

Extreme events in agriculture: identification and impacts

Gianni Bellocchi

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Ciclo di seminari del Dr Gianni Bellocchi, Visiting Professor

24 aprile 2015 ~ 08 maggio 2015, ore 11.30 Aula Pampaloni, Dipartimento Agraria, Viale Italia 39 - Sassari

Il Dr. Gianni Bellocchi, nell'ambito del programma Visiting Professor, terrà presso il Dipartimento di Agraria ciclo di seminari secondo il seguente calendario:

Venerdì 24 Aprile 2015 ore 11:30 - Vulnerabilità ai cambiamenti climatici dei prati-pascoli europei Martedì 28 Aprile 2015 ore 15:00 - Valutazione di modelli di simulazione colturale Venerdì 8 Maggio 2015 ore 11:30 - Eventi estremi in agricoltura: identificazione e impatti

Gianni Bellocchi è direttore di ricerca presso l'INRA - UREP (Institut National de la Recherche Agronomique - Unitè de Recherche sur l'Ecosysteme Prairial, Clermont-Ferrand, Francia). La sua attività di ricerca sulla modellizzazione agro-climatica e ambientale integra tematiche agronomiche, di fisiologia vegetale e di climatologia. Ha sviluppato modelli e indicatori per la valutazione degli impatti del clima su sistemi agro-ambientali.











Extreme events in agriculture: identification and impacts

Gianni BELLOCCHI

Grassland Research Ecosystem Unit French National Institute for Agricultural Research

Clermont-Ferrand, France

08 May 2015 Sassari (Itay)





JAN. 21, 2014

East Coast Storm Brings Snow and Disruptions to the New York Region



JAN 21, 2014

California suffering possibly its worst drought in a century

Reute



Cai et al. (2014)

a,b, In both present-day climate (a) and future climate (b), convection zones in the western Pacific and the ITCZ latitudes shift from their normal positions (indicated by blue clouds) to the eastern equatorial Pacific during an extrem...





Elements of the 1997 Super El Niño seemed to be repeating in 2014 in the Western Pacific



the Western Pacific







Large trees drive forest aboveground biomass variation in moist lowland forests across the tropics

J. W. Ferry Slik^{1*}, Gary Paoli², Krista McGuire³, Ieda Amaral⁴, Jorcely Barroso⁵, Meredith Bastian⁶, Lilian Blanc⁷, Frans Bongers⁸, Patrick Boundja⁹, Connie Clark¹⁰, Murray Collins^{11,12}, Gilles Dauby¹³, Yi Ding^{14,15}, Jean-Louis Doucet¹⁶, Eduardo Eler⁴, Leandro Ferreira¹⁷, Olle Forshed¹⁸, Gabriella Fredriksson¹⁹, Jean-Francois Gillet²⁰, David Harris²¹, Miguel Leal²², Yves Laumonier²³, Yadvinder Malhi²⁴, Asyraf Mansor²⁵, Emanuel Martin²⁶, Kazuki Mivamoto²⁷, Alejandro Araujo-Murakami²⁸, Hidetoshi Nagamasu²⁹, Reuben Nilus³⁰, greenreport. it Oliveira⁴, Onrizal Onrizal³², Alexander Parada-Gutierrez²⁸, tens Poorter⁸, John Poulsen¹⁰ Hirma Parairas Angula³⁴

20 agosto, 20:10

ens Poorter⁸, John Poulsen¹⁰, Hirma Ramirez-Angulo³⁴, Jan Reitsma³⁵,

les Rozak³⁷, Douglas Sheil^{38,39,40}, Javier Silva-Espejo⁴¹, Marcos Silveira⁴²,

Suzuki⁴⁶, Jianwei Tang⁴⁷, Ida Theilade⁴⁸, Geertje van der Heijden^{49,50}, Tran Van Do⁵², Emilio Vilanova⁵³, Vincent Vos⁵⁴, Serge Wich⁵⁵,

A Journal of Macroecology Main sponsor: ambiente Non tagliate i vecchi alberi: assorbono la ter Steege⁴³, Tariq Stevart⁴⁴, Gilberto Enrique Navarro-Aguilar⁴⁵, metà della CO2 delle foreste pluviali

oshi Yoneda⁵⁷, Runguo Zang⁵⁸, Ming-Gang Zhang⁵⁹ and Nicole Zweifel⁶⁰ [9 agosto 2013] First signs of carbon sink saturation in European forest biomass

Gert-Jan Nabuurs,, Marcus Lindner,, Pieter J. Verkerk,

Michalak & & Giacomo Grassi

Affiliations Contributions Corresponding author

Nature Climate Change (2013) doi:10.1038/nclimate18

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Image: State Stat

chalak & & Giacomo Grassi

Macroecology

Climate extremes and the carbon cycle

Markus Reichstein, Michael Bahn, Philippe Ciais, Dorothea Frank, Miguel D. Mahecha, Sonia I. Seneviratne, Jakob Zscheischler, Christian Beer, Nina Buchmann, David C. Frank, Dario Papale, Anja Rammig, Pete Smith, Kirsten Thonicke, Marijn van der Velde, Sara Vicca, Ariane Walz & Martin Wattenbach

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Modelling the impact of extreme events

- Extreme weather events such as heat waves, cold shocks, droughts and floods are expected to increase in intensity, frequency and extension with climate change
- There is a need to better integrate the effects of extreme events into simulation (crop / grassland / tree) models to better estimate their impact on agricultural systems







Ensemble modelling on grasslands



"Extreme" versus "adverse" events



Extreme weather events: statistical definition



Extreme weather events: what a definition?

extreme weather event:

- (statistically-based) a rare weather event at a particular place and time of year, e.g. "as rare or rarer than the 10th or 90th percentile of PDF" (IPCC, 2013)

- (impact-oriented) high-impact (on society and biophysical systems), hard-to-predict phenomenon that is far beyond normal expectations, e.g. "Agricultural drought occurs when there is insufficient moisture for average crop or range production" (Sivakumar et al., 2005)

Extreme weather events in Europe: impacts

Year	Region	Event	Impact
2003	Western and Central Europe	Hottest summer in at least 500 years (Luterbarcher et al., 2004)	Crop harvest losses of 20- 30% (Ciais et al., 2005); Mega-fires; Health damage
2004-2005	Iberian Peninsula	Hydrological drought	Grain harvest losses of 40% (EEA, 2010)
2007	Southern Europe	Hottest summer on record in Greece since 1891 (Founda and Giannakopoulos, 2009)	Mega-fires; roughly 575000 ha burnt area (JRC, 2008)
2007	England and Wales	May-July wettest since records began in 1766	78 farms flooded with about £50 million (Chatterton et al., 2010)
2010	Western Russia	Hottest summer since 1500 (Barriopedro et al., 2011)	Fire damage to forests (Shvidenko et al., 2011). Reduction in crop yields (Coumou and Rahmstorf, 2012); export ban; health damage
2011	France	Hottest and driest spring since 1880	8% decline in wheat yield (AGRESTE, 2011)

Extreme weather events in Europe: impacts

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2004-2005	lbe 25 JUN 2014 New stud of climat	ly quantifies the ef e change in Europe	fects st losses of 40%
2007	So If no further action is global temperature ind 3.5°C, climate damage EU could amount to at	taken and creases by es in the t least	oughly 575000 ha RC, 2008)
2007	En 1.8% of its current GE weather-related extre roughly double their a	fare less of DP. Several mes could verage	Chatterton et al.,
2010	We heat-related deaths co about 200 000.	Duld reach New JRC study quantifies, the costs of flood damages	ge to forests et al., 2011). Reduction in crop yields (Coumou and Rahmstorf, 2012); export ban; health damage
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Historical drought in central-southern Italy / 1

"Today, Wednesday 31st December the year 1760 is finishing, thank goodness. Food supplies have been very low because of the great drought that never seems to stop, decimating all fruits, with grapes also destined to perish, and very little must and wheat and oil (...). Drought has occurred because there has been no rain up to late December, the countryside is arid and bare of grass, and almost all the cattle are dead. Starvation threatens; much prayer is in order. God have mercy on us! Amen ..." (Gregorio Susanna, Diary for 1760–1761)

"This century XVIII had a memorable and shocking year, for the fatal consequences caused by the scarcity of food and very poor harvest (...). At the beginning of this year, August 1763, drought and hail fell upon the Kingdom of Naples, causing a very poor harvest, with starvation beginning in December (...)" (chronicles of Giuseppe Loffredo)

"An overall rainy year troubles us with an obstinate and tearful drought; a year that was largely very warm punished us nevertheless with extraordinary cold and frost" (Giuseppe Maria Giovene, 1788)

Diodato and Bellocchi (2011)

Historical drought in central-southern Italy / 2

prolonged droughts

(> five monthts)



short-term droughts (three-five months)



Diodato and Bellocchi (2011)

Historical drought in central-southern Italy / 2



Diodato and Bellocchi (2014)

Diodato and Bellocchi (2011)

May 2015: Sardinia abnormal heatwave

44°C 44°C 43°C 41°C

Tue, 85 May 2015 87:18:81 +8288 TEMPIO PAUSANIA (OT) UWU.Vasaeazzena.com

Ondata di caldo record in Sardegna

Sardegna: è storia! Picchi di TRENTA GRADI notturni. Oggi attesi anche oltre 40°C



Caldo africano in Sardegna, da domani picchi fino a 38°C

May 2015: Sardinia abnormal heatwave



Atmospheric circulation features



Atmospheric circulation features



Extreme weather events: agricultural impacts (winter wheat yield)



Extreme event indices: drought



 T_a : actual transpiration; T_p : potential transpiration

Probability of leaf growth inhibition (LGI) = Probability of ARID > threshold_{LGI} Probability of root growth inhibition (RGI) = Probability of ARID > threshold_{RGI}

$$FU = -\frac{\sum P}{\sum ET_0} + \left[1 + \left(\frac{\sum P}{\sum ET_0}\right)^W\right]^{(1/W)}$$
[0, 1] Fu et al. (1981)
Zhang et al. (2008)

P: precipitation; ET₀: reference evapotranspiration; w: vegetation-soil parameter (~3)

Extreme event indices: heat

$$\label{eq:HSI} HSI = \begin{cases} 1 & \text{if } T_{eff} \geq T_{lim} \\ \frac{T_{eff} - T_{cr}}{T_{lim} - T_{cr}} & \text{if } T_{cr} \leq T_{eff} < T_{lim} & [0,1] & \text{Deryng et al. (2014)} \\ 0 & \text{if } T_{eff} < T_{cr} \end{cases}$$

T_{eff}: effective temperature; T_{cr}: critical temperature; T_{lim}: limiting temperature

Probability of hot days = Probability of T_{max} > T_{cr}

T_{max}: maximum temperature

Snyder and de Melo-Abreu (2005)

Extreme event indices: frost

Probability of frost damage at germination = Probability of T_{min} < T_{frost,germ}

Probability of frost damage at anthesis/grain filling = Probability of T_{min} < T_{frost,anth}

Probability of lethal frost during the growing season = Probability of $T_{min} < T_{lethal frost}$

Tmin:Time temperatureTfrost,germ:Temperature of frost damage at germinationTfrost,anth:Temperature of frost damage at anthesis/grin fillingTlethal_frost:Temperature of lethal frost during the growing season

Extreme event indices: thresholds

Indox	Store	Сгор		
Index	Slage	maize	winter wheat	
ARID - threshold _{LGI}	anthesis	0.20	0.10	
ARID - threshold _{RGI}	anthesis	0.45	0.50	
ARID - extreme	-		0.85	
T _{cr} (°C)	anthesis	32	25	
T _{lim} (°C)	anthesis	45	35	
T _{frost,germ} (°C)	germination	-7	-9	
T _{anthesis,grain filling} (°C)	anthesis/grain filling		-1	
T _{lethal_frost} (°C)	growing season	-15	-20	



Number of extremely hot (maximum air temperature > 35 °C) and dry (ARID > 0.85) days and fraction of total winter wheat growing area of Europe with less than 2, between 5 and 10, or more than 20 extreme days per year (May 1 – September 30) Klein et al. (in preparation)





Probability of experiencing a critical year (colour scale) and fraction of total European wheat cropping area with at least 25% and 50% chances of being under critical conditions (numbers in the upper right corner)



Klein et al. (in preparation)

Yield forecasts with agro-climatic indices / 1

	Crop	Country	Regression model
Winter crops	Wheat	Spain	ARID _{mean} , ARID _{cr} , T _{maxcr}
		Slovenia	ARID _{mean} , ARID _{cr} , Fu, T _{mincr}
	Barley	Italy	ARID _{cr} , Fu, T _{maxcr} , T _{mincr}
		Spain	ARID _{cr} , T _{maxcr}
	Rye	Spain	ARID _{cr} , T _{maxcr} , T _{mincr}
	Triticale	Romania	ARID _{cr} , Fu, T _{maxcr}
	Rapeseed	Romania	ARID _{mean} , T _{maxcr}
Summer crops	Maize	Italy	ARID _{mean} , T _{maxcr,} T _{mincr}
		Croatia	ARID _{mean} , T _{maxcr}
	Sunflower	Bulgaria	ARID _{mean} , Fu, T _{maxcr}
		Italy	T _{maxcr,} T _{mincr}
	Potato	Romania	ARID _{cr} , Fu, T _{maxcr}
		Poland	ARID _{mean} , ARID _{cr} , T _{maxcr}
	Sugar beet	Italy	ARID _{cr} , T _{mincr}
		Croatia	ARID _{cr} , Fu
	Mown grasslands	Germany	ARID _{mean} , ARID _{cr} , T _{mincr}

Yield forecasts with agro-climatic indices / 2



Biophysical modelling



Biophysical processes: example of Harvest Index (HI) / 1

Harvest Index (HI) = yield (Y) / total above ground biomass (B)

$Y = HI \cdot B$

Valid for all crop models (when linked to biomass at maturity)

Valid for all weather events (drought – low temperature – high temperature)



Biophysical processes: example of Harvest Index (HI) / 2

crop	pre-flowering	flowering	grain filling
winter cereals		F - WS - LT - HT	HT - WS
summer cereals		WS - LT - HT	HT - WS
sunflower	F	WS - HT	HT - WS
others			

HI-based framework for calculating crop yield under extreme events / 1



HI-based framework for calculating crop yield under extreme events / 2

Wheeler et al. (2000)



HI-based framework for calculating crop yield under extreme events / 3

$$HI_{AA} = F_A \cdot HI_{max}$$

 F_A : fraction of maximum HI that may be attained after anthesis is completed (HI_{AA}) (0, maximum stress; 1, no stress)

$\mathbf{F}_{\mathsf{A}} = 1 / \mathbf{d}_{\mathsf{A}} \cdot \sum_{1}^{d_{\mathsf{A}}} \min(\mathbf{F}_{\mathsf{T}}, \mathbf{F}_{\mathsf{W}}) \cdot \prod_{1}^{d_{\mathsf{A}}} \min(\mathbf{F}_{\mathsf{F}}, \mathbf{F}_{\mathsf{H}})$

 d_A : time window around anthesis F_T : temperature factor (function of mean crop temperature) F_W : water stress factor F_F : frost factor (function of minimum crop temperature)

F_H: extreme heat factor (function of maximum crop temperature)

Stress functions / 1



Stress functions / 2



Joint Research Centre agricultural yield forecasting with the platform BioMA

Meteorological infrastructure

Remote Sensing infrastructure

There is no doubt that research applications in crop modelling will continue, but for such applications to sustain long-term interest policy applications need to be developed and applied



Bellocchi et al. (2014)

Science-stakeholder dialogue



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