



UNITED NATIONS EDUCATIONAL, SCIENTIFIC AND CULTURAL ORGANIZATION  
**INTERNATIONAL CENTRE FOR THEORETICAL PHYSICS**  
I.C.T.P., P.O. BOX 586, 34100 TRIESTE, ITALY, CABLE: CENTRATOM TRIESTE



UNITED NATIONS INDUSTRIAL DEVELOPMENT ORGANIZATION



## **INTERNATIONAL CENTRE FOR SCIENCE AND HIGH TECHNOLOGY**

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**SMR.648 - 27**

### **SECOND AUTUMN WORKSHOP ON MATHEMATICAL ECOLOGY**

**(2 - 20 November 1992)**

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#### **"The Role of the Biosphere in Climate Change"**

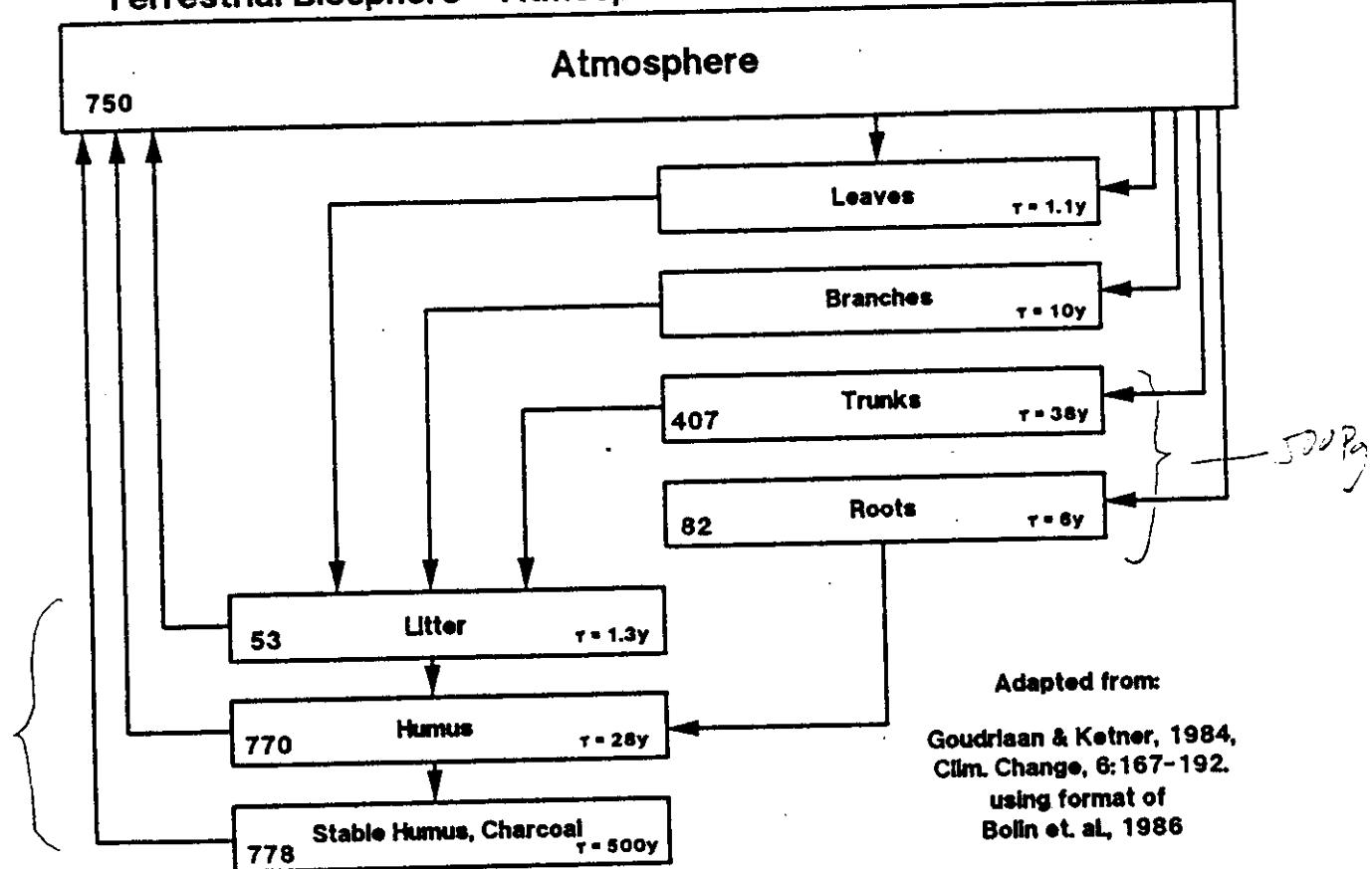
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**Environmental Research Laboratory**  
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**Athens, GA 30613**  
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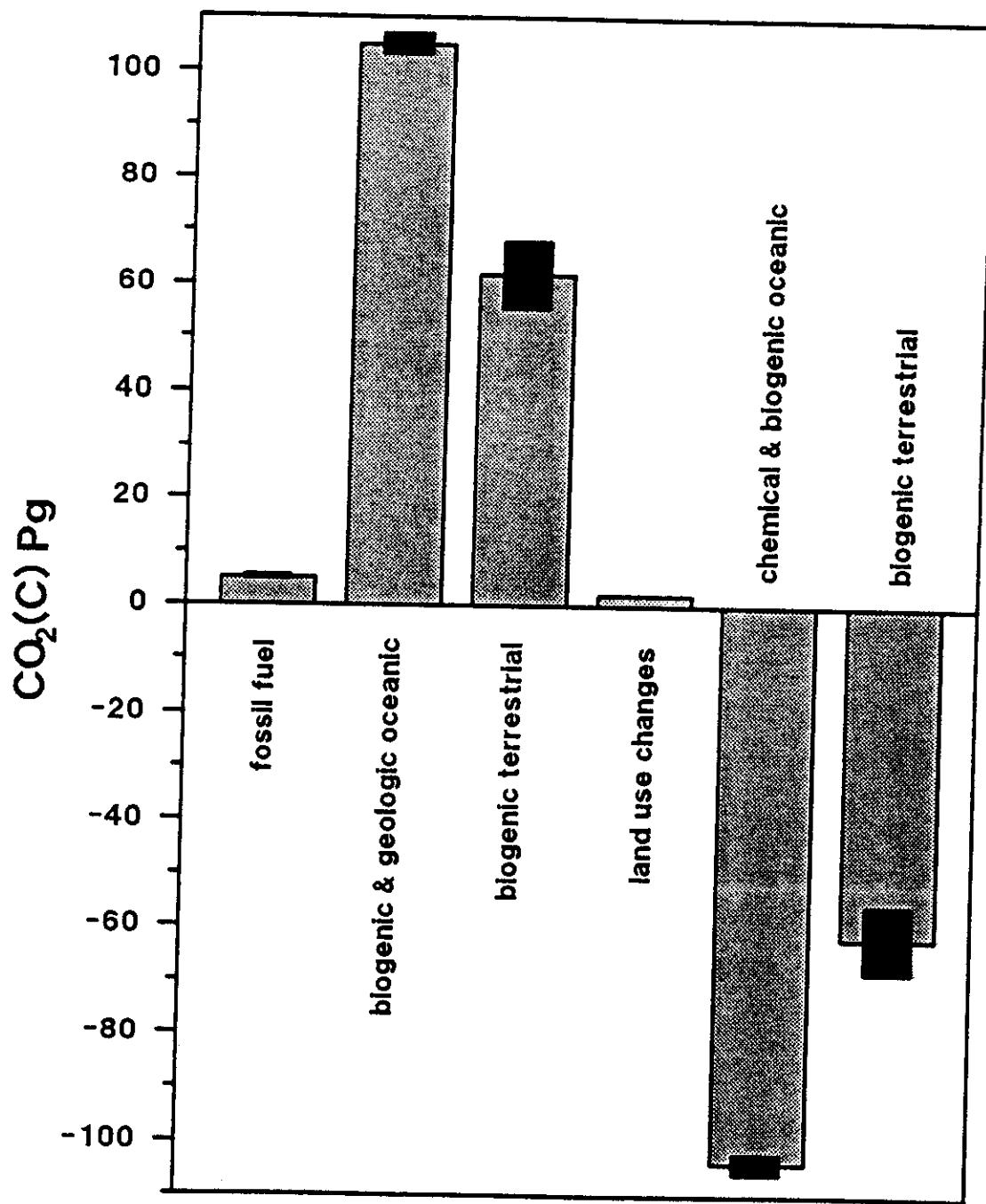
**These are preliminary lecture notes, intended only for distribution to participants.**

Example of C budget.

### Terrestrial Biosphere - Atmosphere Carbon Storages and Fluxes



## Global Sources and Sinks of CO<sub>2</sub>(C)



- Biospheric flux > 30x anthropogenic
- Changing conditions could imbalance biospheric flux even a small amount & net biospheric fluxes could dominate anthropogenic

Temporal Patterns

Annual cycle

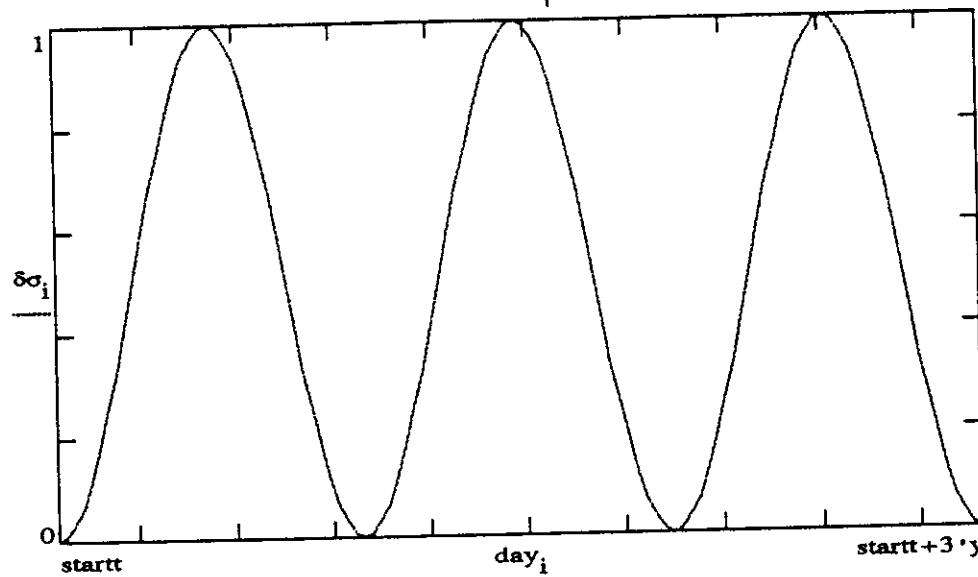
daily phase angle

$$\omega \equiv \frac{2 \cdot \pi}{y}$$

SEASONS

$$\delta\sigma_i := \frac{1 - \cos[\omega \cdot day_i]}{2}$$

Seasonality Driver



Litter fall relative intensity

$$\text{begin\_fall\_date} := 240 \cdot d \quad \text{end\_fall\_date} := 285 \cdot d$$

$$\text{fall\_period} := \text{end\_fall\_date} - \text{begin\_fall\_date}$$

$$\omega_{\phi\lambda\lambda} := 2 \cdot \frac{\pi}{\text{fall\_period}}$$

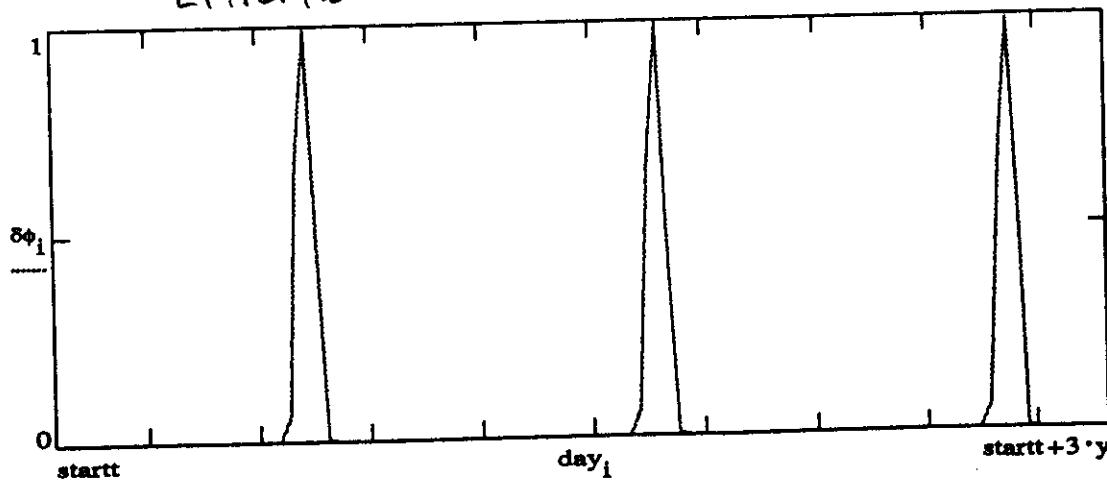
$$\text{beginfall}(z) := \text{if } [\text{mod}[day_z, y] < \text{begin\_fall\_date}, 0, 1]$$

$$\text{endfall}(z) := \text{if } [\text{mod}[day_z, y] > \text{end\_fall\_date}, 0, 1]$$

$$\text{fall}(z) := \text{beginfall}(z) \cdot \text{endfall}(z)$$

$$\delta\phi_i := \frac{1 - \cos[\omega_{\phi\lambda\lambda} \cdot \left[ \text{mod}[day_i, y] \dots + (-\text{begin\_fall\_date}) \right] \cdot \text{fall}(i)]}{2}$$

Litterfall "Windows"



## Constants

$\mu := 0.0009 \cdot d^{-1}$	maximum photosynthesis rate constant referenced to perennial standing stock
$K := 275 \cdot Pg$	half saturation constant for photosynthesis referenced to total atmospheric C
$lf := 0.2 \cdot d^{-1}$	maximum litterfall rate constant
$wf := 0.02 \cdot y^{-1}$	woody litter annual turnover rate constant
$ploss := 0.02 \cdot y^{-1}$	annual natural loss of perennial vegetation
$ap := \frac{ploss}{[0.114 \cdot y^{-1}]}$	annual contribution to perennial vegetation, 0.114/y is ratio to achieve steady state at 1800 AD conditions
$f1 := 0.80$	fraction of annual litter production into organic pool 1
$f2 := 0.161$	fraction of annual litter production into organic pool 2
$f3 := 0.029$	fraction of annual litter production into organic pool 3
$f4 := 0.009$	fraction of annual litter production into organic pool 4
$f5 := 0.001$	fraction of annual litter production into organic pool 5
$k_{d1} := 1.4 \cdot y^{-1}$	decomposition rate constant for soil organic carbon pool 1
$k_{d1}^{-1} = 0.714286 \cdot y$	
$k_{d2} := 0.2 \cdot y^{-1}$	decomposition rate constant for soil organic carbon pool 2
$k_{d2}^{-1} = 5 \cdot y$	
$k_{d3} := 0.04 \cdot y^{-1}$	decomposition rate constant for soil organic carbon pool 3
$k_{d3}^{-1} = 25 \cdot y$	
$k_{d4} := 0.004 \cdot y^{-1}$	decomposition rate constant for soil organic carbon pool 4
$k_{d4}^{-1} = 2.5 \cdot 10^2 \cdot y$	
$k_{d5} := 0.001 \cdot y^{-1}$	decomposition rate constant for soil organic carbon pool 5
$k_{d5}^{-1} = 1 \cdot 10^3 \cdot y$	
$Vp := 1700 \cdot m \cdot y^{-1}$	piston velocity for surface oceanic gas exchange (1700 m/y -- Broecker (1974), 1000 m/y S&N, 1981)
$S := .5 \cdot m \cdot d^{-1}$	sinking velocity for particulate C
$fwl := 0.66667$	fraction of woody litter going into soil organic pool 2

Constant Quantities and Initial Values

$$KH := 10^{-1.53} \cdot \text{molC} \cdot \text{l}^{-1} \cdot \text{atm}^{-1}$$

Henry's constant for CO<sub>2</sub>, 298 K. Relates pCO<sub>2</sub> (atm) to HCO<sub>3</sub><sup>\*</sup>; Given as molC per liter per atm, but note that there is one mol of C per mol of any species of inorganic C

$$K1 := 10^{-6}$$

equilibrium constants for inorganic carbon species

$$K2 := 10^{-9.11}$$

$$\text{pH} := 8.2$$

$$\alpha_0 := \left[ 1 + \frac{K1}{10^{-\text{pH}}} + \frac{K1 \cdot K2}{[10^{-\text{pH}}]^2} \right]^{-1}$$

fraction of inorganic carbon diffusing into seawater that remains as HCO<sub>3</sub><sup>\*</sup>

$$\alpha_0 = 5.586974 \cdot 10^{-3}$$

$$f_{\text{pf}} := \frac{(29 \cdot \text{g})}{[12 \cdot \text{g} \cdot 52 \cdot 10^{17} \cdot \text{kg}]}$$

conversion factor for mass to mole fraction of C in the atmosphere

$$PA_{\text{conv}} := f_{\text{pf}} \cdot (760 \cdot \text{torr} - 23.77 \cdot \text{torr})$$

conversion factor for mass of C in the atmosphere to partial pressure of CO<sub>2</sub> (atm) at sea level. 29 g/mol atmosphere

assumed. 52 x 10<sup>17</sup> kg is total mass of atmosphere (SM, 1981). 23.77 torr is partial pressure of water vapor in saturated atmosphere at 298 K.

$$SO := 361 \cdot 10^6 \cdot \text{km}^2$$

surface area of the ocean

$$DO := 75 \cdot \text{m}$$

depth of the mixed ocean

$$VO := SO \cdot DO$$

volume of the mixed ocean

$$Ma_0 := 880.6456 \cdot \text{Pg}$$

*This mass corresponds to projected atm. mass at 2000 AD  
initial mass of atmospheric carbon (600 Pg corresponds to about the year 1800)*

$$PA_{\text{conv}} \cdot Ma_0 = 3.964738 \cdot 10^2 \cdot \text{ppmv}$$

initial atmospheric C concentration

$$KH \cdot PA_{\text{conv}} \cdot Ma_0 = 0.011701 \cdot \text{molC} \cdot \text{m}^{-3}$$

ocean HCO<sub>3</sub><sup>\*</sup> concentration calculated to be in equilibrium with the atmospheric concentration this initialization

$$Mva_0 := 8.925243 \cdot \text{Pg}$$

initial mass of annual vegetation (including leaves of woody plants)

$$Mo1_0 := 116.9627 \cdot \text{Pg}$$

initial mass of quickest turnover soil organic carbon

$$Mo2_0 := 242.9495 \cdot \text{Pg}$$

initial mass of second quickest turnover soil organic carbon

$$Mo3_0 := 394.8443 \cdot \text{Pg}$$

initial mass of third slowest turnover soil organic carbon

$$Mo4_0 := 356.5545 \cdot \text{Pg}$$

initial mass of second slowest turnover soil organic carbon

$$Mo5_0 := 151.3712 \cdot \text{Pg}$$

initial mass of slowest turnover soil organic carbon

$$MO_0 := [KH \cdot Ma_0 \cdot PA_{\text{conv}} \cdot VO] \cdot [\alpha_0]^{-1}$$

computation of initial mass of CO<sub>2</sub> in the mixed upper layer of the ocean, equil with atmosphere

mass this initialization

$$MO_0 = 6.804364 \cdot 10^2 \cdot \text{Pg}$$

$$\frac{MO_0}{VO} \cdot \alpha_0 = 1.170077 \cdot 10^{-5} \cdot \text{molC} \cdot \text{l}^{-1}$$

concentration this initialization calculated directly; should be identical to initialization from Ma0

$$MO_0 := 656.2087 \cdot \text{Pg}$$

$$L(MVA, f) := lf \cdot MVA \cdot f$$

$L(v)$  is litterfall flux

$$D(w1, w2, w3, w4, w5, s) := s \cdot [k_{d1} \cdot w1 + k_{d2} \cdot w2 + k_{d3} \cdot w3 + k_{d4} \cdot w4 + k_{d5} \cdot w5]$$

$$P(MA, MWV, s) := \frac{\mu \cdot MWV \cdot MA \cdot s}{K + MA}$$

$D(\cdot)$  is decomposition flux

$P(\cdot)$  is photosynthesis flux

atmospheric carbon

$$DMA(MA, MWV, MO, w1, w2, w3, w4, w5, s, u) := \left[ F(u) + B(u) + D(w1, w2, w3, w4, w5, s) \dots + -SO \cdot \left[ Vp \cdot \left[ KH \cdot MA \cdot PAconv - \frac{\alpha_0 \cdot MO}{VO} \right] \right] \dots + -P(MA, MWV, s) \right]$$

carbon in woody vegetation

$$DMwv(MA, MWV, s, u) := ap \cdot P(MA, MWV, s) - ploss \cdot MWV - B(u)$$

carbon in annual vegetation

$$DMva(MA, MVA, MWV, f, s) := (1 - ap) \cdot P(MA, MWV, s) - L(MVA, f)$$

pool 1 soil organic carbon

$$DMo1(MVA, w1, f, s) := f1 \cdot L(MVA, f) - k_{d1} \cdot s \cdot w1$$

pool 2 soil organic carbon (assumed to receive the fraction fwi of the woody litter)

$$DMo2(MVA, MWV, w2, f, s) := f2 \cdot L(MVA, f) + fwi \cdot ploss \cdot MWV - k_{d2} \cdot s \cdot w2$$

pool 3 soil organic carbon (assumed to receive the remainder of woody litter)

$$DMo3(MVA, MWV, w3, f, s) := f3 \cdot L(MVA, f) + (1 - fwi) \cdot ploss \cdot MWV - k_{d3} \cdot s \cdot w3$$

pool 4 soil organic carbon

$$DMo4(MVA, w4, f, s) := f4 \cdot L(MVA, f) - k_{d4} \cdot s \cdot w4$$

pool 5 soil organic carbon

$$DMo5(MVA, w5, f, s) := f5 \cdot L(MVA, f) - k_{d5} \cdot s \cdot w5$$

oceanic carbon

$$DMO(MA, MO) := SO \cdot \left[ Vp \cdot \left[ KH \cdot MA \cdot PAconv - \frac{\alpha_0 \cdot MO}{VO} \right] - S \cdot rio \cdot \frac{\alpha_0 \cdot MO}{VO} \right]$$

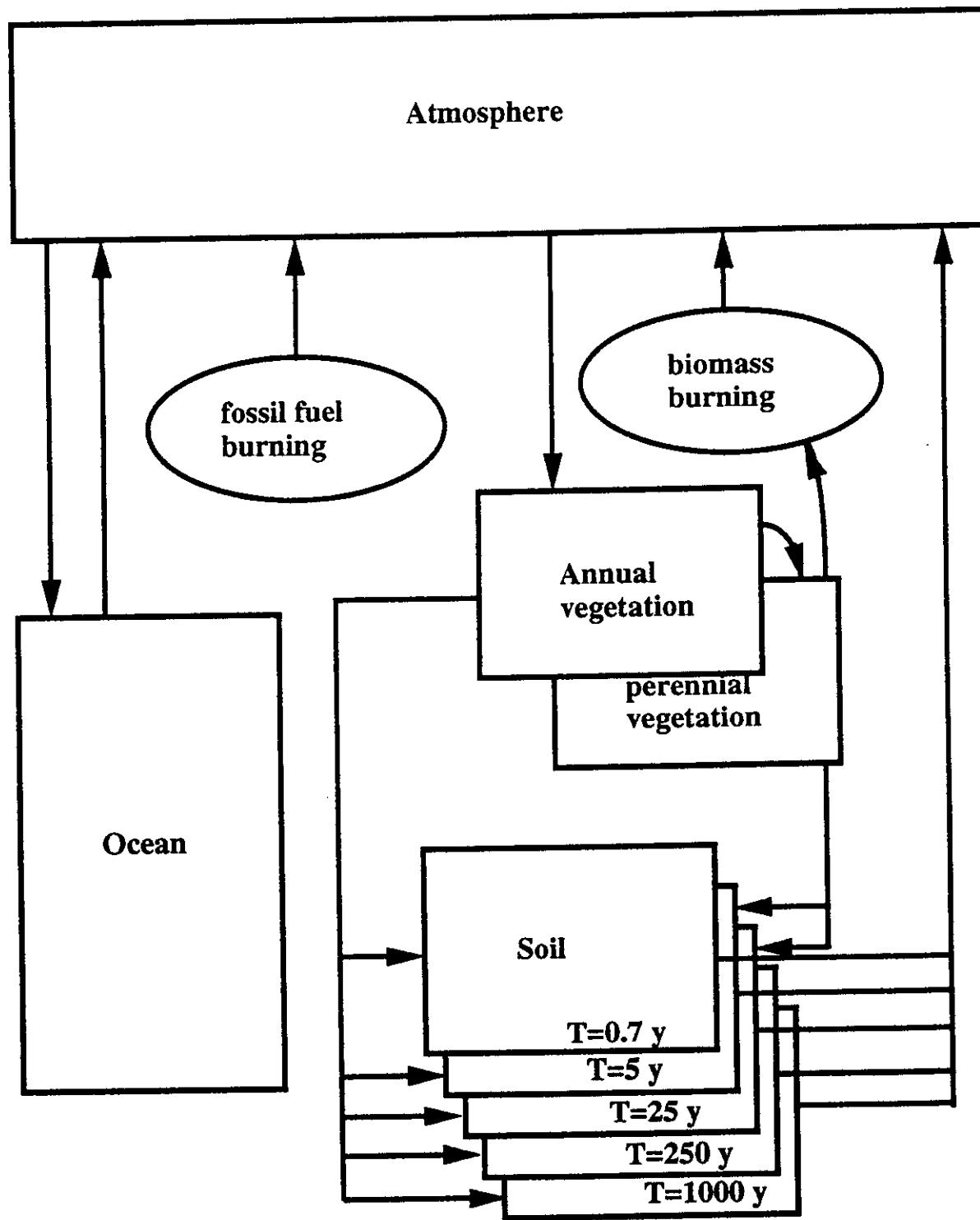
Integration

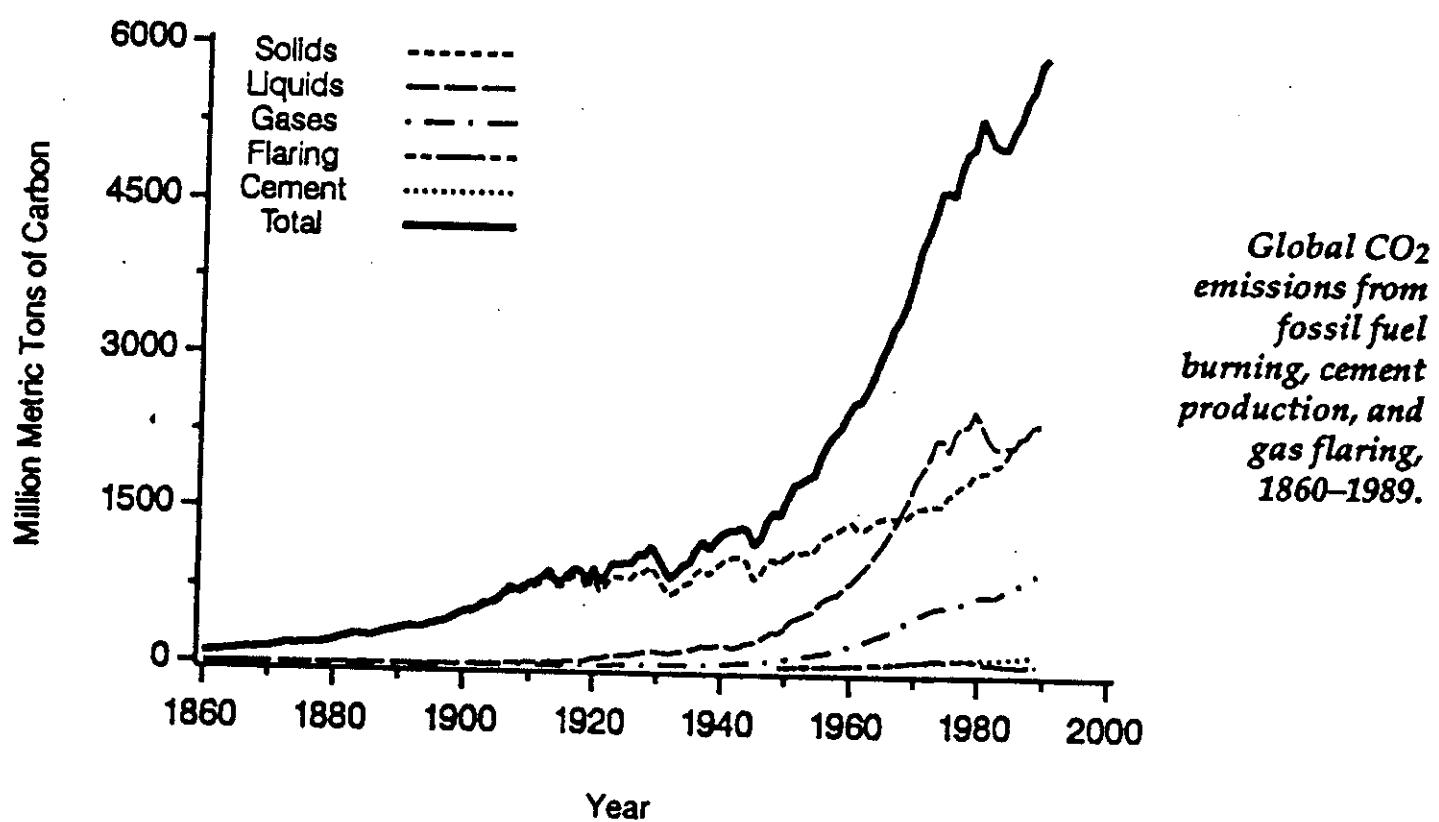
$$\begin{bmatrix} Ma_{[i+1]} \\ Mva_{[i+1]} \\ Mwv_{[i+1]} \\ Mo1_{[i+1]} \\ Mo2_{[i+1]} \\ Mo3_{[i+1]} \\ Mo4_{[i+1]} \\ Mo5_{[i+1]} \\ MO_{[i+1]} \end{bmatrix} := \begin{bmatrix} Ma_i + dh \cdot DMA [ Ma_i, Mwv_i, MO_i, Mo1_i, Mo2_i, Mo3_i, Mo4_i, Mo5_i, \delta\sigma_i, day_i ] \\ Mva_i + dh \cdot DMva [ Ma_i, Mva_i, Mwv_i, \delta\phi_i, \delta\sigma_i ] \\ Mwv_i + dh \cdot DMwv [ Ma_i, Mwv_i, \delta\sigma_i, day_i ] \\ Mo1_i + dh \cdot DMo1 [ Mva_i, Mo1_i, \delta\phi_i, \delta\sigma_i ] \\ Mo2_i + dh \cdot DMo2 [ Mva_i, Mwv_i, Mo2_i, \delta\phi_i, \delta\sigma_i ] \\ Mo3_i + dh \cdot DMo3 [ Mva_i, Mwv_i, Mo3_i, \delta\phi_i, \delta\sigma_i ] \\ Mo4_i + dh \cdot DMo4 [ Mva_i, Mo4_i, \delta\phi_i, \delta\sigma_i ] \\ Mo5_i + dh \cdot DMo5 [ Mva_i, Mo5_i, \delta\phi_i, \delta\sigma_i ] \\ MO_i + dh \cdot DMO [ Ma_i, MO_i ] \end{bmatrix}$$

Computations;  $dh = q/d$

ODE's defining the system

esm for Global Carbon Storages and Flows  
extremely simple model





$$F_{\max} := 40 \cdot Pg \cdot y^{-1}$$

maximum annual CO<sub>2</sub> input to the atmosphere  
from future fossil fuel oxidation

$$F_0 := 40 \cdot Tg \cdot y^{-1}$$

assumed 1800 rate of fossil fuel oxidation

$$A := \frac{[F_{\max} - F_0]}{F_0}$$

$$a := 0.009 \cdot Pg \cdot y^{-2}$$

assumed linear (a) and logistic (b) rates  
of fossil fuel oxidation

$$b := 0.02782 \cdot y^{-1}$$

$$F(z) := a \cdot (z) + \frac{F_{\max}}{[1 + A \cdot [e^{-b \cdot z}]]^0}$$

$$F1_{\max} := 33 \cdot Pg \cdot y^{-1}$$

$$F1_0 := 0.1 \cdot Tg \cdot y^{-1}$$

$$A1 := \frac{[F1_{\max} - F1_0]}{F1_0}$$

$$c := 0.0485 \cdot y^{-1}$$

$$cc := .0007 \cdot y^{-1}$$

$$Pre := 2 \cdot Pg \cdot y^{-1}$$

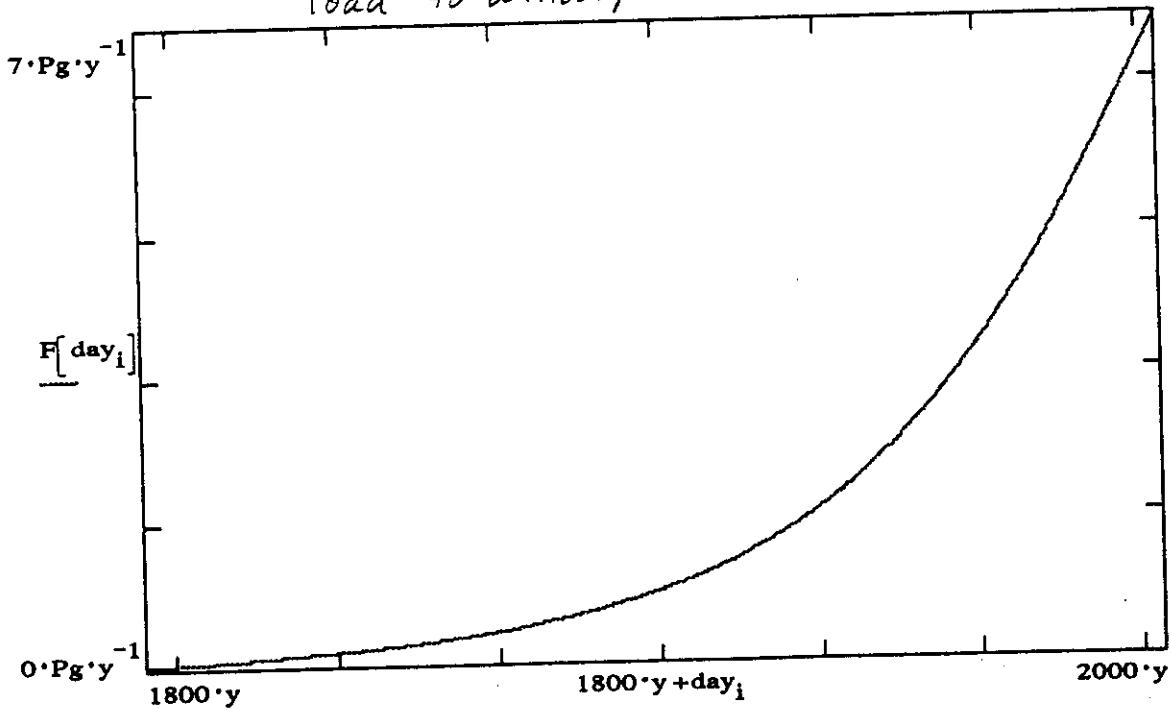
$$F(z) := \frac{F_{\max}}{[1 + A \cdot [e^{-b \cdot z}]]} - \frac{F1_{\max}}{[1 + A1 \cdot [e^{-c \cdot z}]]} + [Pre \cdot [1 - e^{-[cc \cdot [z]]}]]$$

other functions used  
for other scenarios

$$F(60 \cdot y) = 0.291831 \cdot Pg \cdot y^{-1} \quad F(180 \cdot y) = 4.837744 \cdot Pg \cdot y^{-1}$$

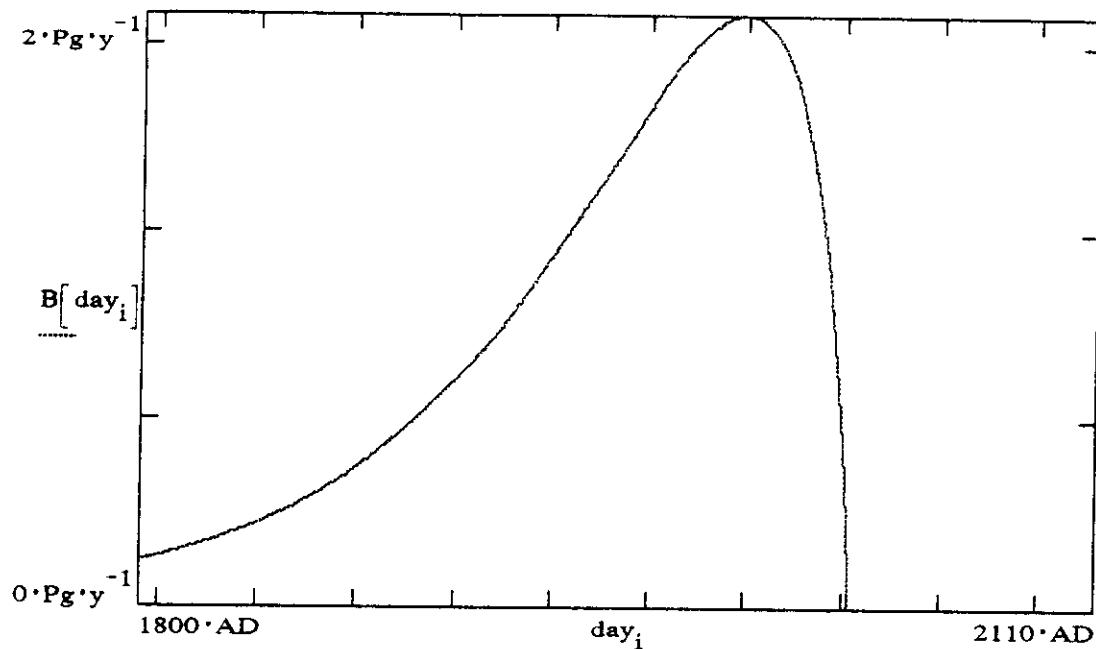
$$F(150 \cdot y) = 2.496032 \cdot Pg \cdot y^{-1} \quad F(192 \cdot y) = 6.095853 \cdot Pg \cdot y^{-1}$$

Approximation to fossil fuel etc. annual  
load to atmosphere.

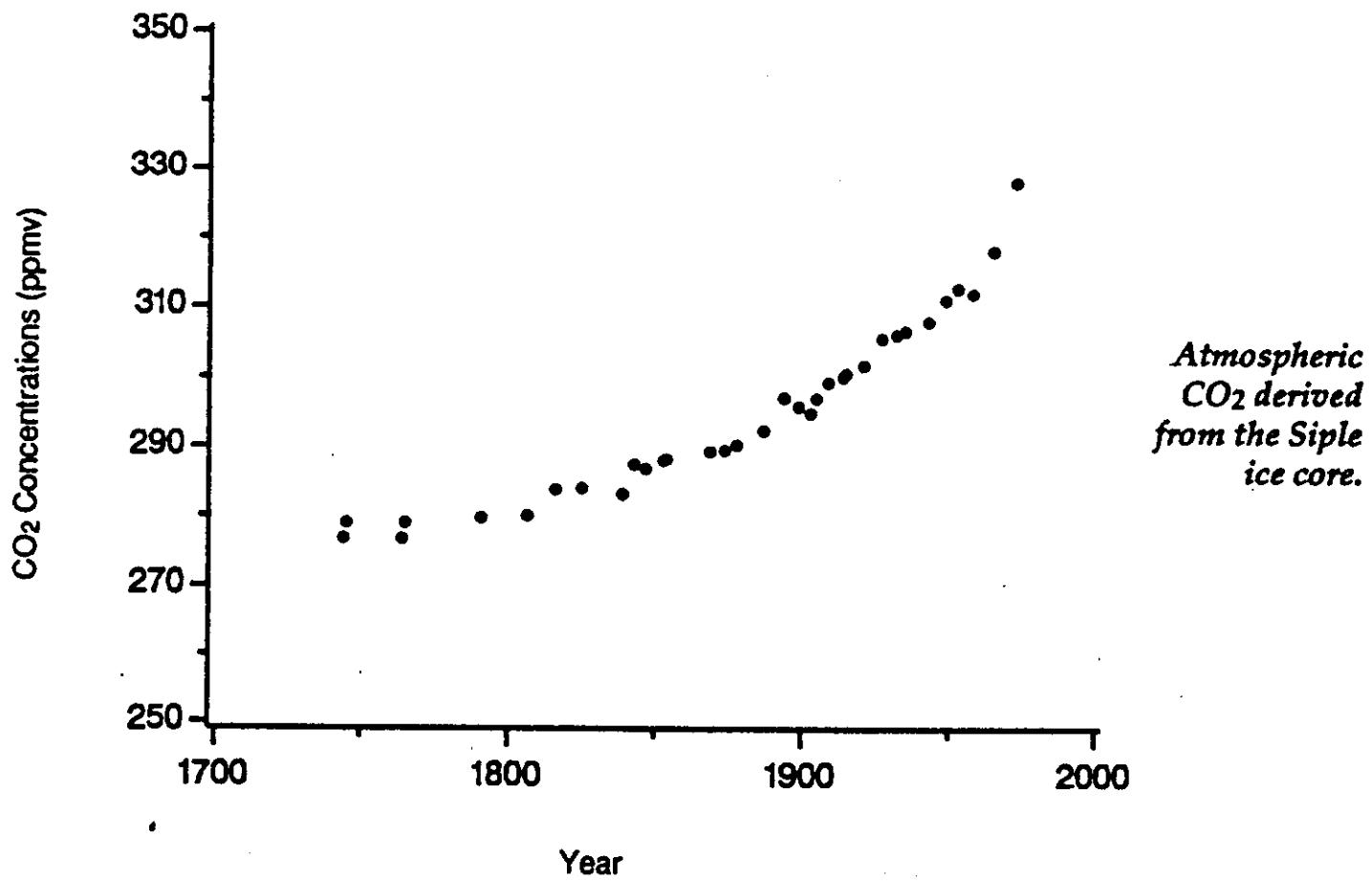


$$B(z) := \text{if } [z > y_{\text{end}}, 0, P_g \cdot y^{-1} \cdot \left[ \left[ B_{\text{max}} \cdot e^{[-a \cdot (z - y_{\text{max}})]} \right] \right] \cdot \left[ \frac{y_{\text{end}} - z}{y_{\text{end}} - y_{\text{max}}} \right]]$$

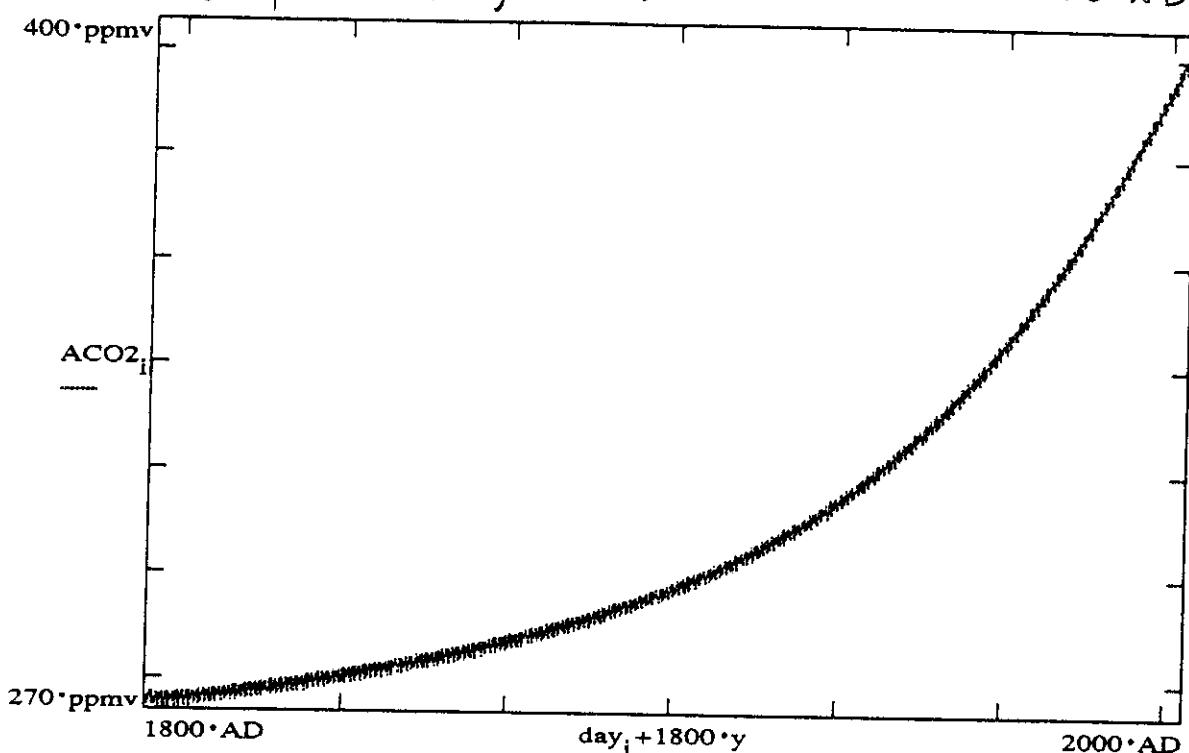
$$B[\text{day}_i] = 0.151232 \cdot \text{Pg} \cdot \text{y}^{-1}$$



- Function approximating biomass burning annual flux of  $\text{CO}_2$  into atmosphere-
- This function also serves as loss rate to perennial vegetation.



1. Model "calibrated" to steady state with conditions of 1800 A.D. all constituents stable for > 20y simulation
2. Run with fossil fuel & biomass burning inputs & losses (to perennial vegetation) for 1800 AD to 2000 AD.



$$\text{now} := 192 \cdot 36$$

$$y82 := 182 \cdot 36$$

$$\text{last\_decade} := y82 .. \text{now}$$

$$\text{now} = 6.912 \cdot 10^3$$

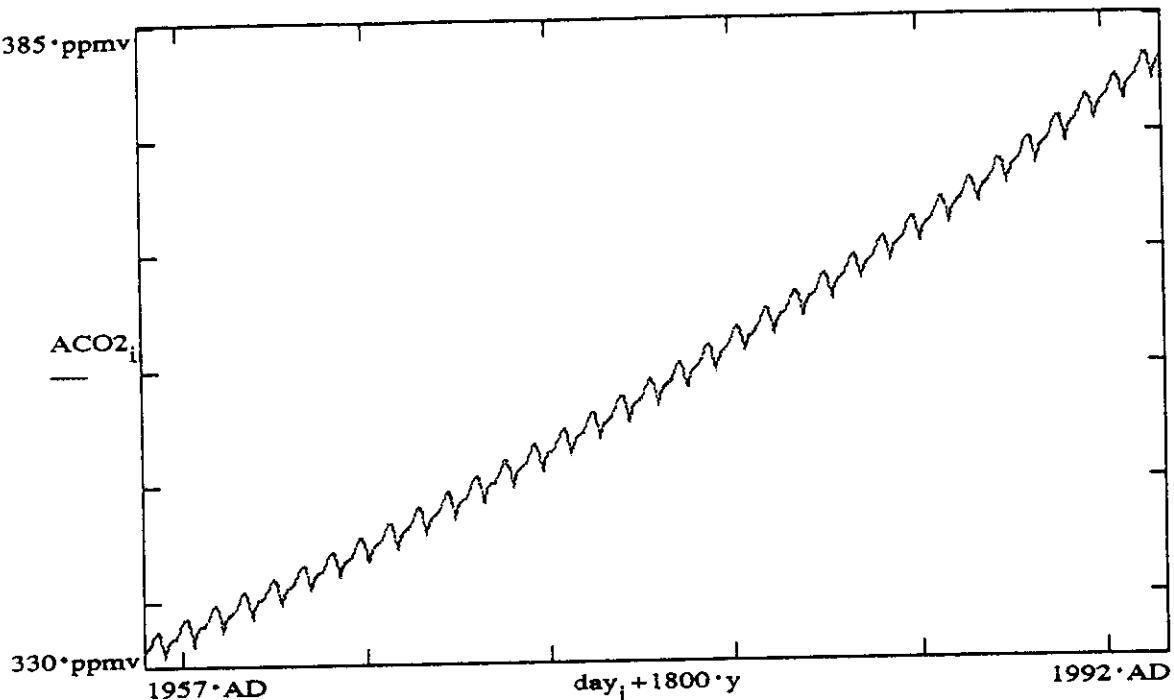
$$y82 = 6.552 \cdot 10^3$$

$$\alpha := \frac{\text{Ma}_{\text{now}} - \text{Ma}_{y82}}{\text{dh} \cdot \left[ \sum_{\text{last\_decade}} F[\text{day}_{\text{last\_decade}}] \right]}$$

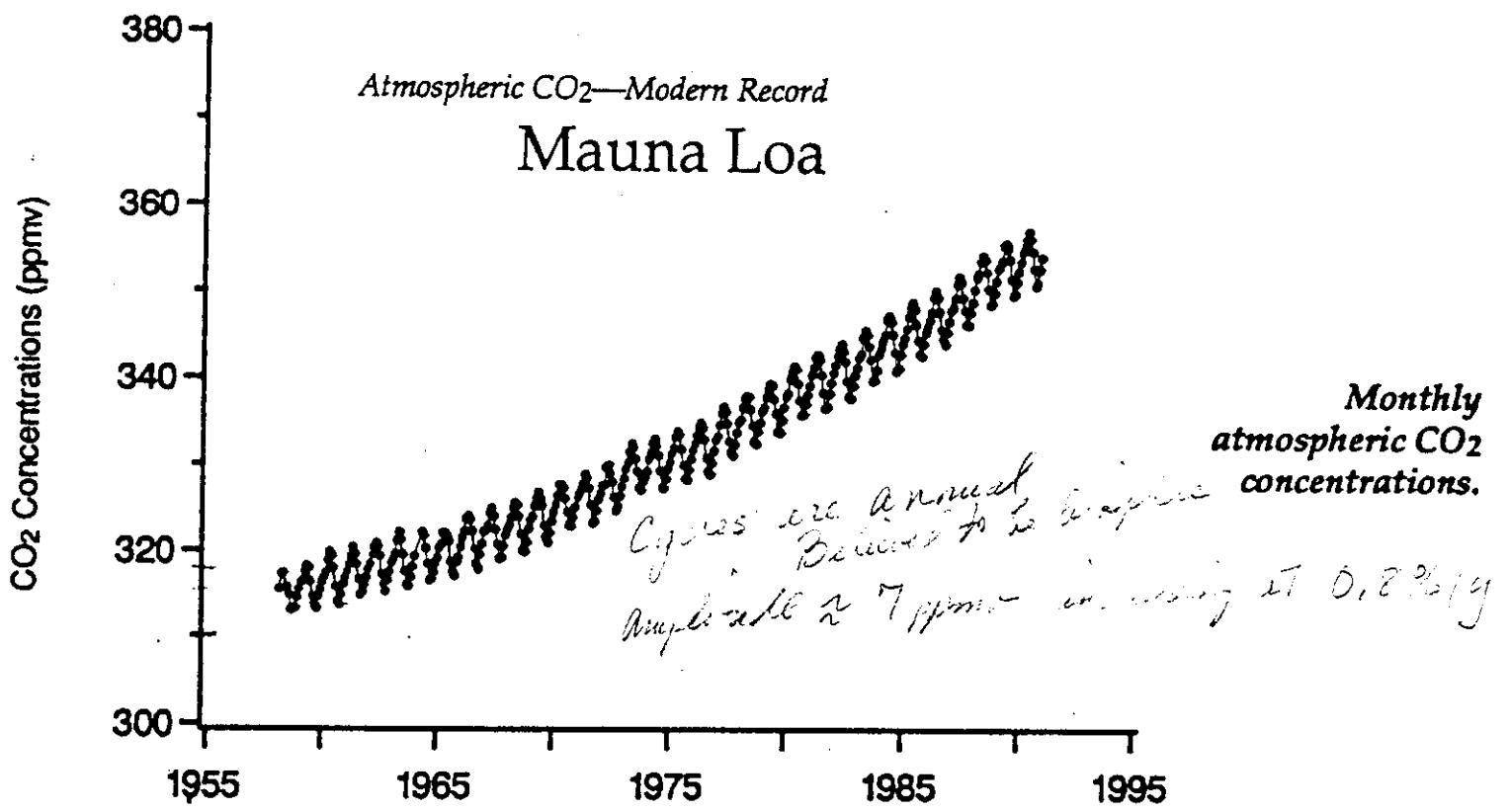
$$\alpha = 0.679786$$

Airborne fraction

Note  $\alpha \approx .08$  higher than actual.

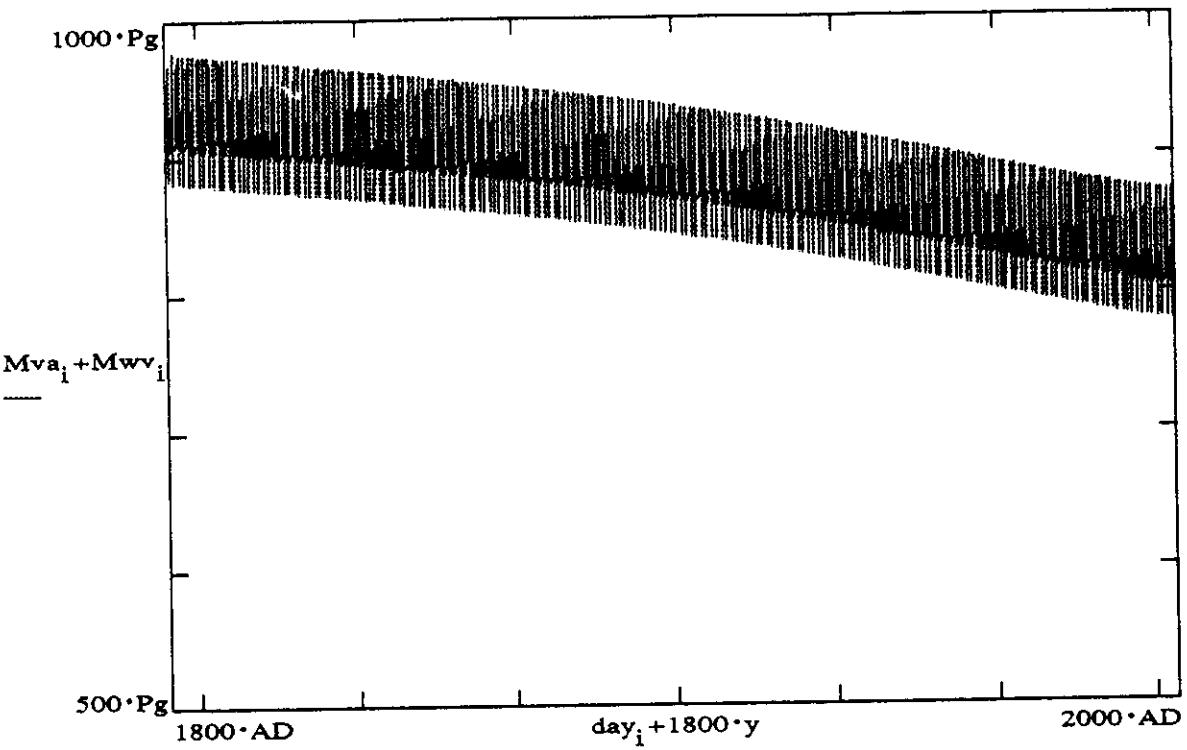


Details of output for 1957 - 1992 AD,  
interval of Keeling Mauna Loa atm CO<sub>2</sub>  
record.

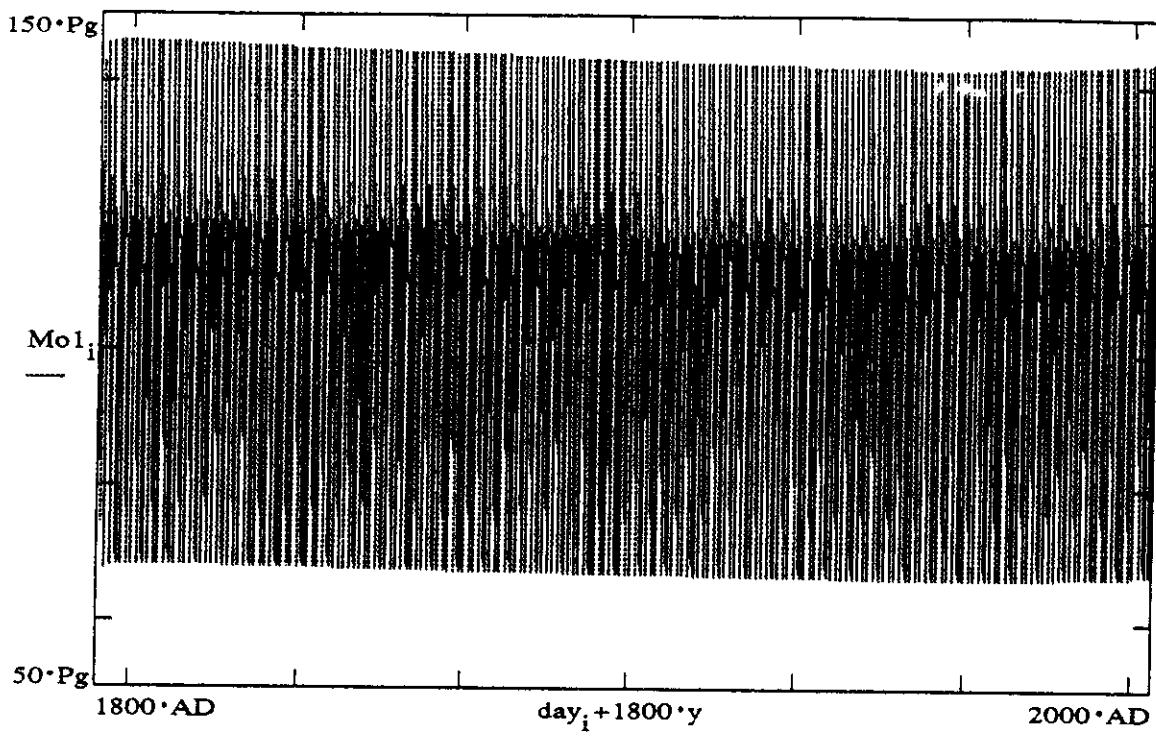


(1) Overall Increase is around 0.4% - 0.5% per year (3 Pg)

(2) But compare to FF input note that increase in input never mind the BB -

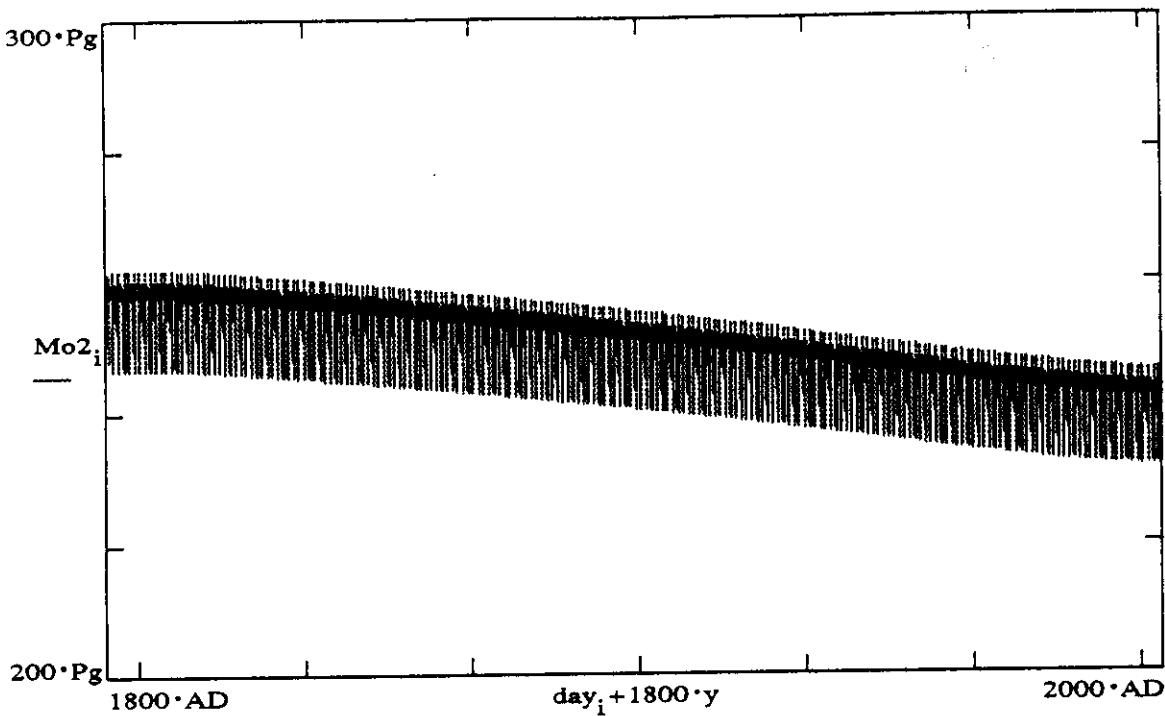


Calculated vegetation. Width of band is magnitude of annual fluctuations. Reduction in overall magnitude due to deforestation (equivalent to biomass burning flux in this  $\underline{\underline{esm}}$ ).

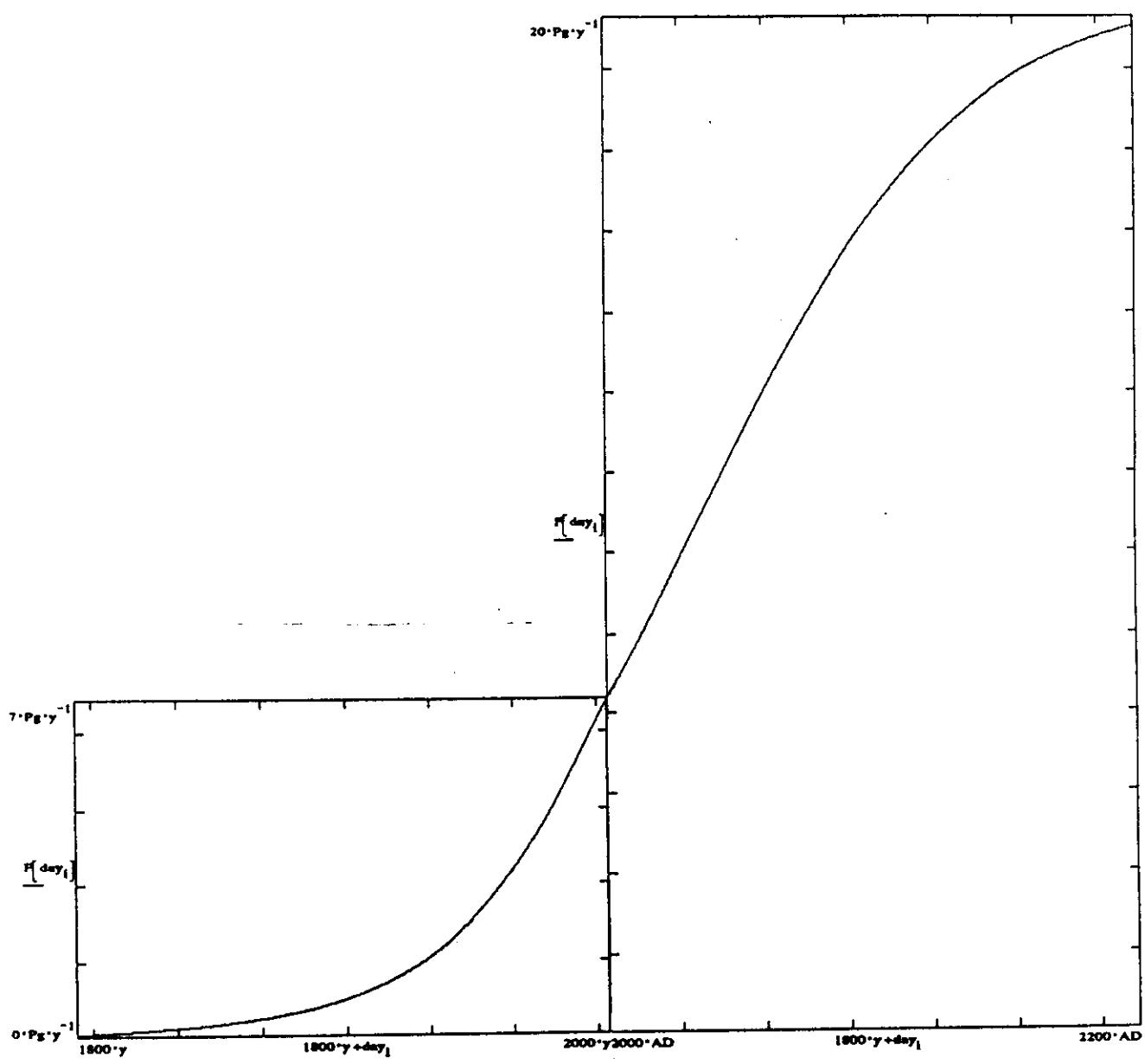


Fastest turnover time soil organic C pool.

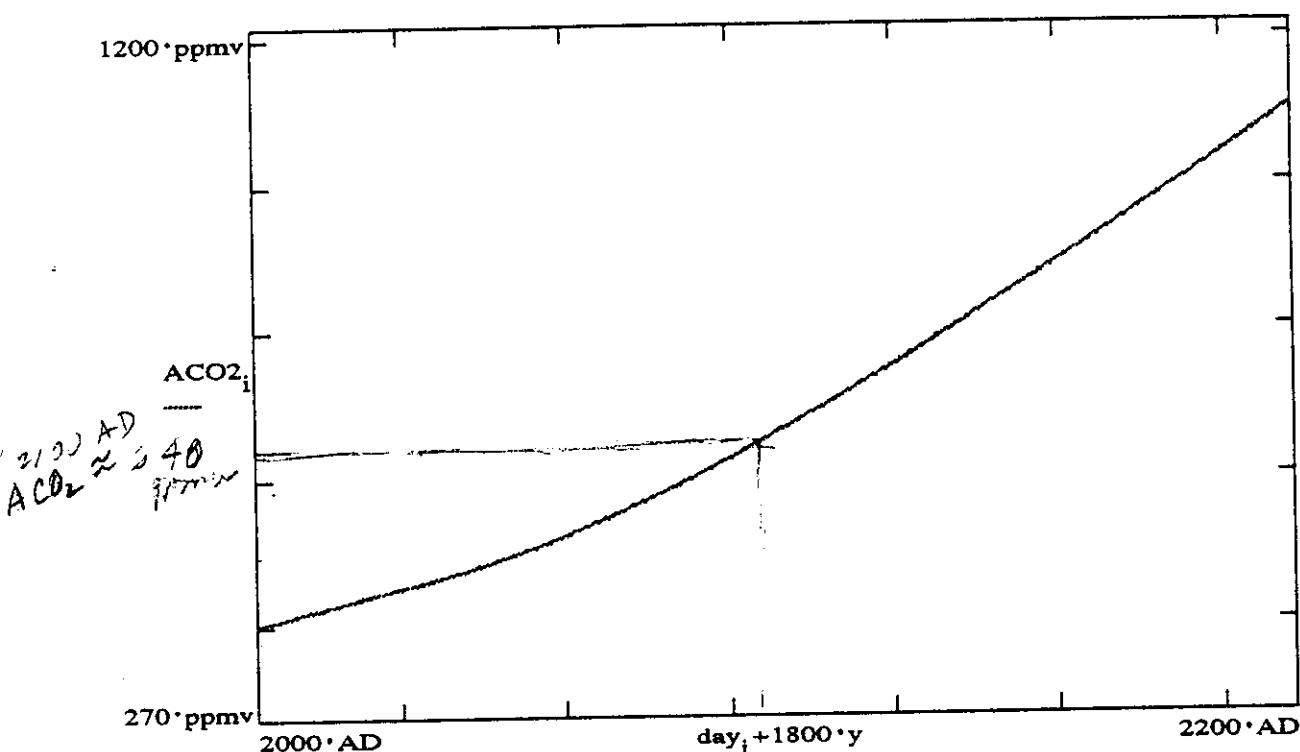
Slight increase with  $t \rightarrow 2000 \text{ AD}$  due to  
C fertilization of annual vegetation.



5 yr. turnover time soil organic C. Note decrease due to decrease in inputs from annual vegetation & slowing of decrease with  $t \rightarrow 2000 \text{ AD}$  from C-fertilized inputs from annual vegetation. Higher turnover-time components respond similarly, but with lower magnitudes.



Whole spectrum of fossil fuel inputs for scenario with carrying-capacity-limited vegetation & following scenario without carrying-capacity limitation



$$y_{2100} := 100 \cdot 36$$

$$y_{2110} := 110 \cdot 36$$

$$y_{2100} = 3.6 \cdot 10^3$$

$$y_{2110} = 3.96 \cdot 10^3$$

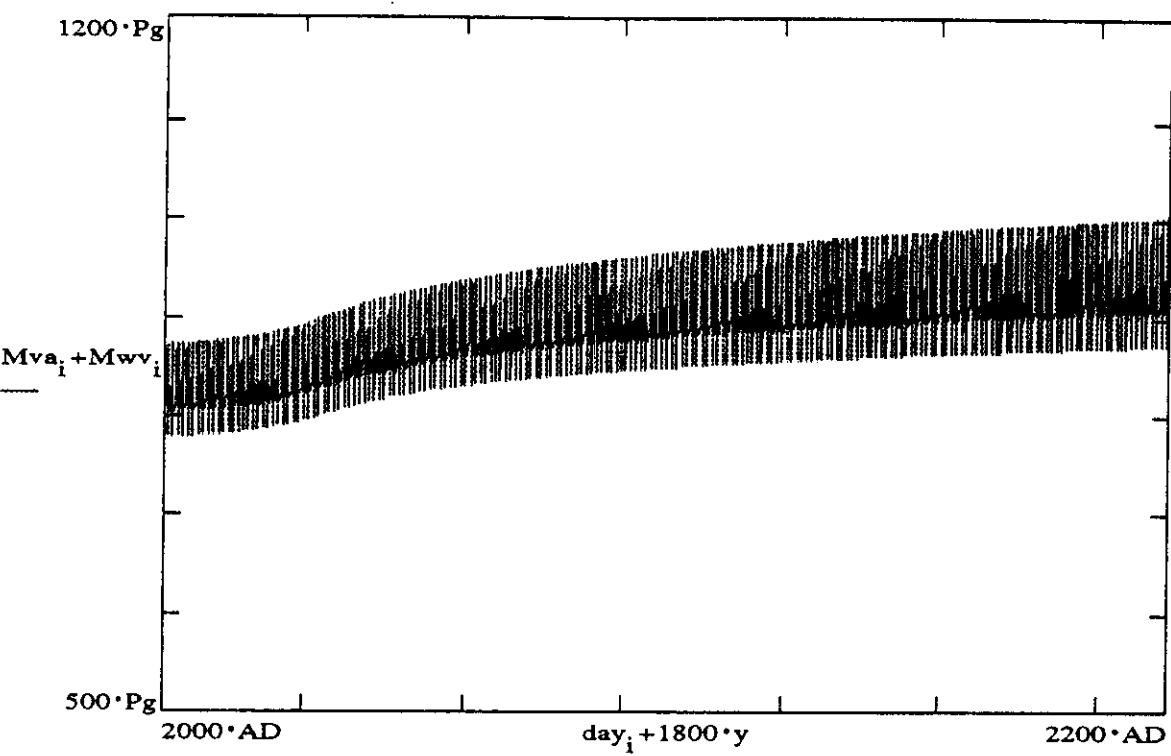
decade := y<sub>2100</sub>..y<sub>2110</sub>

$$\alpha := \frac{Ma_{y_{2110}} - Ma_{y_{2100}}}{dh \cdot \left[ \sum_{\text{decade}} F[\text{day}_{\text{decade}}] \right]}$$

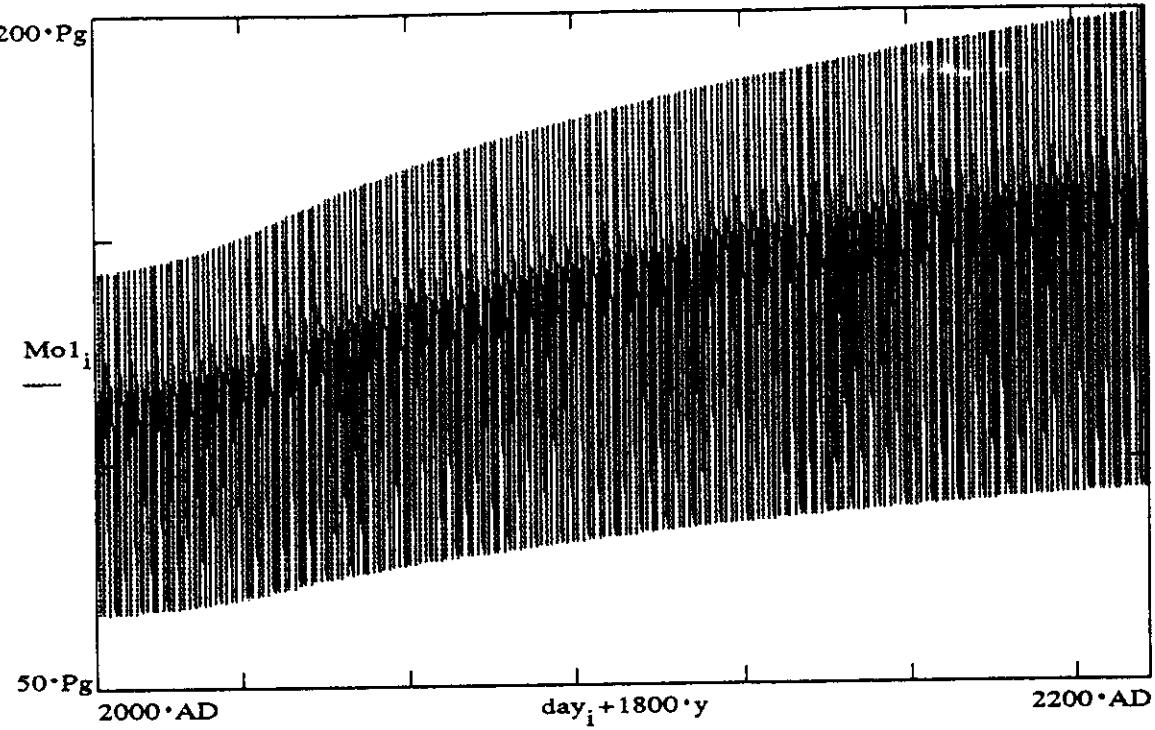
$$\alpha = 0.518296$$

Airborne fraction

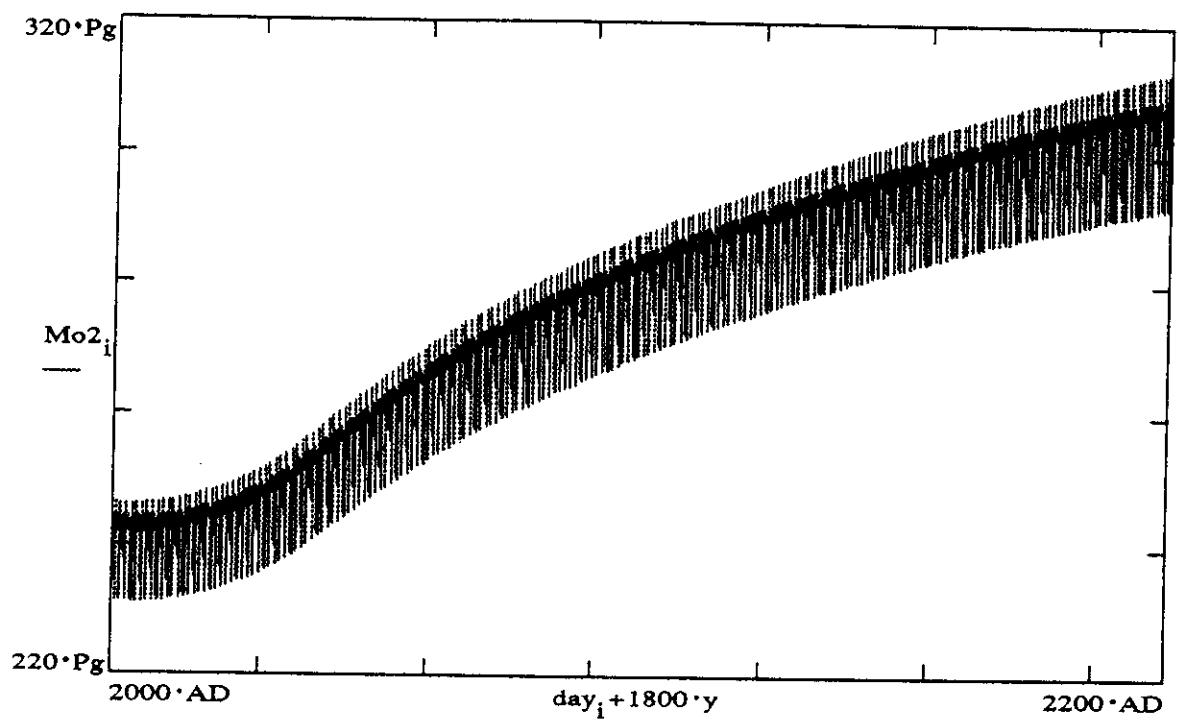
note reduction in  $\alpha$  below  
1992 level.



With carrying-capacity limitation regrowth  
to about level of 1800 AD occurs by  
2200 AD.

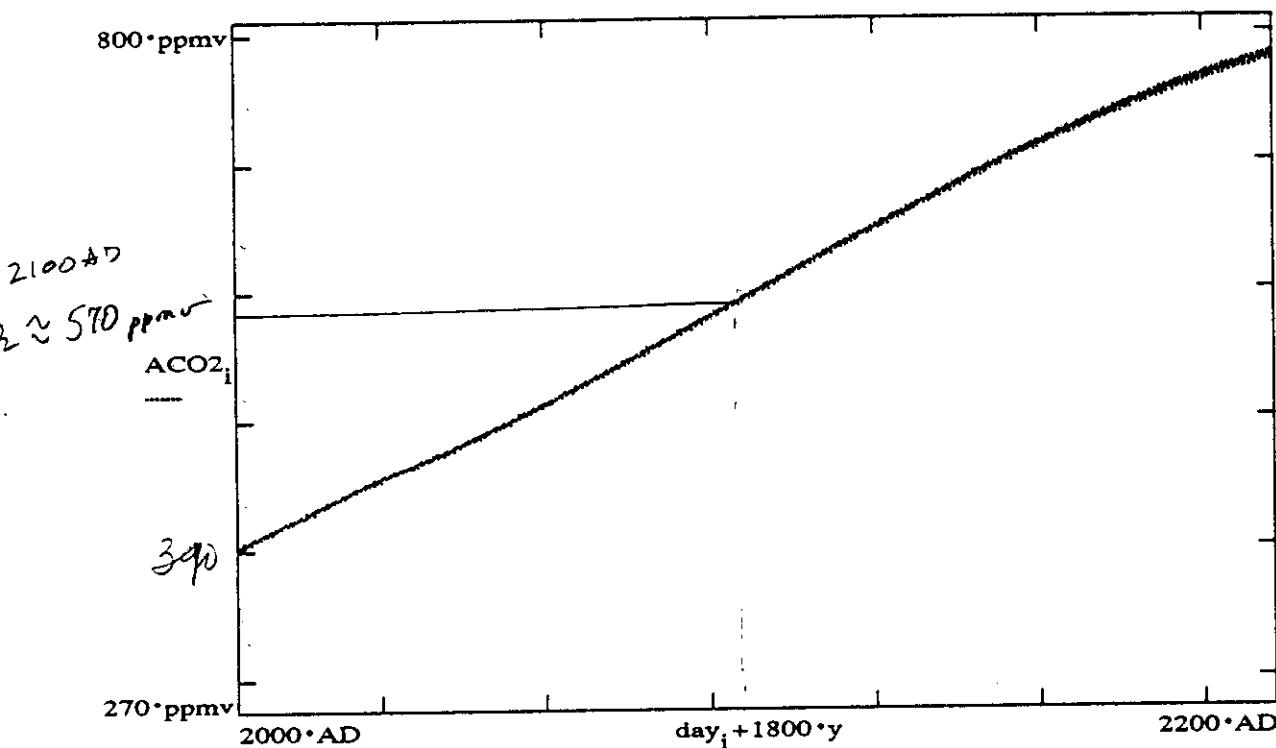


Short-turnover-time soil organic C increases  
by greater proportion than vegetation &  
amplitude of annual fluctuations increases.



5-year turnover-time organic C-

Calculated  $\text{ACO}_2$  2000-2200 AD without carrying capacity limitation on vegetation.



$$y_{2080} := 80 \cdot 36$$

$$y_{2070} := 70 \cdot 36$$

$$y_{2080} = 2.88 \cdot 10^3$$

$$y_{2070} = 2.52 \cdot 10^3$$

$$\text{decade} := y_{2070}..y_{2080}$$

$$\alpha := \frac{\text{Ma}_{y_{2080}} - \text{Ma}_{y_{2070}}}{dh \cdot \left[ \sum_{\text{decade}} F[\text{day}_{\text{decade}}] \right]}$$

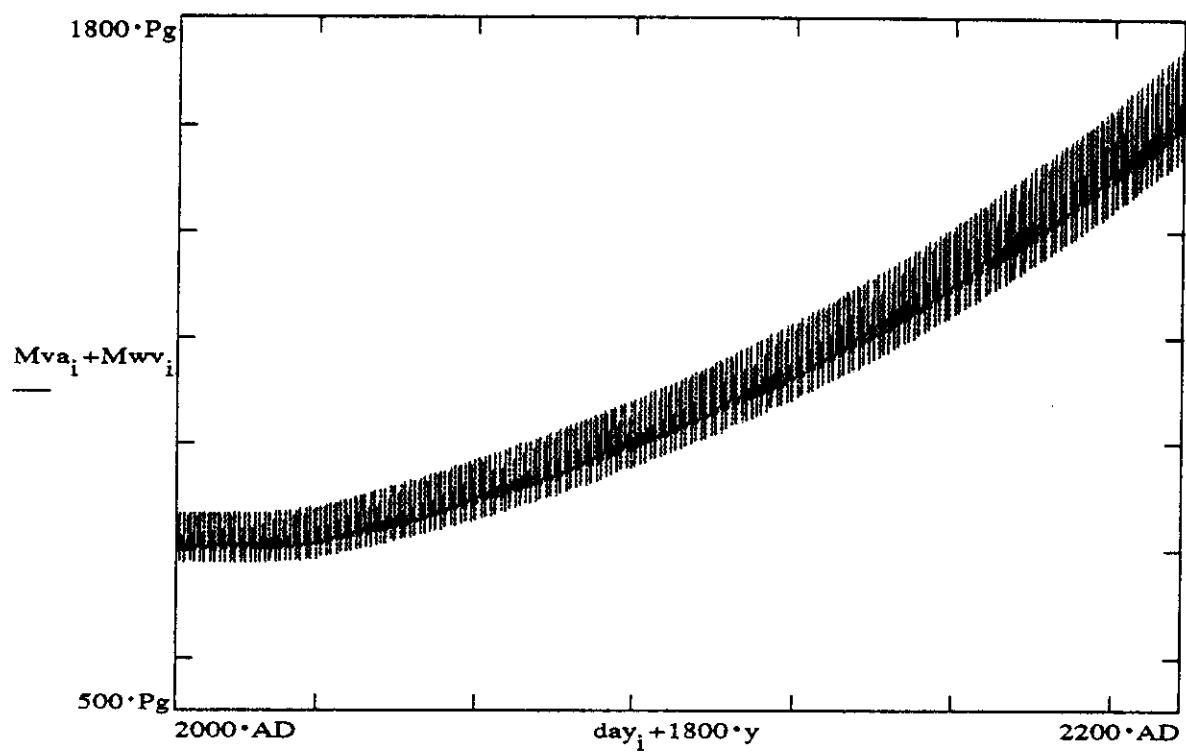
$$\text{Ma}_{y_{2080}} - \text{Ma}_{y_{2070}}$$

$$\alpha = 0.328689$$

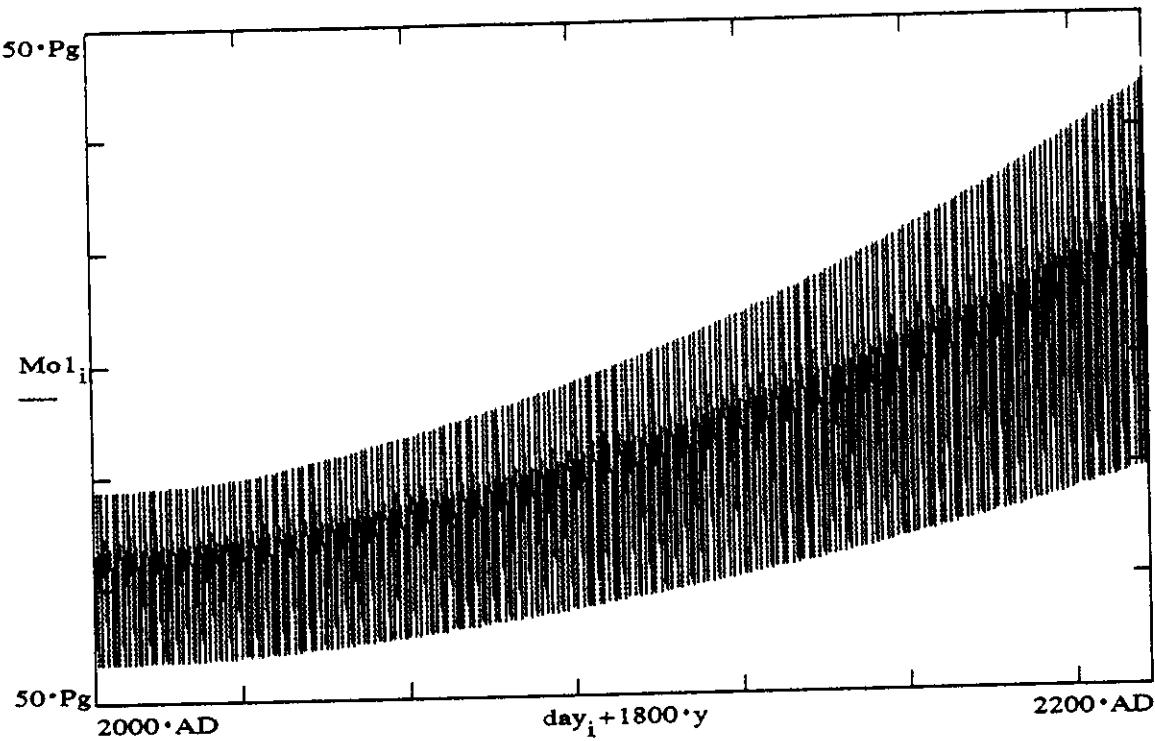
Airborne fraction

*below level with carrying capacity limitation on vegetation*

Reduction in  $\alpha$ , presumably due to increased plant uptake & storage by soils.



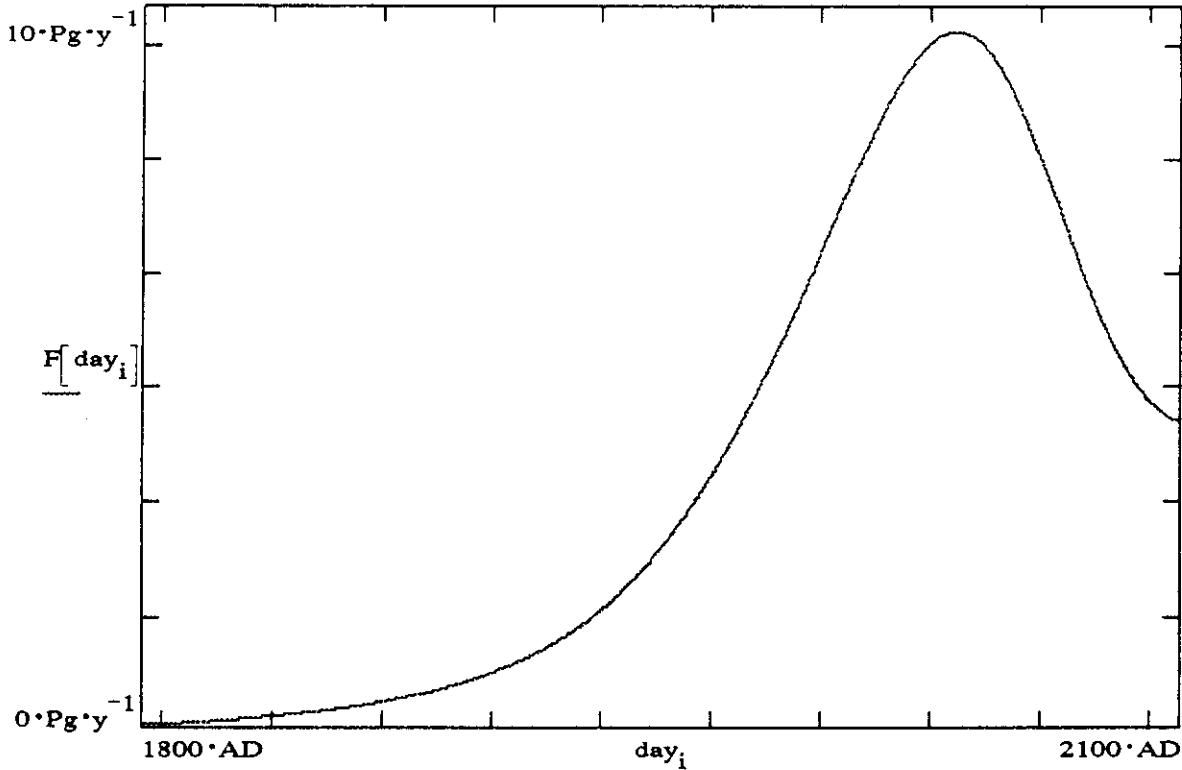
Vegetation reaches nearly double the standing crop of 1800 AD



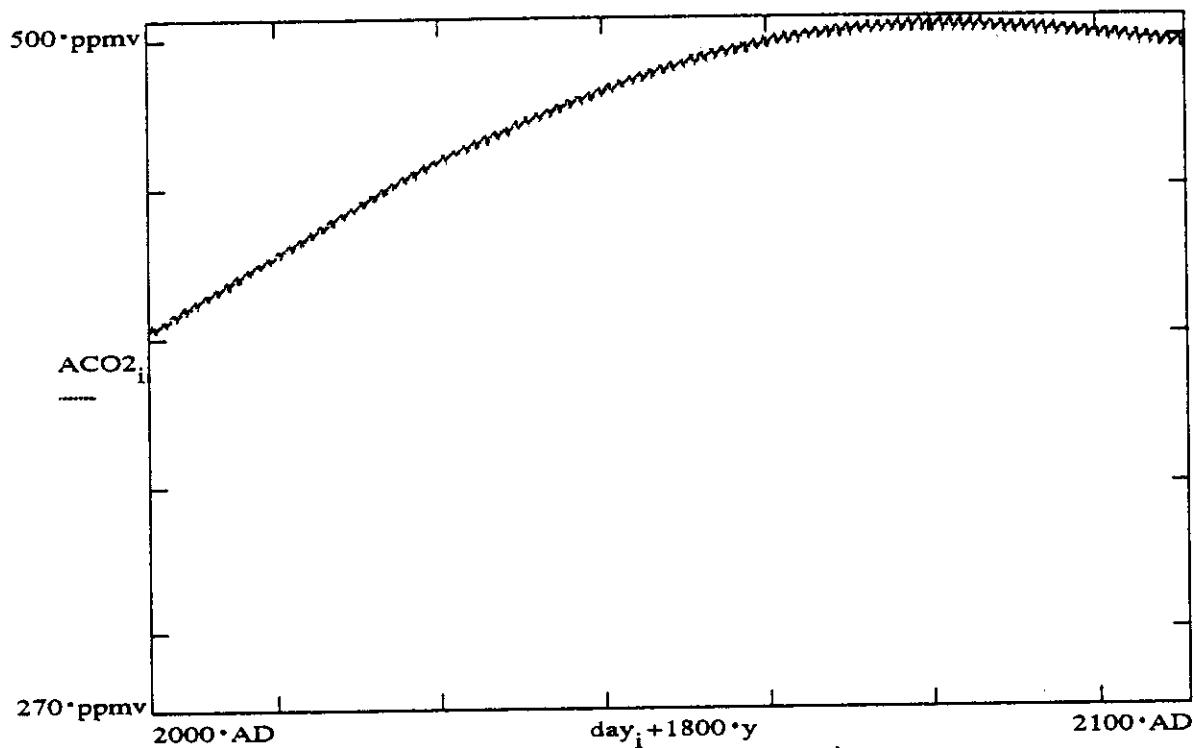
Large increase in overall magnitude & amplitude  
of annual fluctuations of rapid turnover soil  
organic C. Other fractions follow similar  
pattern.

$$\begin{aligned}
F_{\max} &:= 40 \cdot \text{Pg} \cdot \text{y}^{-1} & F1_{\max} &:= 33 \cdot \text{Pg} \cdot \text{y}^{-1} \\
&\quad \text{maximum annual CO}_2 \text{ input to the atmosphere} \\
&\quad \text{from future fossil fuel oxidation} \\
F_0 &:= 40 \cdot \text{Tg} \cdot \text{y}^{-1} & \text{assumed 1800 rate of fossil fuel oxidation} \\
P_{\text{ref}} &:= 2 \cdot \text{Pg} \cdot \text{y}^{-1} & F1_0 &:= 0.1 \cdot \text{Tg} \cdot \text{y}^{-1} \\
cc &:= .0007 \cdot \text{y}^{-1} \\
A &:= \frac{[F_{\max} - F_0]}{F_0} & A1 &:= \frac{[F1_{\max} - F1_0]}{F1_0} \\
&& A &= 9.99 \cdot 10^2 & A1 &= 3.29999 \cdot 10^5 \\
\\
a &:= 0.01 \cdot \text{Pg} \cdot \text{y}^{-2} & \text{assumed linear (a) and logistic (b) rates} \\
b &:= 0.02782 \cdot \text{y}^{-1} & \text{of fossil fuel oxidation} \\
c &:= 0.0485 \cdot \text{y}^{-1} & a \cdot \text{day}_0 &= 18 \cdot \text{Pg} \cdot \text{y}^{-1} \\
&& a \cdot (z - 1800 \cdot \text{y}) & \text{day}_n &= 2.11 \cdot 10^3 \cdot \text{y} \\
F(z) &:= \frac{F_{\max}}{\left[1 + A \cdot \left[e^{-b \cdot [z - 1800 \cdot \text{y}]}\right]\right]} - \frac{F1_{\max}}{\left[1 + A1 \cdot \left[e^{-c \cdot [z - 1800 \cdot \text{y}]}\right]\right]} + [P_{\text{ref}} \cdot \left[1 - e^{-[cc \cdot [z - 1800 \cdot \text{y}]]}\right]] \\
&& F(2050 \cdot \text{y}) &= 8.972674 \cdot \text{Pg} \cdot \text{y}^{-1}
\end{aligned}$$

$$\begin{aligned}
F(1860 \cdot \text{y}) &= 0.291831 \cdot \text{Pg} \cdot \text{y}^{-1} & F(1980 \cdot \text{y}) &= 4.837744 \cdot \text{Pg} \cdot \text{y}^{-1} & F(2110 \cdot \text{y}) &= 4.233108 \cdot \text{Pg} \cdot \text{y}^{-1} \\
F(1950 \cdot \text{y}) &= 2.496032 \cdot \text{Pg} \cdot \text{y}^{-1} & F(1992 \cdot \text{y}) &= 6.095853 \cdot \text{Pg} \cdot \text{y}^{-1}
\end{aligned}$$



"Optimistic" fossil fuel flux scenario.



Optimistic scenario with maximal  $ACO_2 < 500 \text{ ppmv}$ .

$$y_{2080} := 80 \cdot 36$$

$$y_{2070} := 70 \cdot 36$$

$$y_{2080} = 2.88 \cdot 10^3$$

$$y_{2070} = 2.52 \cdot 10^3$$

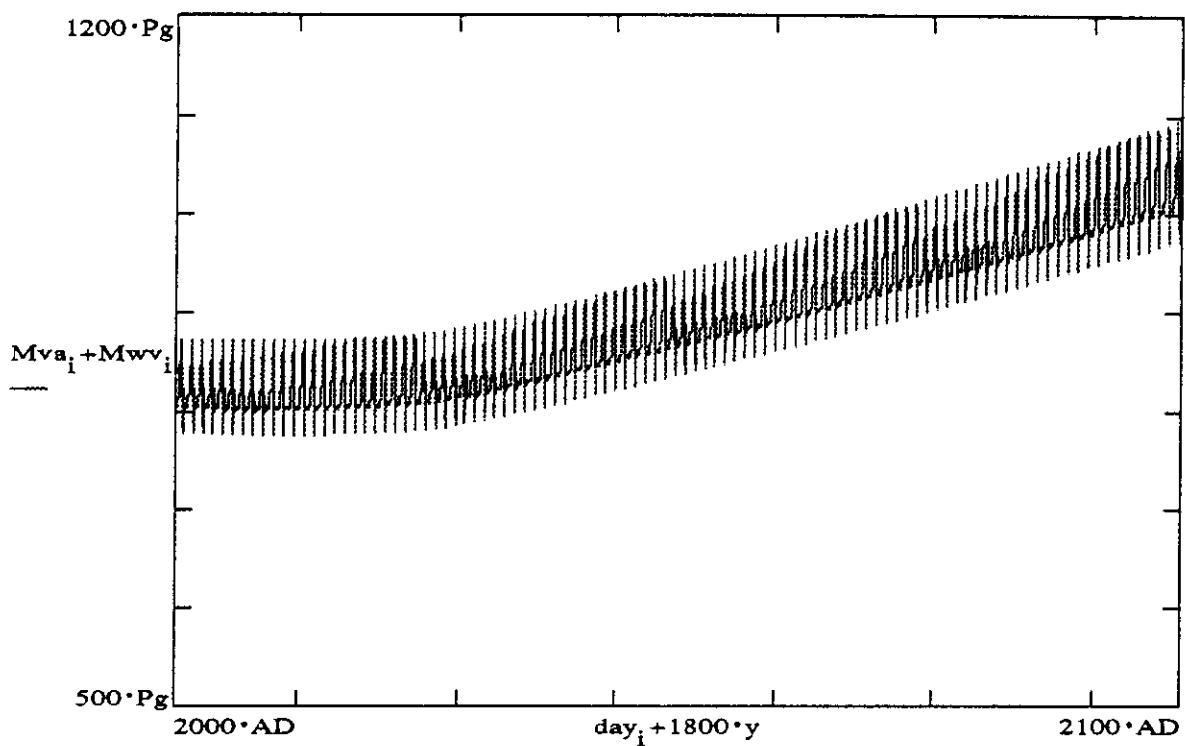
$$\text{decade} := y_{2070} .. y_{2080}$$

$$\alpha := \frac{Ma_{y_{2080}} - Ma_{y_{2070}}}{dh \cdot \left[ \sum_{\text{decade}} F[\text{day}_{\text{decade}}] \right]}$$

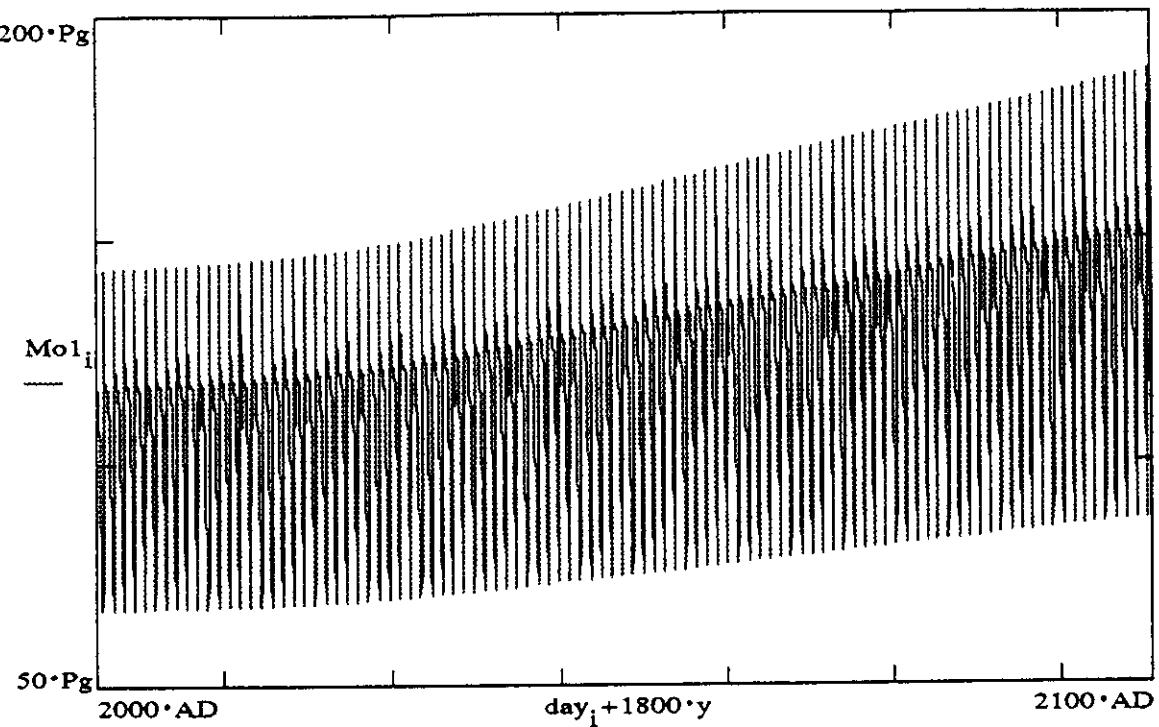
$$\alpha = 0.019631$$

Airborne fraction

\* can be wide variety of values depending on when it is calculated.



Vegetation exceeds level of 1800 AD, but  
is considerably lower than levels reached  
with high fossil fuel input.



Rapid turnover soil organic C. Continuing to accumulate C. Other fractions follow similar pattern.