



# Challenges in long-term historical fire reconstruction and modelling

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Photo : Loïc Fossard

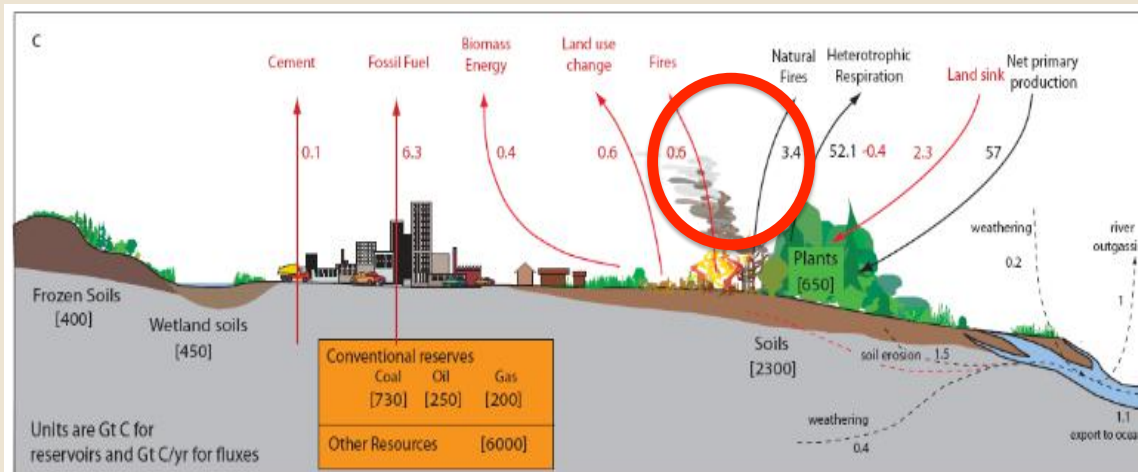


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Global burned Area : 300 – 450 Mha.year-1

Carbon emissions from fires: 3-4 GtC.year-1  
=> 50% of Fossil Fuel emissions



## How to estimate fire emissions to the atmosphere?

A simple equation...

$$\text{Emissions} = S \cdot B \cdot C$$

Burnt Area (m<sup>2</sup>)

Biomass (gC.m<sup>-2</sup>)

Combustion efficiency (%)

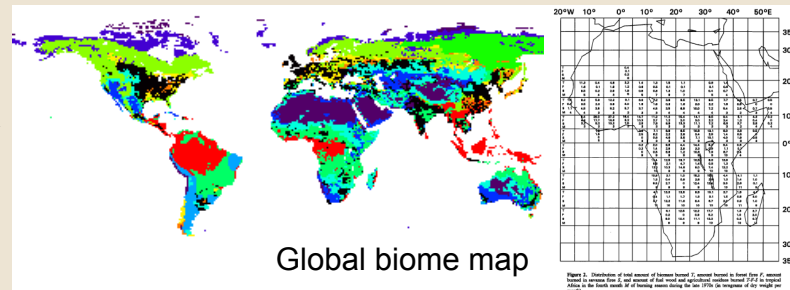
... with high uncertainties

# Challenges for estimating the global burned area

## First approach: fire return interval in major biomes

Hao and Liu 1996  
Seiler & Crutzen 1980

Fire return interval x



**FAO, 2000. the global fire assessment Report:**  
compilation of national fire statistics



## Challenges for estimating burned areas:

**From 2000:** the Emergence of global burned area products from remote sensing

Eva and Lambin 1998

Barbosa et al. 1999: continental scale approaches

Dwyer et al. 2000: global estimate from remote sensing

Limits:

=> Continental scale

=>1 year of data

**2000-present:** global Burned area products

Mouillot et al. 2014

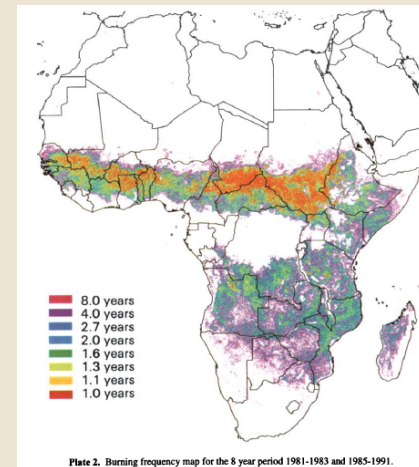


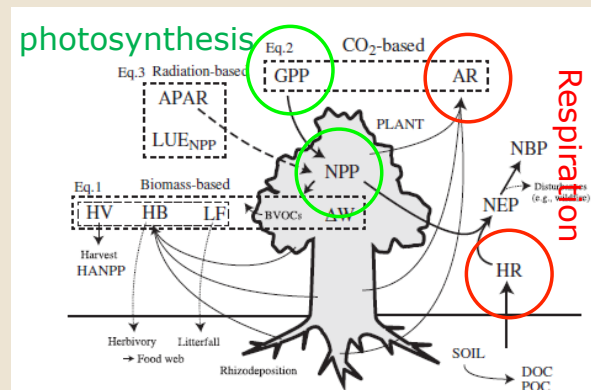
Plate 2. Burning frequency map for the 8 year period 1981-1983 and 1985-1991.

Barbosa et al. 1999

# Challenges for Biomass estimates

Biogeochemical models or Dynamic Global Vegetation Models (DGVM)

Major carbon fluxes in ecosystems

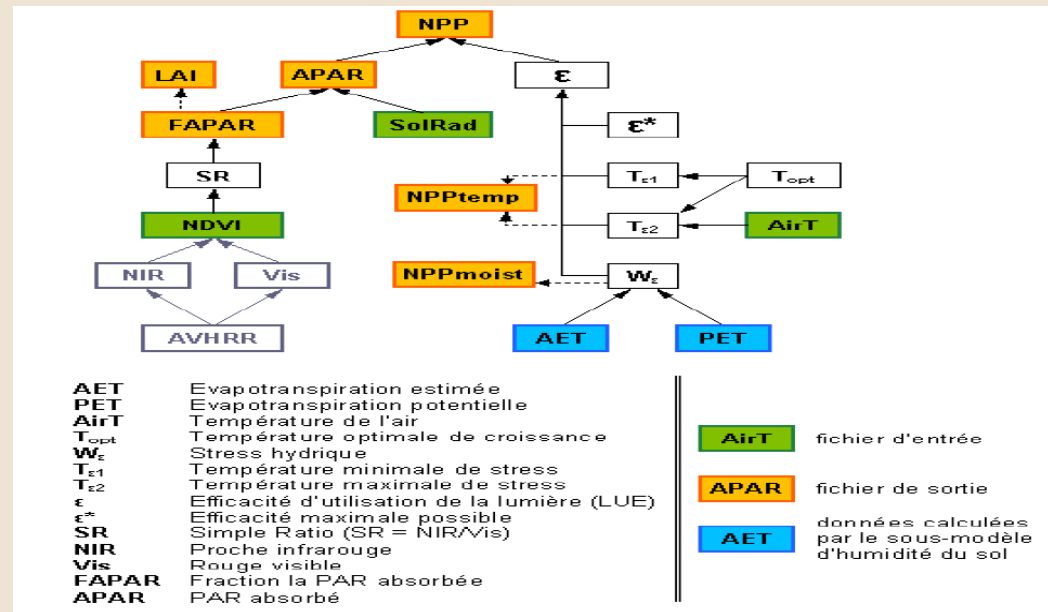


A biogeochemical model used for global fire emissions (GFED)

CASA (Potter al. 1993, Field et al. 1995)

Main assumption:

C assimilation is driven by climate and Leaf Area Index from remote sensing

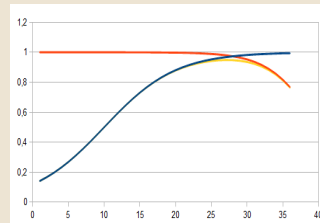


$$NPP(x,t) = IPAR(x,t) * \varepsilon(x,t)$$

$$IPAR(x,t) = FPAR(x,t) * solrad(x,t) * solarconversion$$

$$\varepsilon(x,t) = E_{\max} * NPP_{temp} * NPP_{moist}(x,t) \quad \text{Light use efficiency: gC.MJ}^{-1}$$

$$\rightarrow NPP_{temp} = T_{\varepsilon 1} * (1.1919 * T_{\varepsilon 2low} * T_{\varepsilon 2high})$$



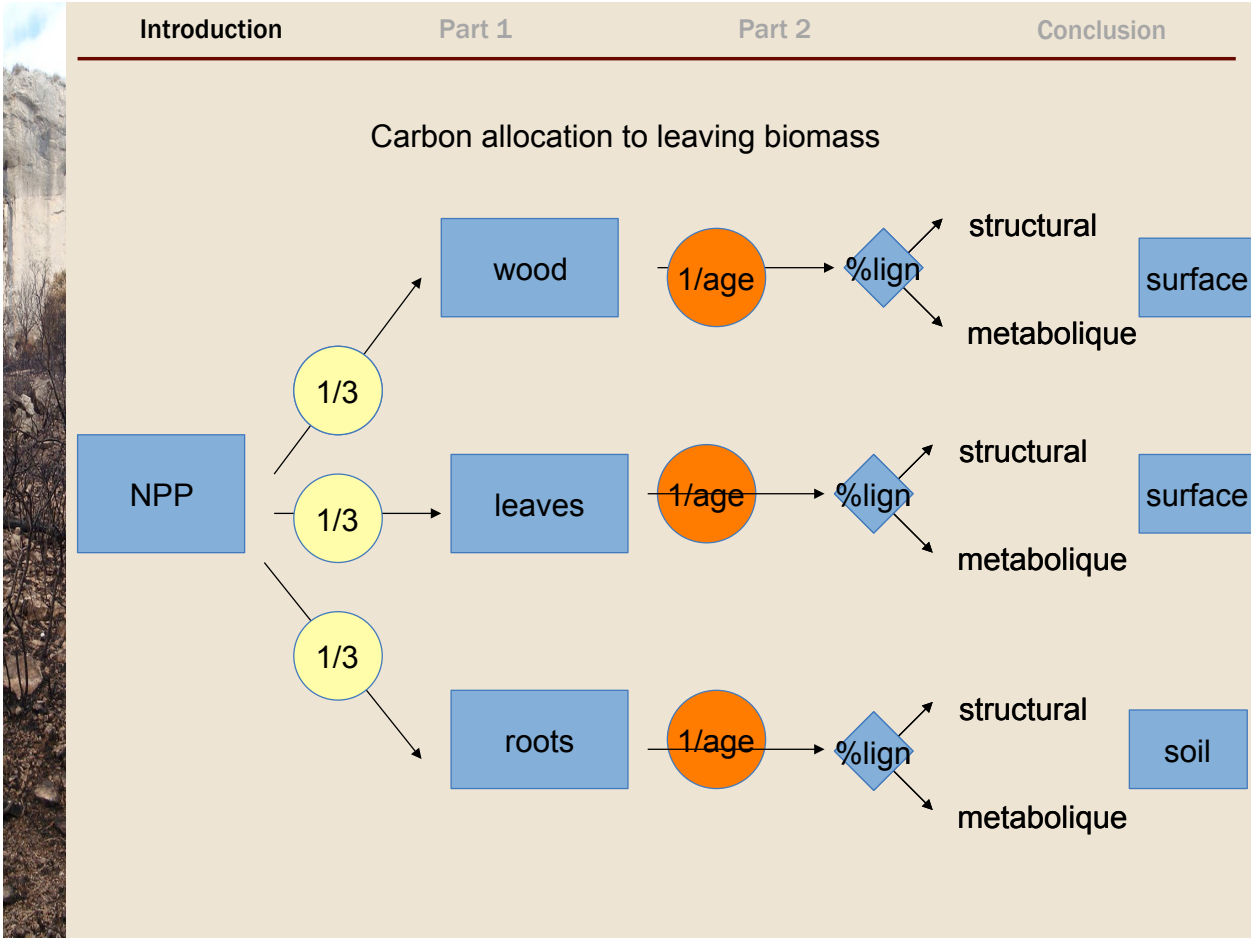
$$T_{\varepsilon 1} = 0.8 + (0.02 * T_{opt}) - (0.0005 * (T_{opt}^2))$$

$$T_{2low} = \frac{1}{(1 + \exp(0.2 * (T_{opt} - 10 - T_{air}(x,t))))}$$

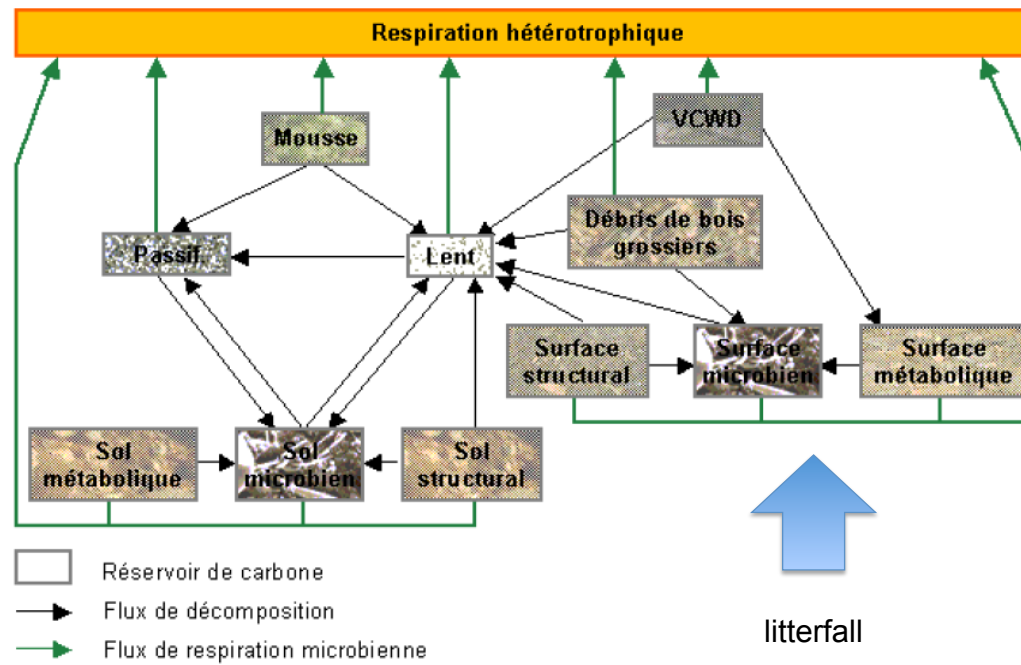
$$T_{2high} = \frac{1}{(1 + \exp(0.3 * (T_{air}(x,t) - 20 - T_{opt})))}$$

$$\rightarrow NPP_{moist}(x,t) = 0.2 + (0.8 * \frac{EET(x,t)}{PET(x,t)})$$





Soil decomposition pools and heterotrophic respiration  
CENTURY Model *Parton et al. 1992*



### Climate control on soil respiration

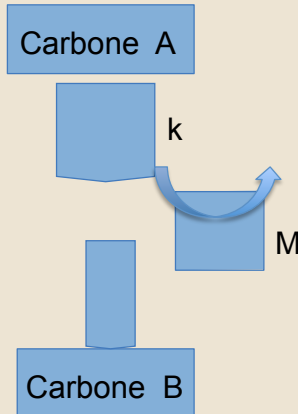
C Stock

micro-organism efficiency

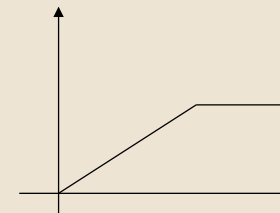
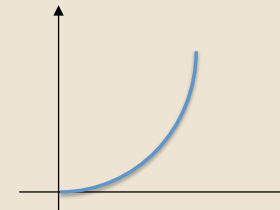
$$R_h = \sum_1^i C_i * k_i * T_{Rh} * W_{Rh} * M_{ei}$$

Constant Decomposition rate

$$T_{Rh} = Q_{10}^{(T_{air}-30)/10}$$



$$W_{rh} = RWC/PET$$



## Main Challenges for modelling C emissions to atmosphere

### 1. Present C emissions:

How accurate/reliable are global Burned area products

### 2. Past C emissions:

Can we go further (backward) than the remote sensing era?

### 3. Future C emissions:

Can we go beyond deterministic C emissions and identify processes to project future fire regimes?

## Part 1: Present Global Burned Area

Since 2000, the emergence of remotely sensed global BA products

**Table 1**

Overview of global burned area dataset from spaceborne remote sensing.

Name of dataset	Time span	Satellite	Spatial resolution	Temporal resolution	Status	Development purpose	Source
GFED3	1996.07–present	MODIS 500 m, TRIM/VIRS, ATSR	0.5 d × 0.5 d	Monthly	Operational	Atmospheric and bio-geochemical models	Giglio et al. (2010)
MCD45A1	2000–2009	MODIS 500 m	500 m	Monthly	Operational	General purpose	Roy et al. (2008)
L3JRC	2000–2007	SPOT VEGETATION	1 km	Daily	Finished	General purpose	Tansey et al. (2008a,b)
Globcarbon	1998.04–2007.12	SPOT VEGETATION, ATSR-2, AATSR	1 km, 0.25 or 0.5 degree	Monthly	Finished	Targeted for global carbon cycling and climate modelling use	Plummer et al. (2006)
GBS	1982–1999	NOAA-AVHRR GAC 8 km data	8 km	Weekly	Finished	Globally consistent records of global fire activity.	Carmona-Moreno et al. (2005)
GLOBSCAR	>2000	ERS2-ATSR2	1 km	Monthly	Finished	Producing global incremental monthly maps of burned areas	Simon et al. (2004)
GBA2000	2000	SPOT VEGETATION	1 km	Monthly	Finished		Tansey et al. (2004)

Mouillot et al. 2014, *Int. J. Earth Obs. and Geoinf*

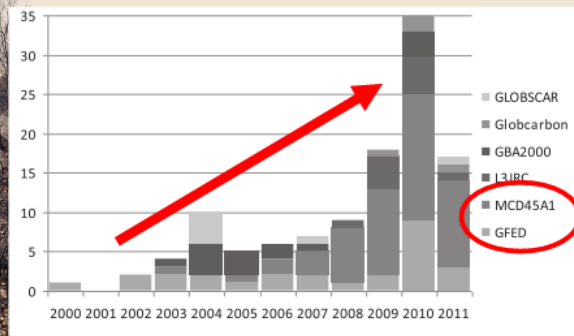
GFED 4 Giglio et al. 2013

ESA fire Cci: 2006-2008, MERIS, 1km / 0.5°, Daily, operational , Alonso et al. 2015

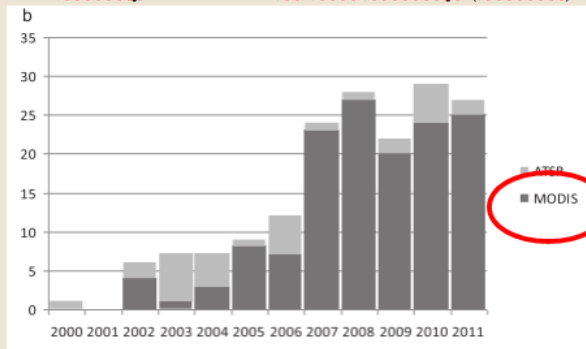
<http://www.esa-fire-cci.org/>

BA from MODIS sensor increasingly used as the reference dataset

Yearly citations of BA products (isiweb)



Yearly citations of fire activity (isiweb)



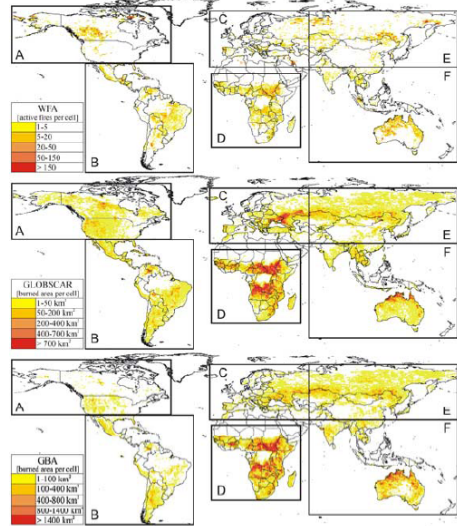
## How reliable and consistent are burned area products?

From 211  $\cdot 10^4$  km<sup>2</sup>.yr<sup>-1</sup> to 503  $\cdot 10^4$  km<sup>2</sup>.yr<sup>-1</sup>

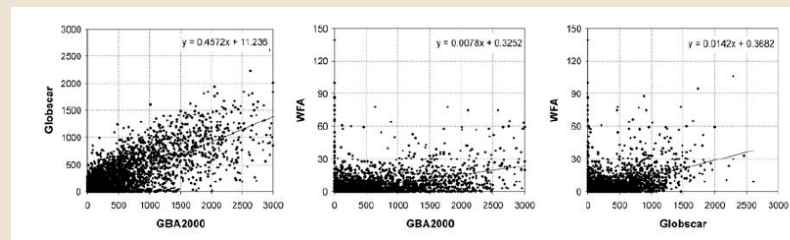
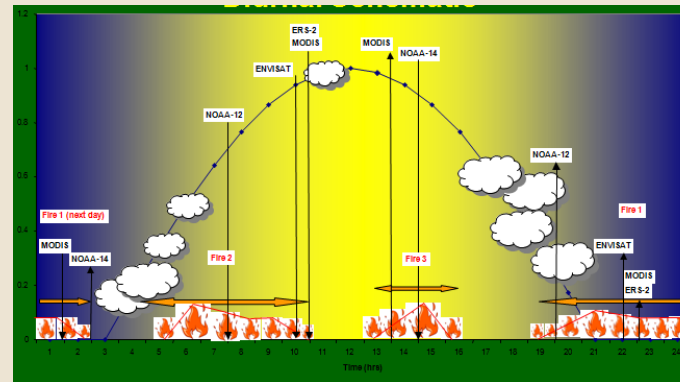
**Table 3.** Annual Global Burned Area Estimated by Different Studies

Source	Study Period	Annual Burned Area ( $10^4$ km <sup>2</sup> yr <sup>-1</sup> )	Study Approach
GFED4 [Giglio <i>et al.</i> , 2013]	1997–2011	348	multiple satellite observations
GFED3 [Giglio <i>et al.</i> , 2010]	1997–2010	363	multiple satellite observations
GFED2 [van der Werf <i>et al.</i> , 2006]	1997–2004	329	multiple satellite observations
MCD45A1 [Roy <i>et al.</i> , 2008]	2002–2010	338	satellite observation
L3JRC [Tansey <i>et al.</i> , 2008]	2000–2007	392	satellite observation
GBA2000 [Tansey <i>et al.</i> , 2004]	2000	350	satellite observation
GlobScar [Simon <i>et al.</i> , 2004]	2000	211	satellite observation
[Randerson <i>et al.</i> , 2012]	2001–2010	464	satellite observation
[Kloster <i>et al.</i> , 2010]	1997–2004	300	process-based fire model
[Li <i>et al.</i> , 2012]	1997–2004	330	process-based fire model
[Schultz <i>et al.</i> , 2008]	1960–2000	383	hybrid of official statistics and process-based fire model
[Mouillot and Field, 2005]	1900–2000	503	hybrid official statistics and satellite observation
This study	1901–2007	442	hybrid of process-based fire model and satellite observation

Yang *et al.* 2014



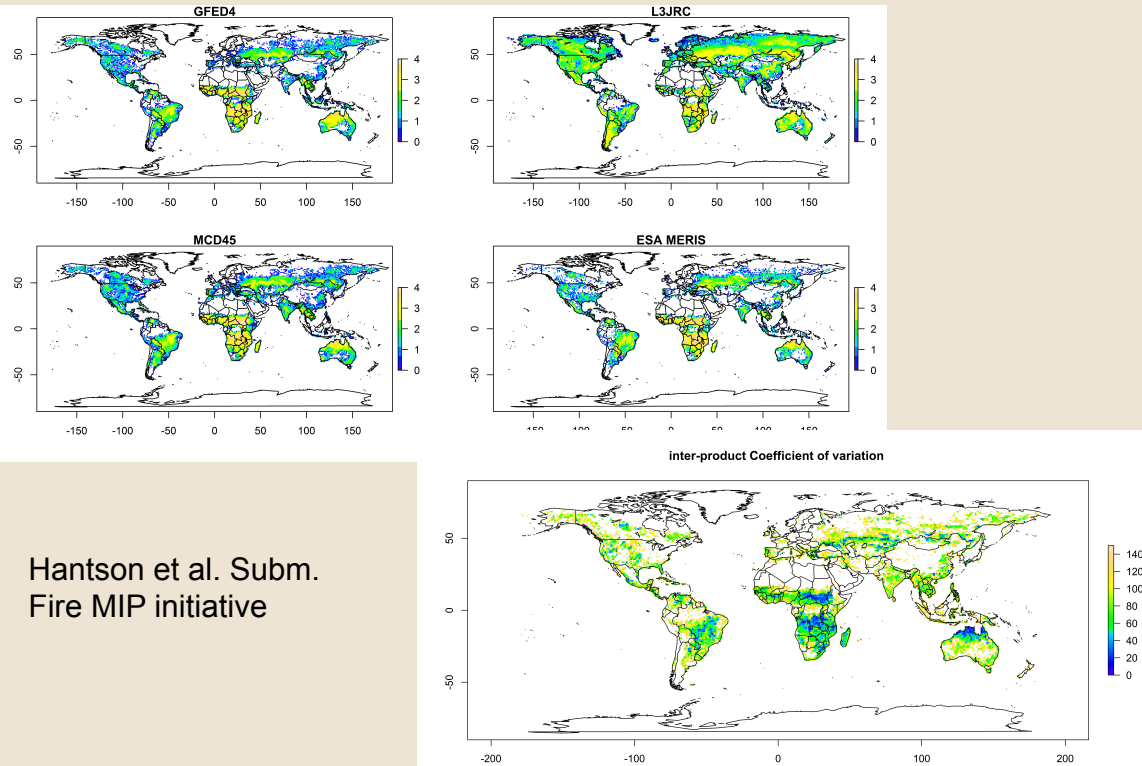
Pixel to pixel Inter-product discrepancies:  
Due to Different timing



*Boschetti et al. 2005*



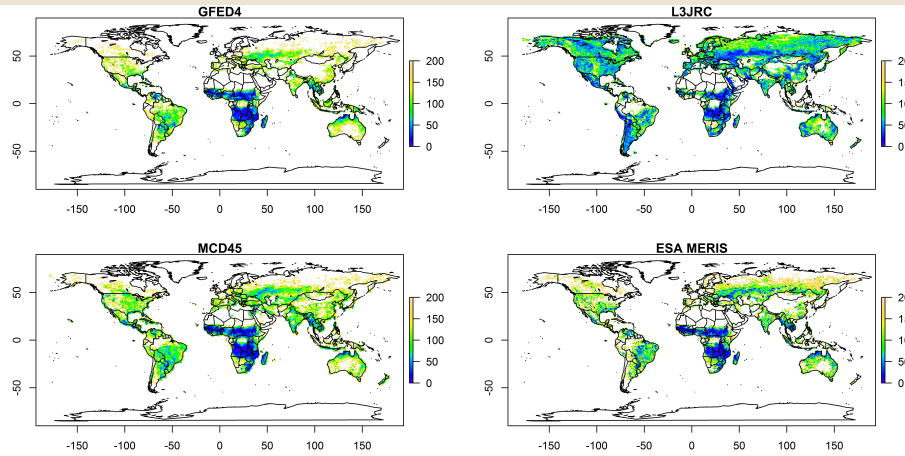
### Global BA product intercomparison: burned area



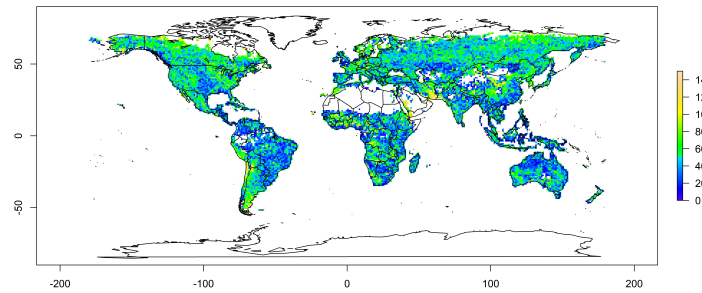
Hantson et al. Subm.  
Fire MIP initiative



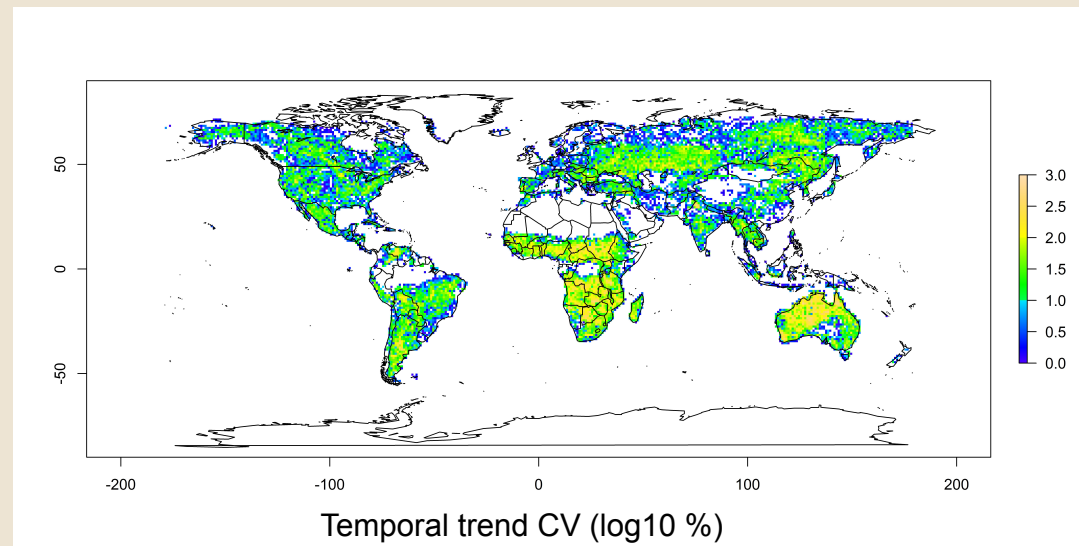
### Global BA product intercomparison: interannual Coeff. Var.



Hantson et al. Subm.  
Fire MIP initiative



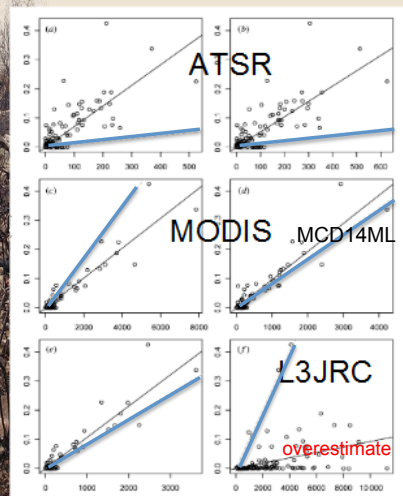
### Global BA product intercomparison: temporal trend 2000-2007



Hantson et al. Subm.  
Fire MIP initiative

### How do global BA product compare with national statistics?

#### EUROPE



Loepfe et al. 2012

#### North America

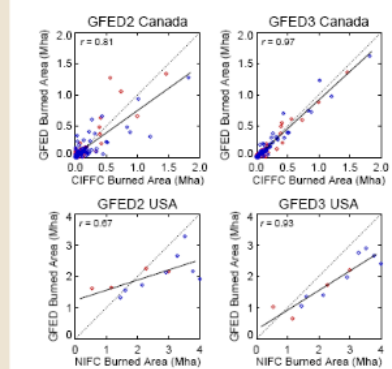
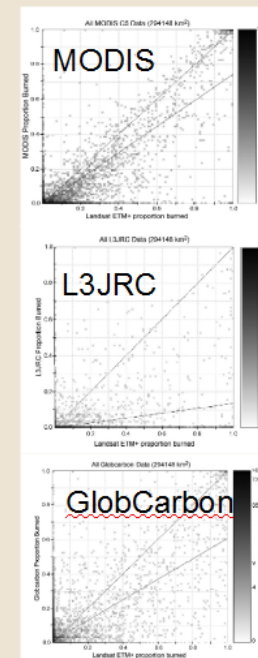


Fig. 15. 1997–2008 GFED2 (left column) and GFED3 (right column) annual burned area totals versus independent annual totals compiled by the Canadian Interagency Forest Fire Centre (<http://www.cifrc.ca/>) for nine Canadian provinces (top row) and the National Interagency Fire Center ([http://www.nifc.gov/fire\\_info/fire\\_stats.htm](http://www.nifc.gov/fire_info/fire_stats.htm)) for the United States (bottom row). Totals from the pre-MODIS era are shown in red, totals from the MODIS era (2001 onward) are shown in blue.

Giglio et al. 2010

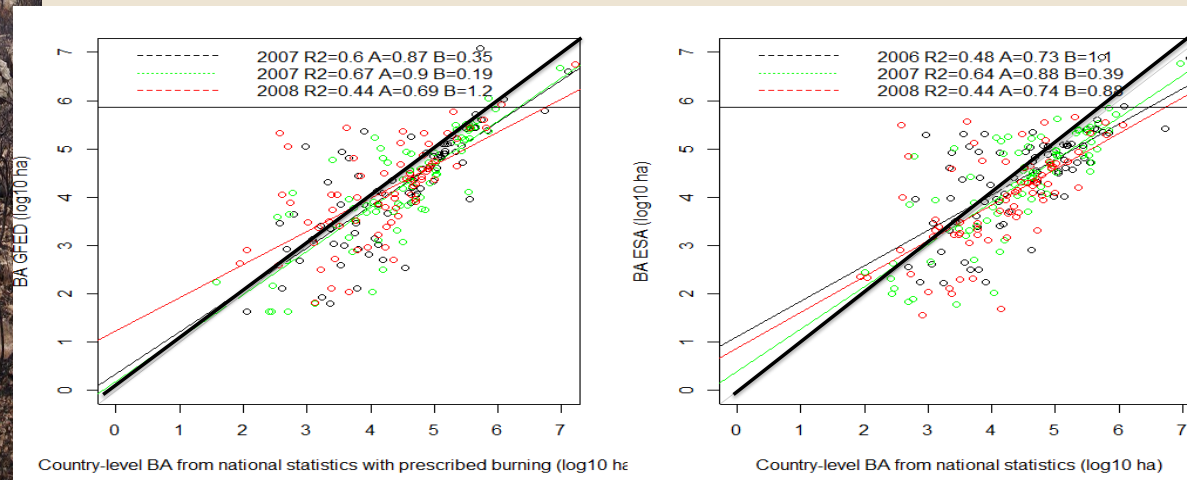


Roy & Boschetti 2009

A generic agreement for an underestimation of BA compared to national statistics

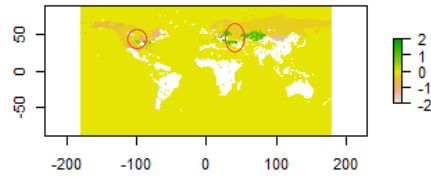
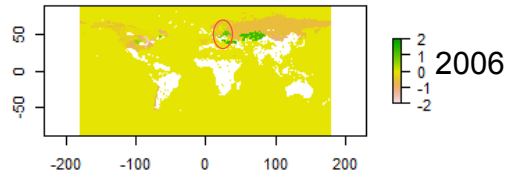
GFED4

ESA Fire CCI



GFED

ESA

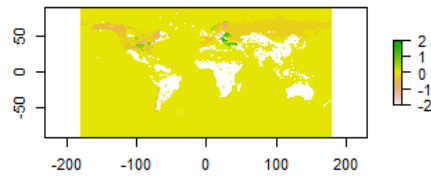
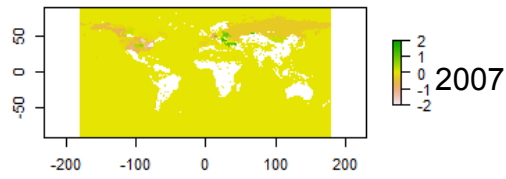


RS > Nat. Stat

Nat Stat > RS

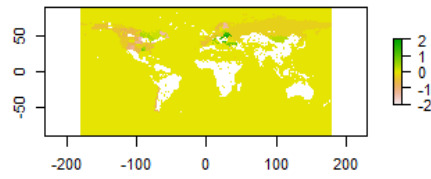
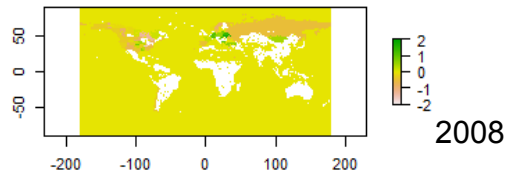
difference BA GFED - Nat.Stat

difference BA ESA - Nat.Stat

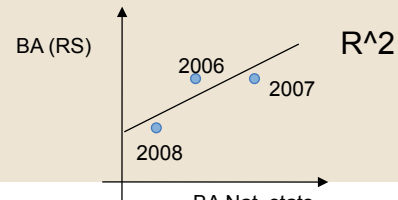


difference BA GFED - Nat.Stat

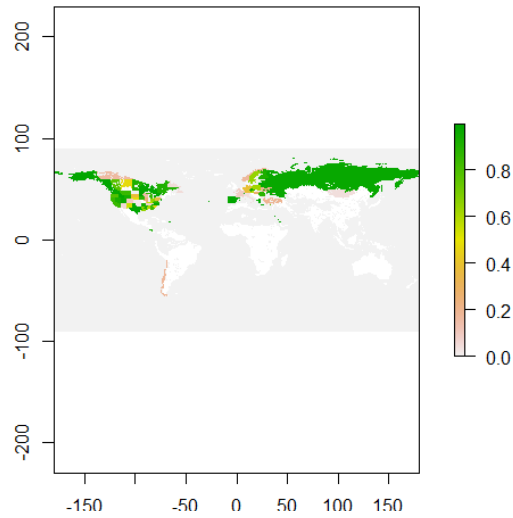
difference BA ESA - Nat.Stat



### Temporel trend agreement between national statistics and GFED/ESA



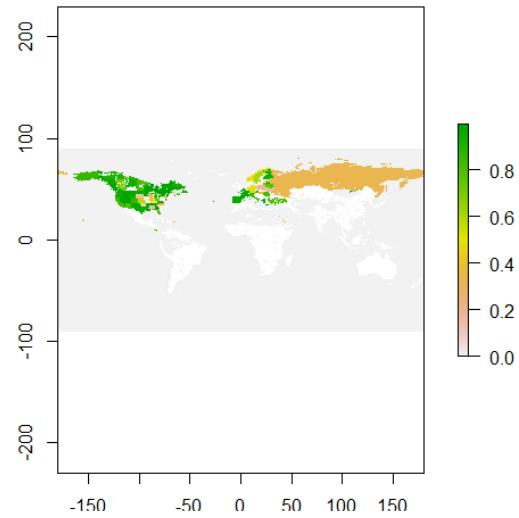
R<sup>2</sup> ESA vs Nat. Stats



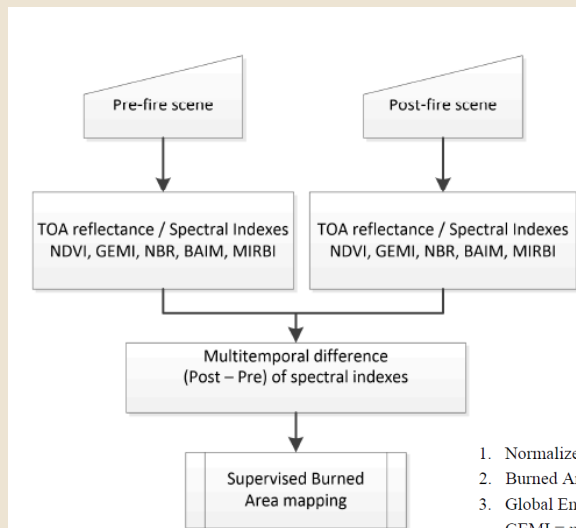
BA Nat. stats



R<sup>2</sup> GFED vs Nat. Stats



## Other burned area assessment tools: local high resolution remote sensing data Landsat 30 m, 15 days



*BAMS software*  
*Bastarrika et al. 2014, Remote Sensing*

1. Normalized Difference Vegetation Index (NDVI) [34],  $NDVI = (\rho_{NIR} - \rho_{RED}) / (\rho_{NIR} + \rho_{RED})$
2. Burned Area Index Modified (BAIM) [35],  $BAIM = 1 / ((\rho_{NIR} - 0.05)^2 + (\rho_{SWIRL} - 0.2)^2)$
3. Global Environmental Monitoring Index (GEMI) [36],  
 $GEMI = \eta (1 - 0.25 \eta) - (\rho_{RED} - 0.125) / (1 - \rho_{RED})$
4. Normalized Burned Ratio (NBR) [37],  $NBR = (\rho_{NIR} - \rho_{SWIRL}) / (\rho_{NIR} + \rho_{SWIRL})$  and
5. Mid-Infrared Burned Index (MIRBI) [38],  $MIRBI = 10 \rho_{SWIRL} - 9.8 \rho_{SWIRS}$

where

$$\eta = (2 (\rho_{NIR}^2 - \rho_{RED}^2) + 1.5 \rho_{NIR} + 0.5 \rho_{RED}) / (\rho_{NIR} + \rho_{RED} + 0.5)$$

$\rho_{RED}$  = Red reflectance

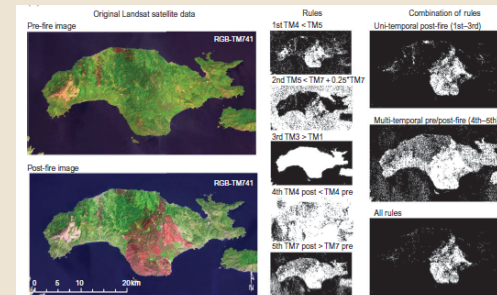
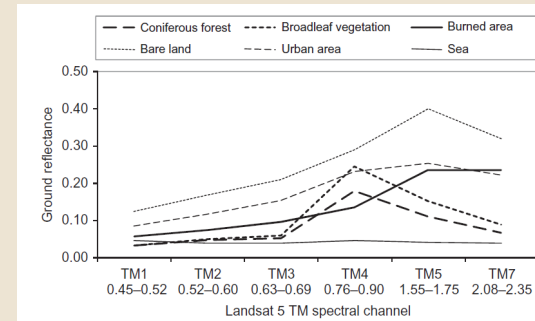
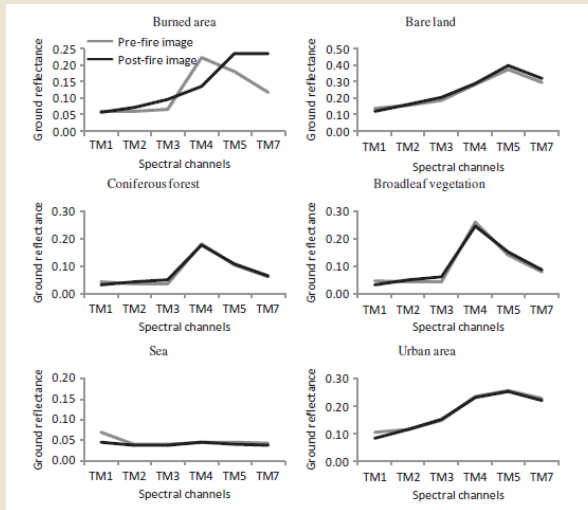
$\rho_{NIR}$  = Near Read Infrared reflectance

$\rho_{SWIRS}$  = Short Wave Infrared Short reflectance (approximately wavelength center in 1.6  $\mu\text{m}$ )

$\rho_{SWIRL}$  = Short Wave Infrared Long reflectance (approximately wavelength center in 2.2  $\mu\text{m}$ )



### Other burned area assessment tools: local high resolution remote sensing data Landsat 30 m, 15 days

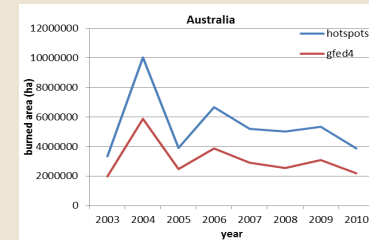
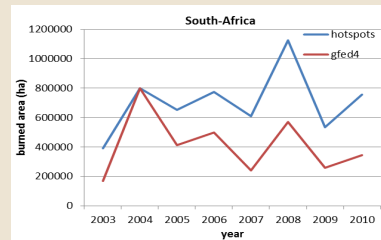
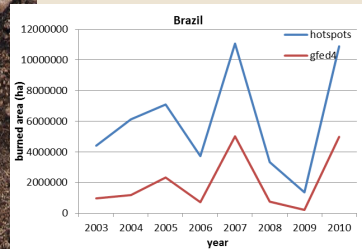
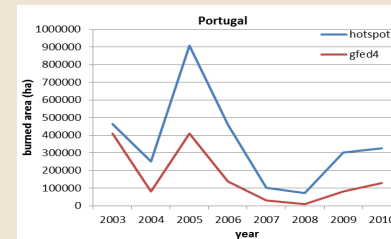
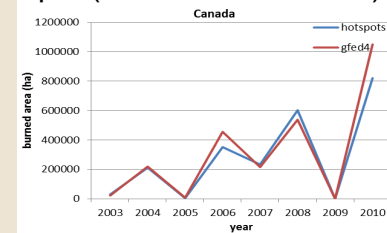
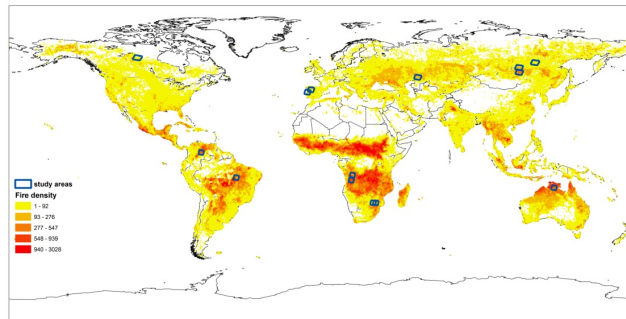


(b)

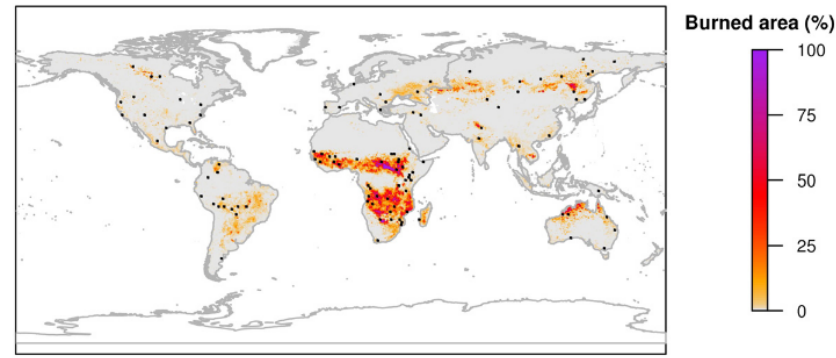
Koutsias et al. 2013



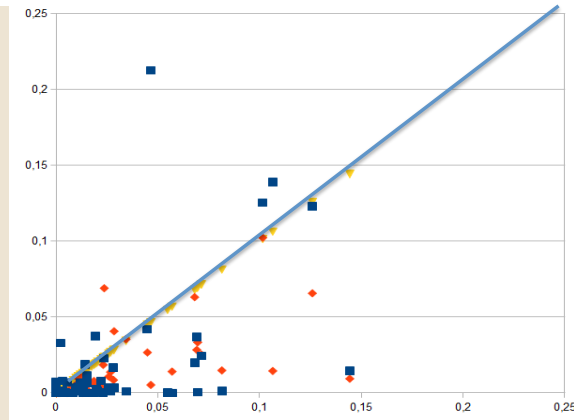
### GFED comparison with landsat data/MODIS hotspot (Hantson et al. 2014)



Global comparison (Landsat 151 test sites vs GFED, Padilla et al. 2015)



Global BA  
MERIS  
MCD45



Landsat BA



## Part 2: Can we go further than the remote sensing era?

Why do we need to go further back in time for Burned area?

1. Identify long term processes
2. Improve climate models
3. Long feed backs on post fire carbon sequestration



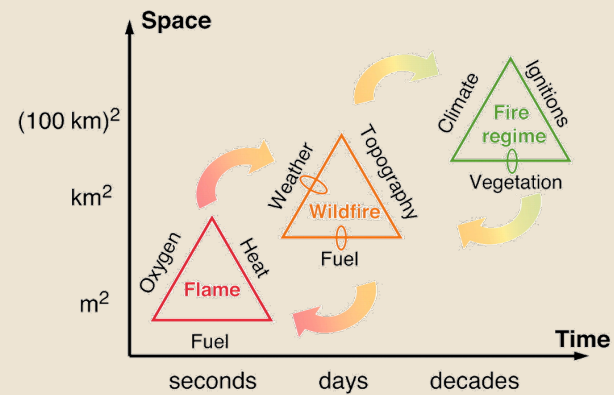
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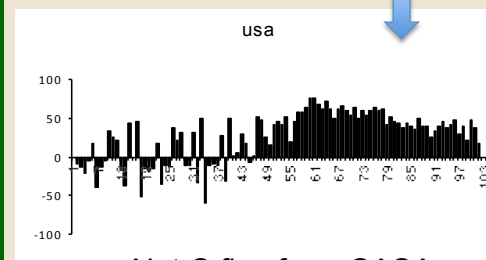
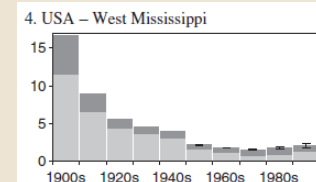
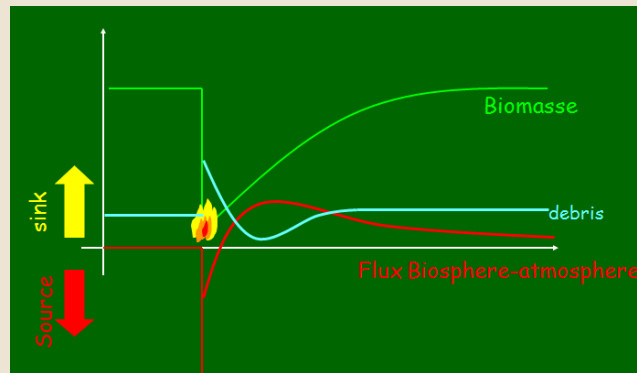
Moritz et al. 2005

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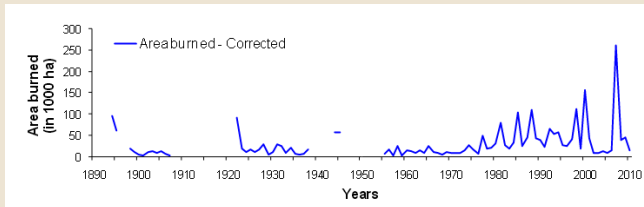
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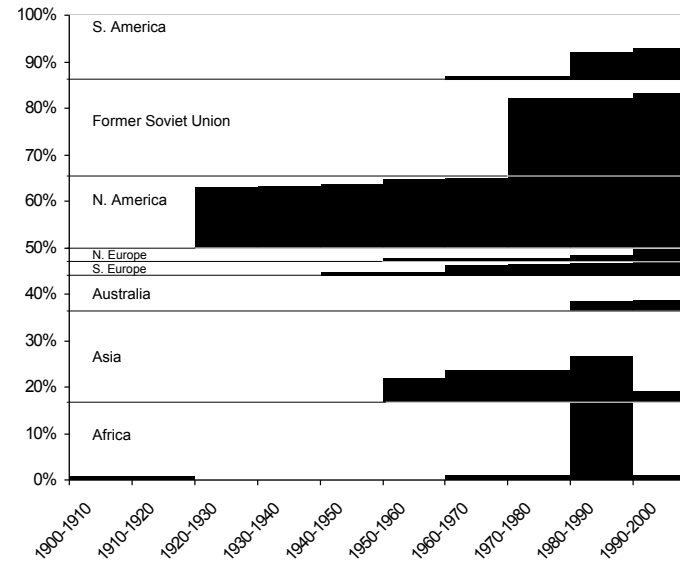


### Major source of information: national fire statistics...with significant gaps



Greece: Koutsias et al. 2012

Synthesis of available data  
For the 20th century  
Used in *Mouillot & Field (2005)*



## How reliable are national statistics?

**Warning: Inter-country Discrepancies in the definition of a 'fire'...**

**Wildfires:**

Forest fires

What is a forest (FAO: >10% tree cover, other: >30%)

Other lands

**Anthropogenic fires:**

Prescribed burning

Agricultural fires

Deforestation fires

**Fire types:**

Crown fires

Surface fires

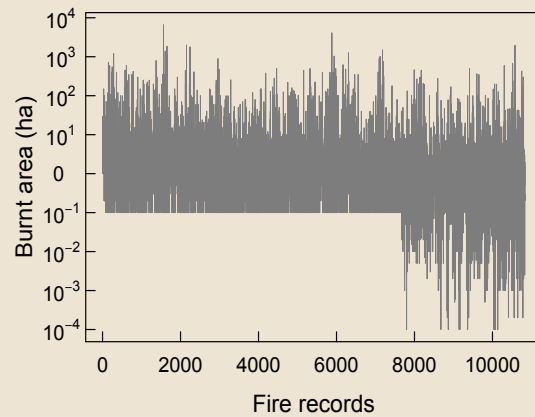
Smoldering combustion





# How reliable are national statistics?

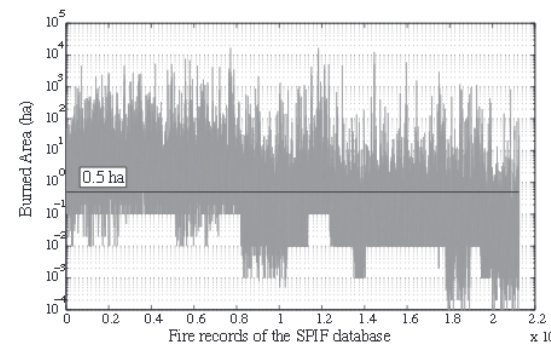
## France



*Ruffault and Mouillot, Ecosphere, in press*

Changes in reporting fire size thresholds along time

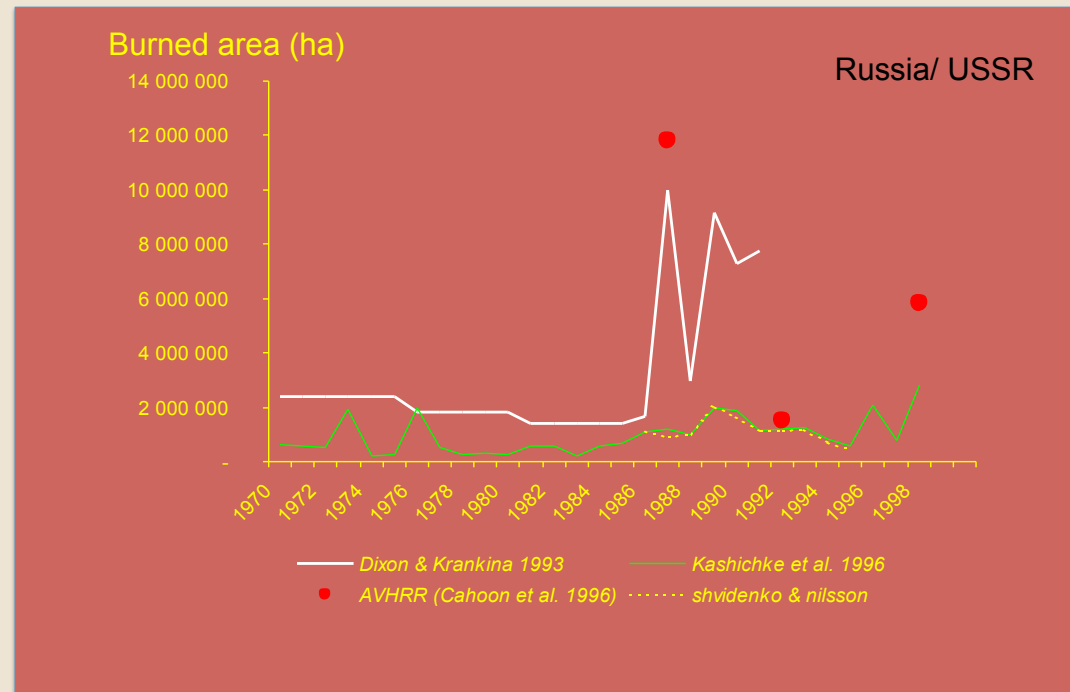
## Spain



*Turco et al. 2013*

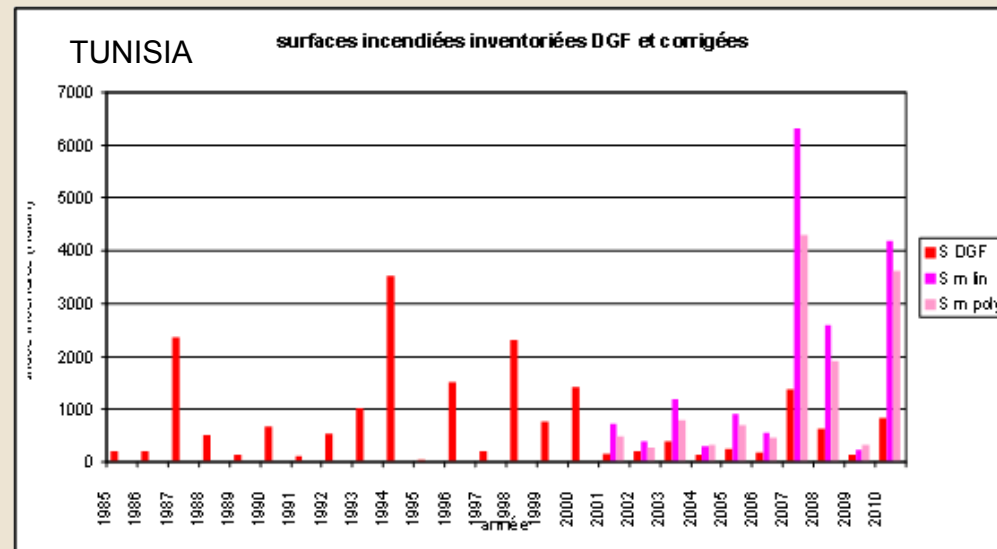
## How reliable are national statistics?

Evident Misreporting : political or social issues



## How reliable are national statistics?

Evident Misreporting : political or social issues



### A 'best guess' global fire history map for the 20th century

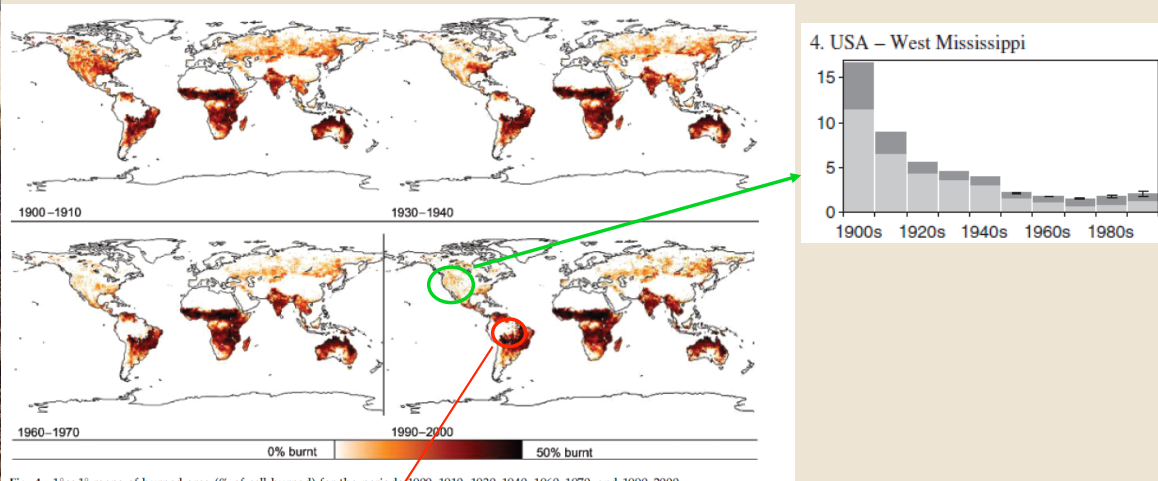
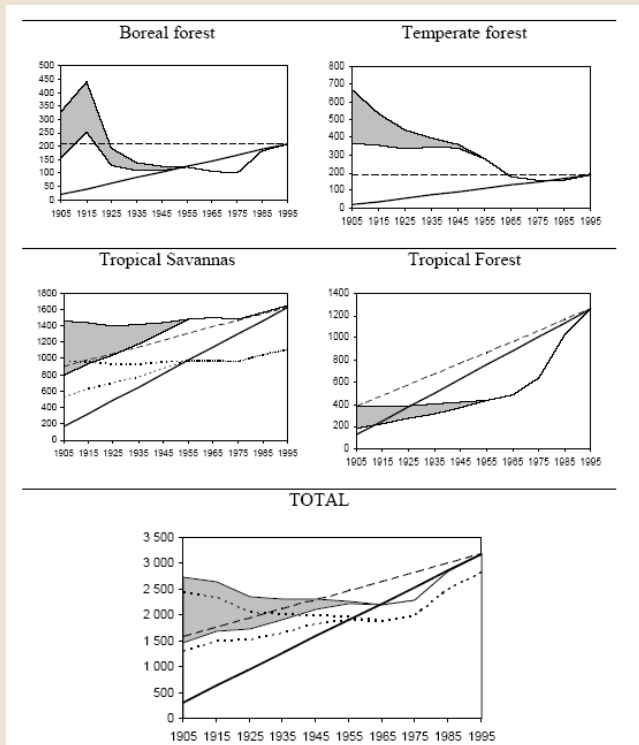


Fig. 4. 1° × 1° maps of burned area (% of cell burned) for the periods 1900–1910, 1930–1940, 1960–1970, and 1990–2000.

*Mouillot & Field 2005, Glob. Change Biol.*

### Historical fire emissions along the 20th century Hypothesis have changed since the 1990's...



[Crutzen and Zimmermann, 1991]

EDGAR-HYDE [Van Aardenne et al., 2001]

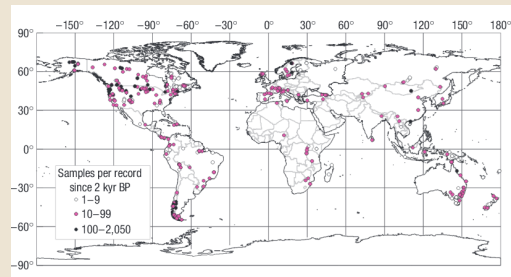
Mouillot et al. 2006



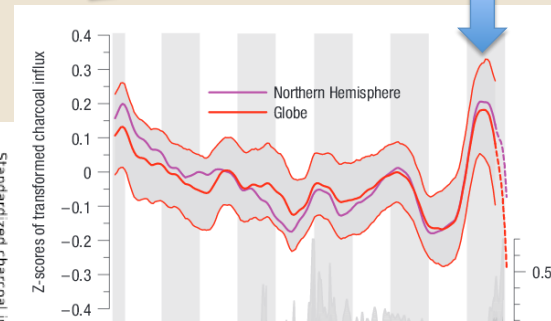
# Soil Charcoal as a qualitative source of information:

A New hypothesis: a high fire peak at the end of the 19th century

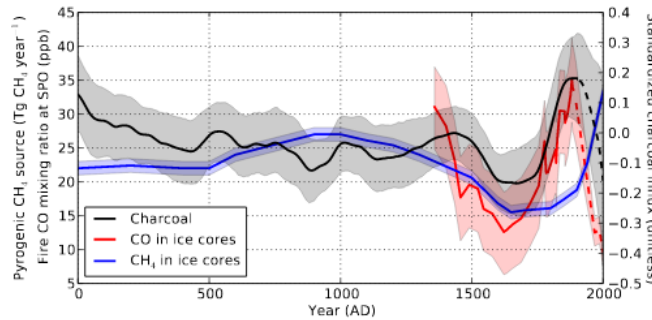
A global database



1850-1900



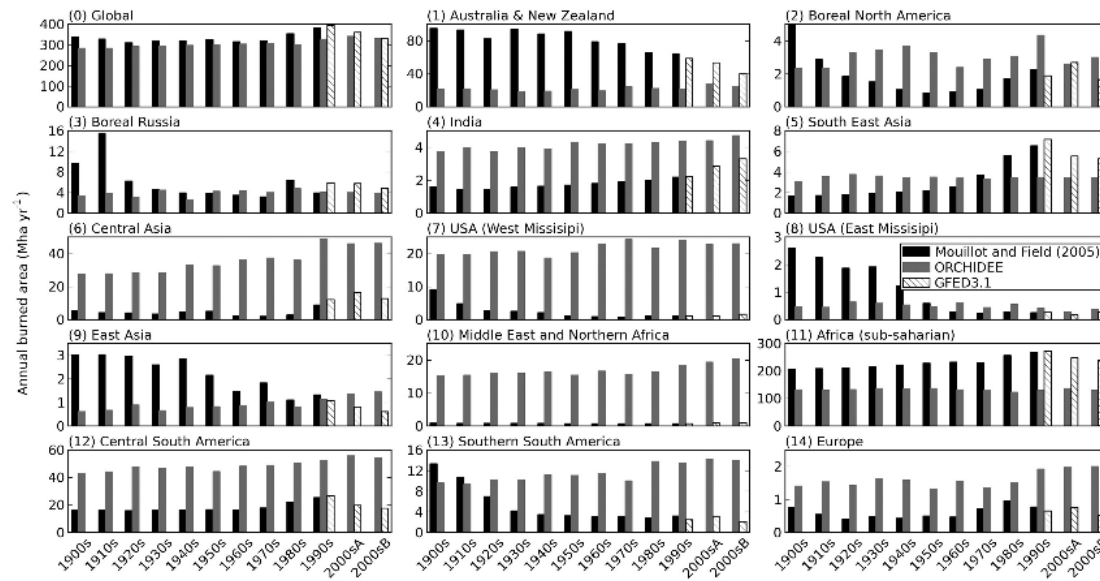
Marlon et al. 2008, nature geoscience



Van der Werf et al. 2013



Are we getting close to historical trends with fire models?... Not that much

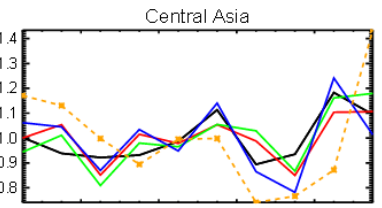
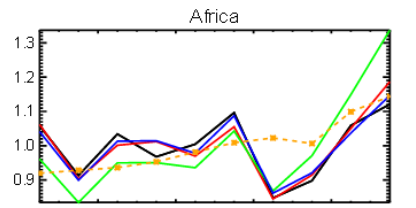
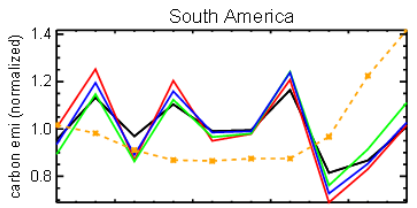
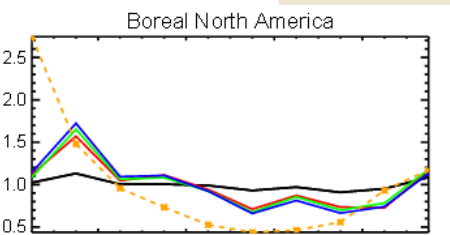
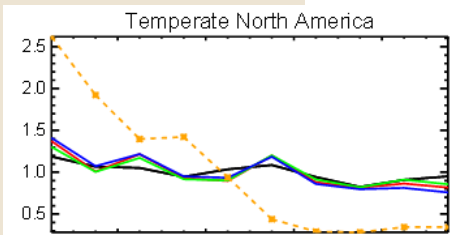
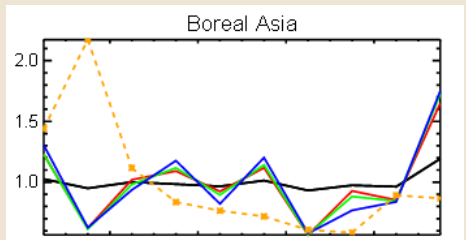


Introduction

Part 1

Part 2

Part 3



1900 1950 2000 1900 1950 2000 1900 1950 2000

DGVM CLM , Kloster et al. 2010



## Part 3: Projecting future fire regimes

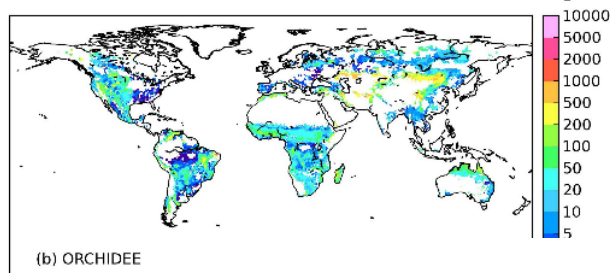
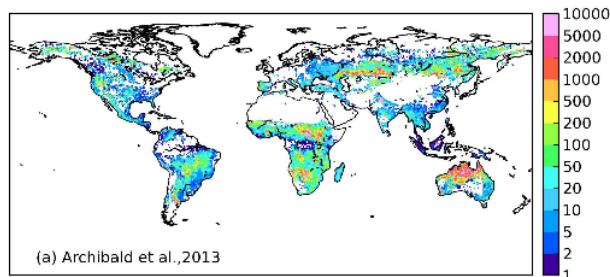
Future Modelling needs:

refining processes of fire spread and size distribution

How to account for abrupt non climatic changes: *Pausas and Keeley 2014, ecosystems*

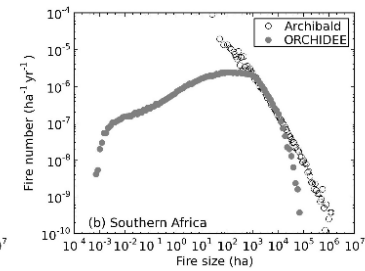
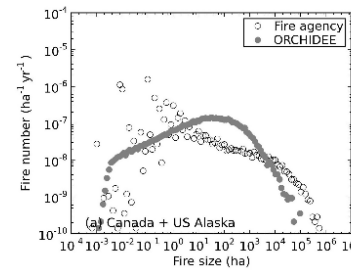
Invasive  
Fauna  
Policy





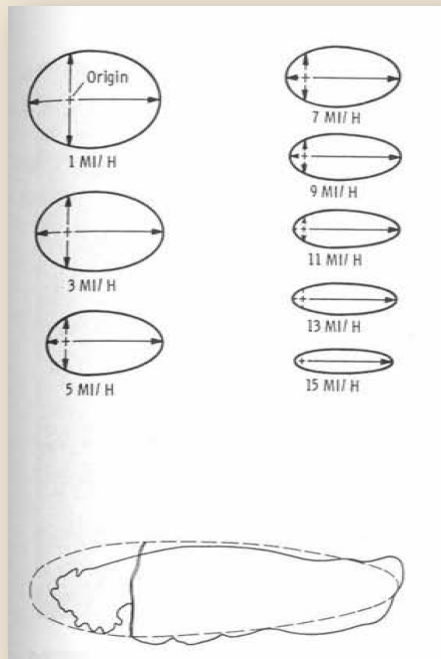
Beyond burned area:

Fire patch size in DGVMs  
ORCHIDEE SPITFIRE  
*Yue et al. (2014)*



Toward fire patch morphology with mid resolution burned area

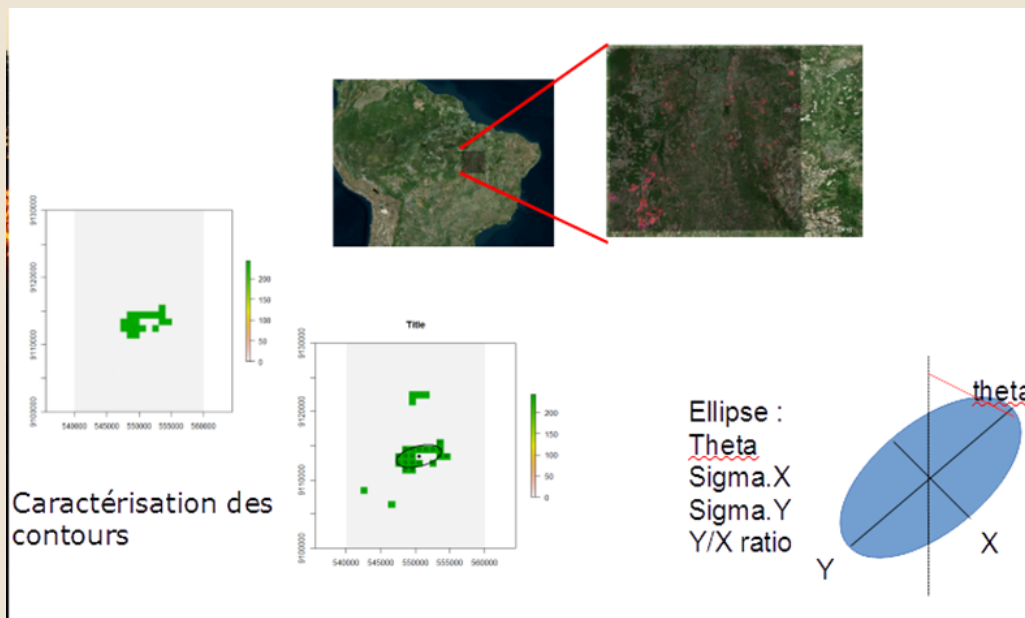
Pyne et al. 1996

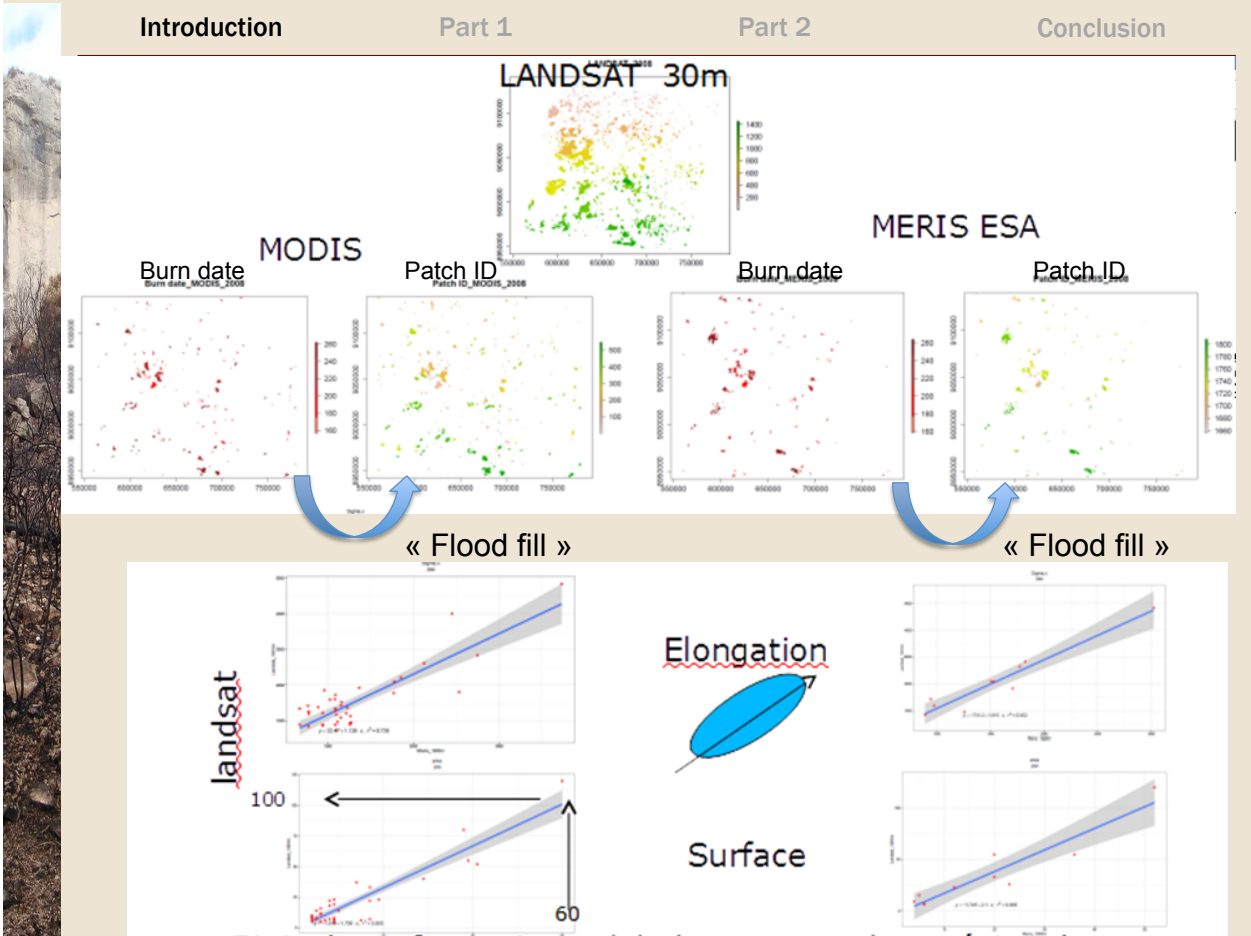


Fire elongation as a response to wind

Fire elongation simulated by DGVM fire module

### Tentative fire patch analysis with ESA 1km fire data





## Human impact on fire regime...

Exemple in southern France:

How changes in fire policy can abruptly reshape the fire weather relationship

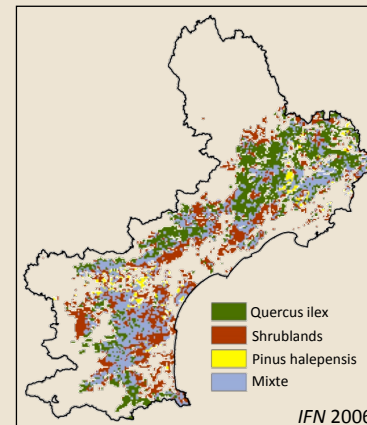
*Ruffault & Mouillot, Ecosphere in Press*

Study area : Languedoc-Roussillon (LR) region

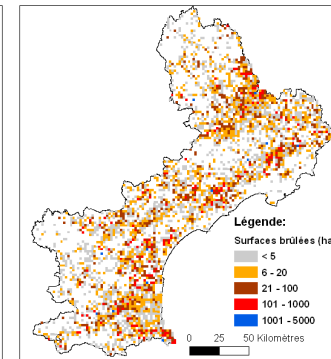
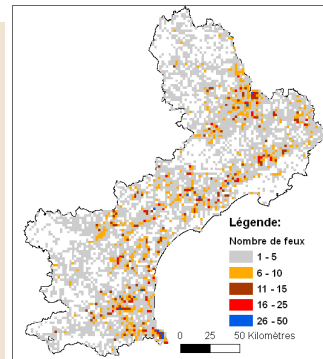
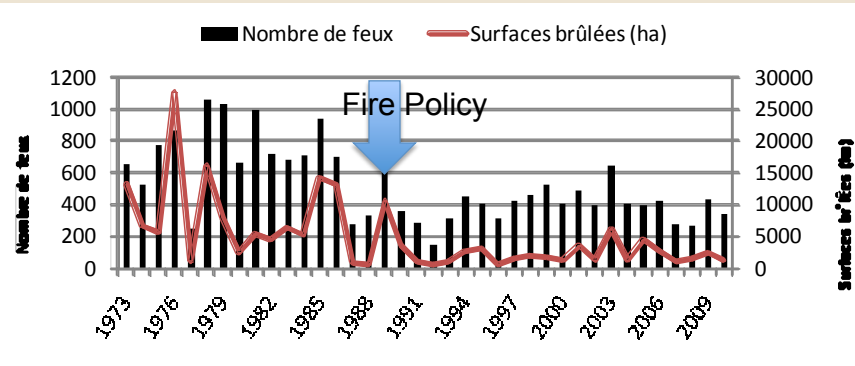
DEM of LR region



Mediterranean type ecosystems



### Historical fire regime and regional distribution





Introduction

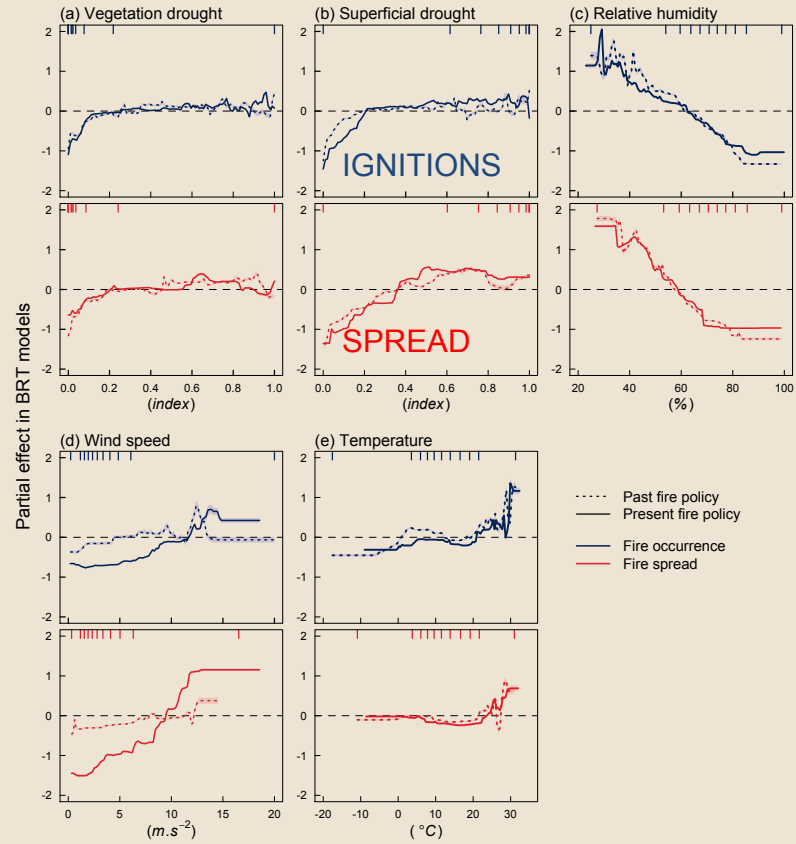
Part 1

Part 2

Part 3

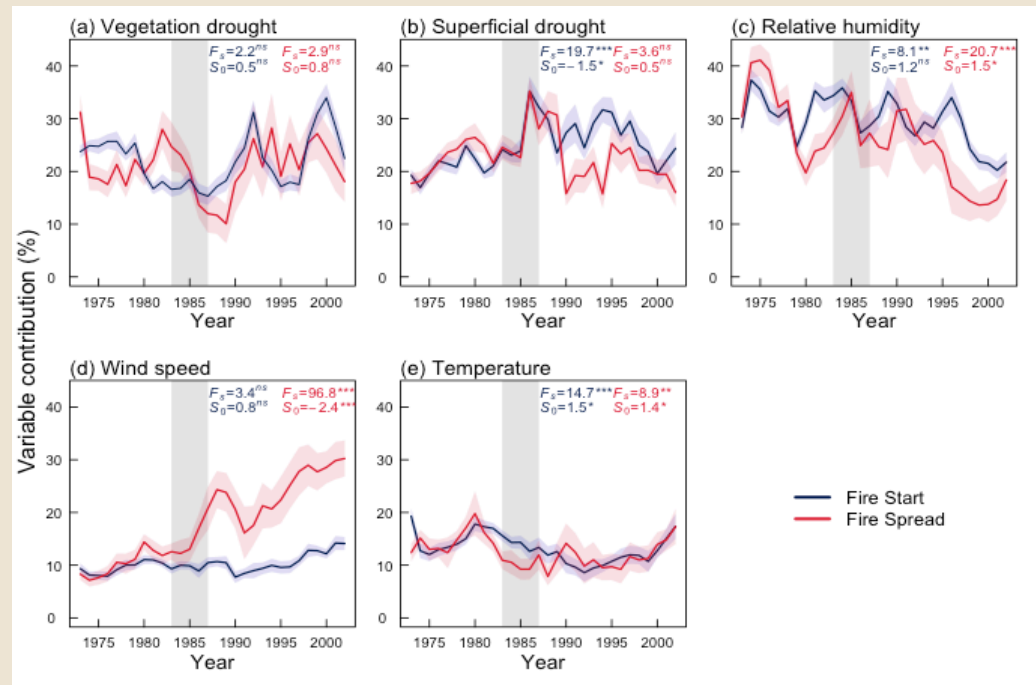
# Statistical assessment Of the fire weather

## Boosted Reg. Trees



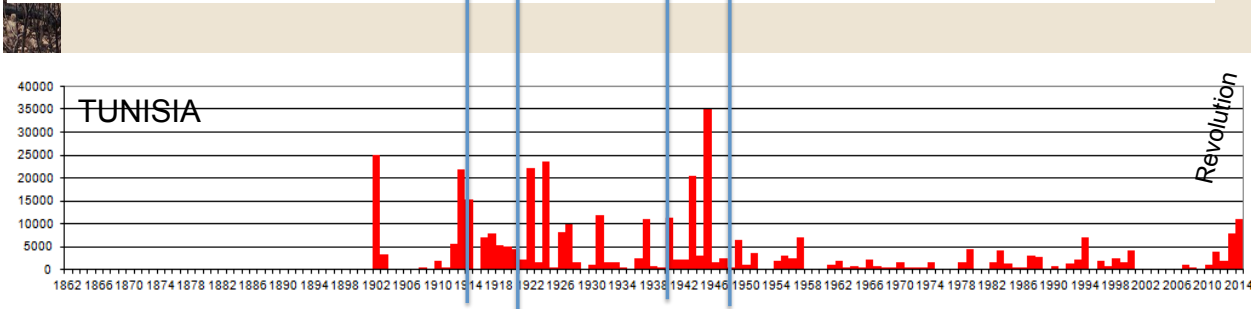
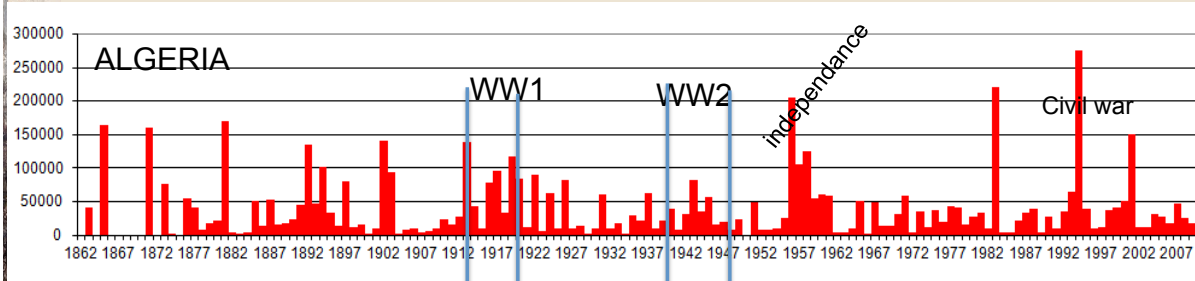


Temporal trend of variable contribution on a 5-year moving window  
 => Detection of an abrupt change in 1987 for wind speed



Humans can reshape the fire weather by modifying fire policies...  
 => Implication for future projections under socio economic changes

# Human impacts: History matters... Exemple in North Africa



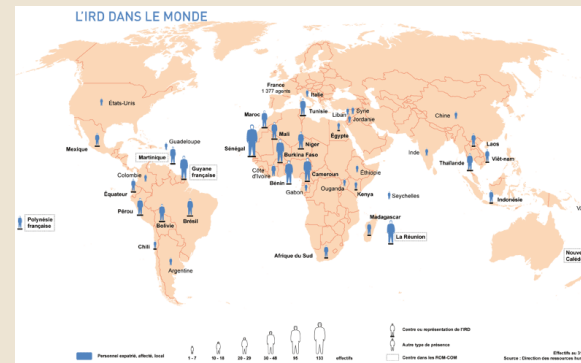
How to model ????

## European Space Agency Climate Change Initiative

[www.esa-fire-cci.org](http://www.esa-fire-cci.org)

## Institut de Recherche pour le Développement

[www.ird.fr](http://www.ird.fr)



florent.mouillot@ird.fr