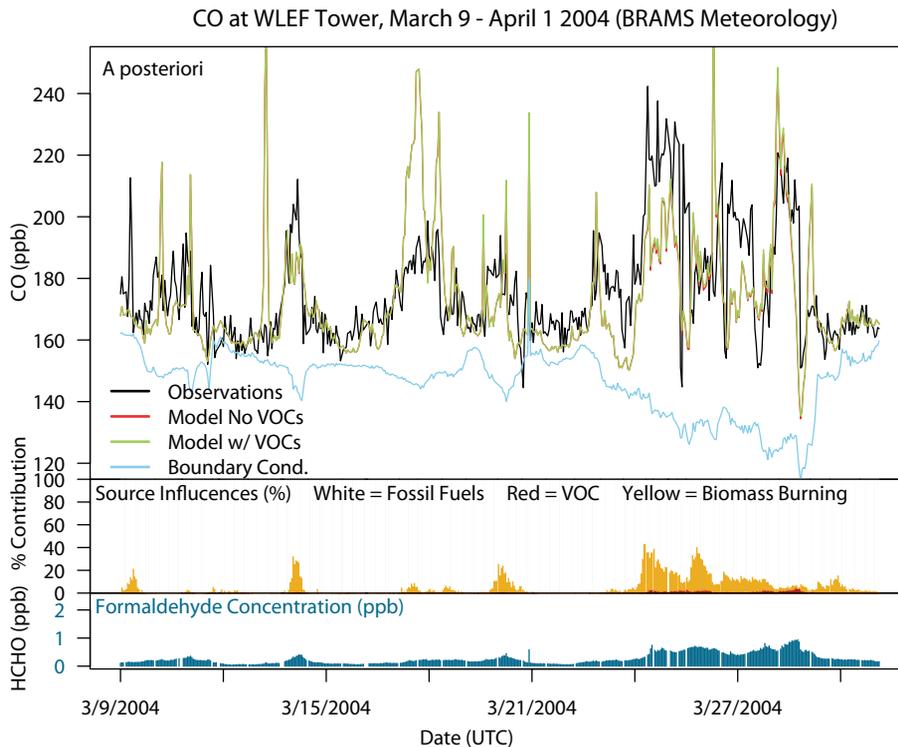


Fig. 11. Hourly model results from WLEF during June 2004. The a priori results are shown on top followed by the a posteriori results below. The bottom two panels respectively display the relative importance of different CO sources and the corresponding formaldehyde model results during the period.

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**Fig. 12.** Hourly WLEF model results during the spring of 2004.[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

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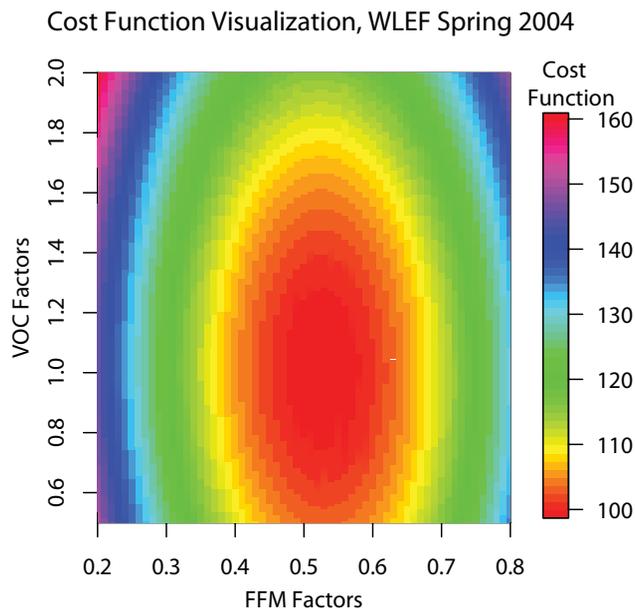


Fig. 13. A visualization of the Bayesian inversion cost function for WLEF during March–April. The plot is constructed in the same way as Fig. 10. Unlike the summer model results, which show no clear minimum in the cost function, the spring 2004 model results show a much clearer optimum.

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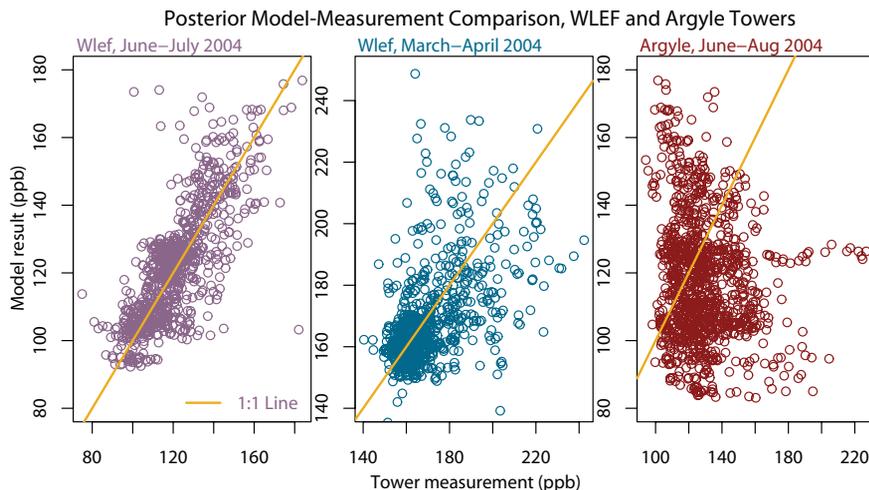


Fig. 14. A comparison of model and measurements at Argyle and WLEF Towers. The WLEF summer and Argyle summer plots use a posteriori scaling factors from the inversion at WLEF in June and July. WLEF from spring months is inverted separately.

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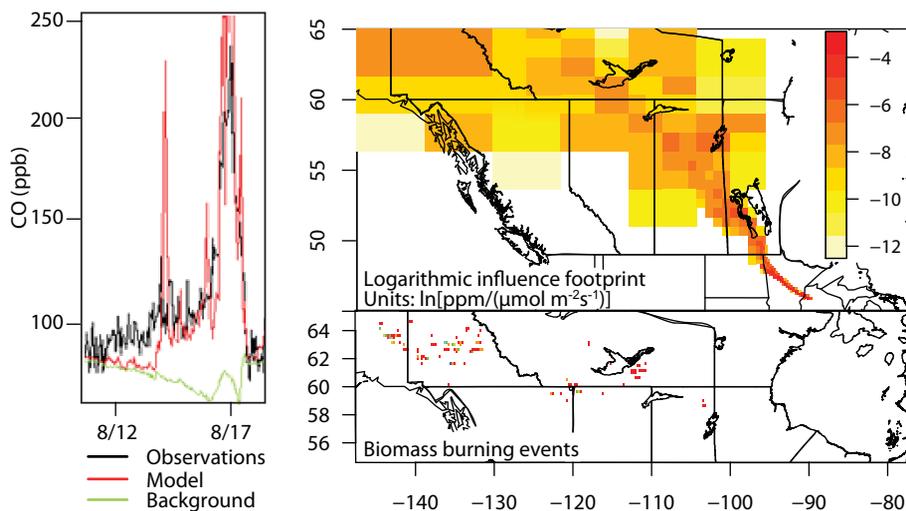


Fig. 15. An example of the influence footprint (top) and biomass burning inventory (bottom) on 17 August 2004 – a period when biomass burning significantly influences pollution levels at the WLEF tower.

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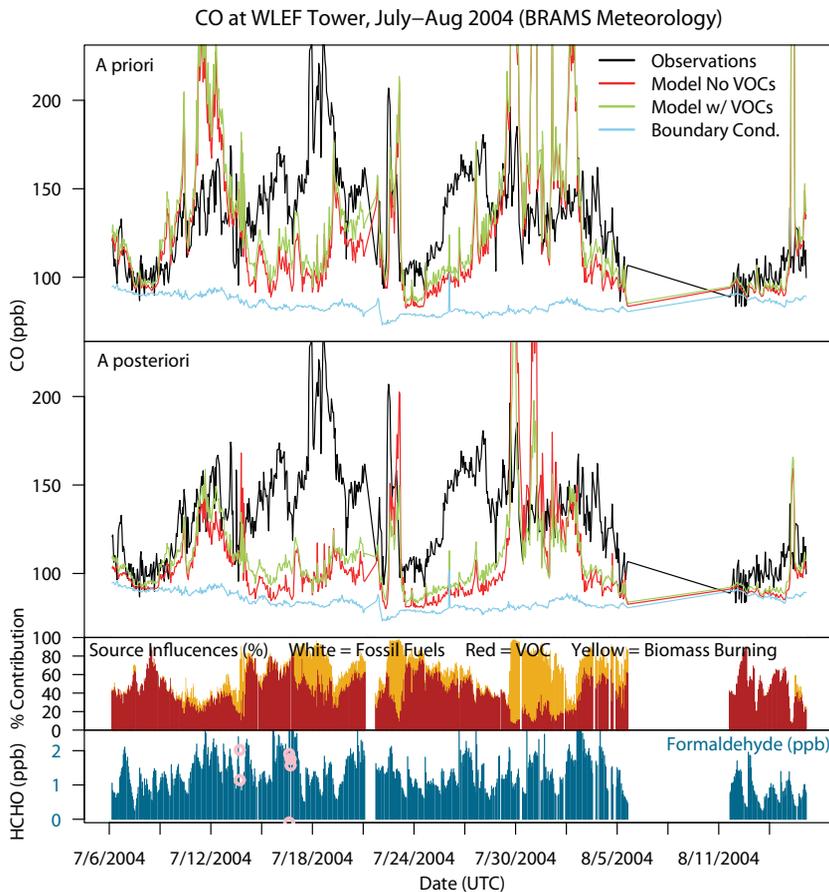


Fig. 16. Hourly modeled result at WLEF Tower during July and August 2004, a period that saw significant pollution influence from biomass burning events in Alaska and northern Canada. INTEX-A aircraft measurements of HCHO taken near the WLEF Tower are shown as pink dots.

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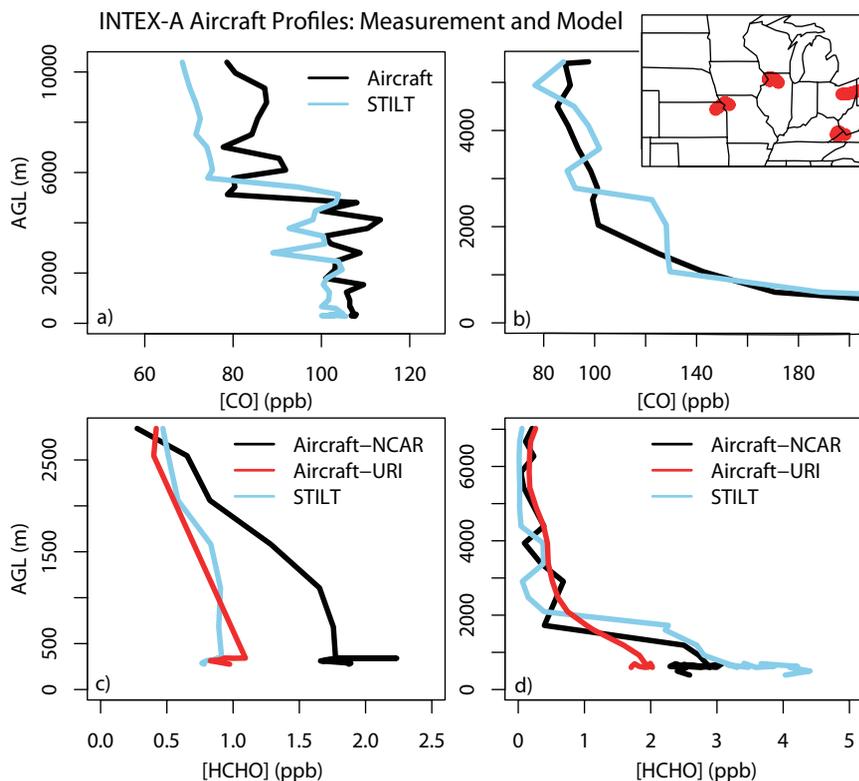


Fig. 17. Model results for INTEX-A vertical measurement profiles taken over the Midwestern US during the summer of 2004. The map displays the locations of the different profiles. The top two profiles show CO model results from (a) 8 July and (b) 10 July. Profiles (c) and (d) show formaldehyde model results from 6 July and 11 August, respectively.

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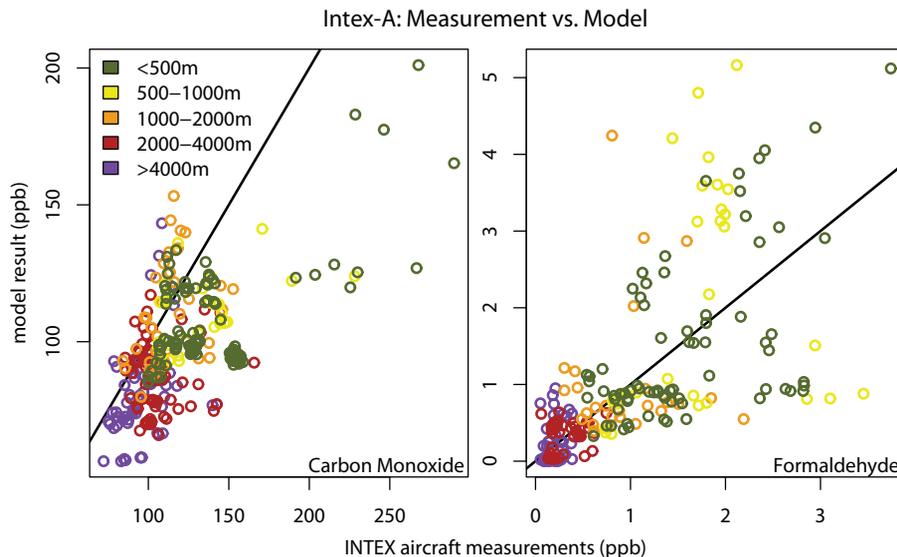


Fig. 18. A comparison of INTEX-A model results and aircraft measurements. Results are color coded by height above ground level (in meters). The black lines are 1:1 lines.

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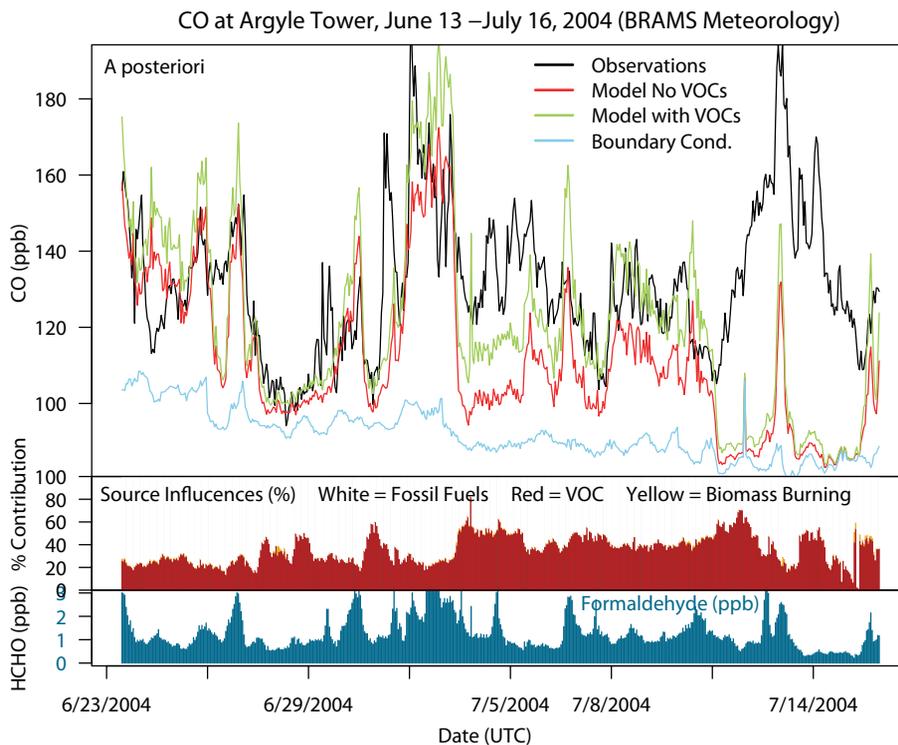


Fig. 19. Hourly model results from Argyle Tower, Maine, during the summer of 2004. A priori results are shown in the top panel followed by a posteriori results below.

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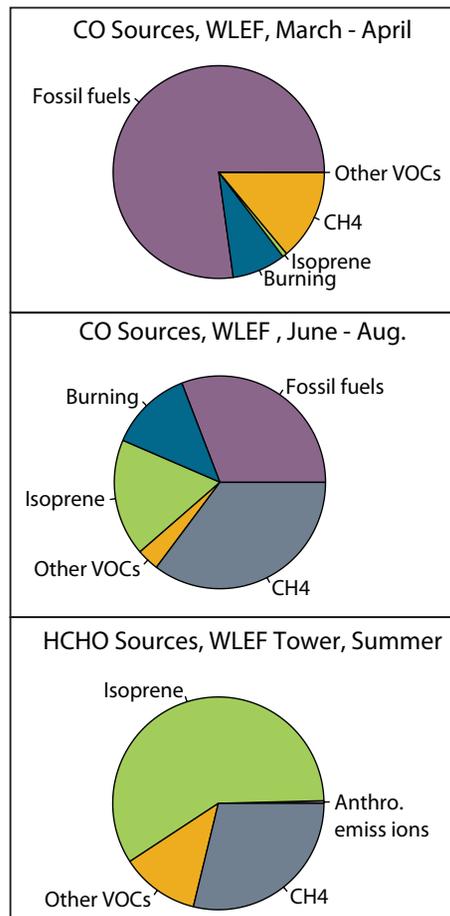


Fig. 20. The relative importance of different CO and HCHO sources at WLEF Tower during both spring and summer months.

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