

# Prehistoric demography and the spread of the Neolithic: mathematical models based on radiocarbon dates

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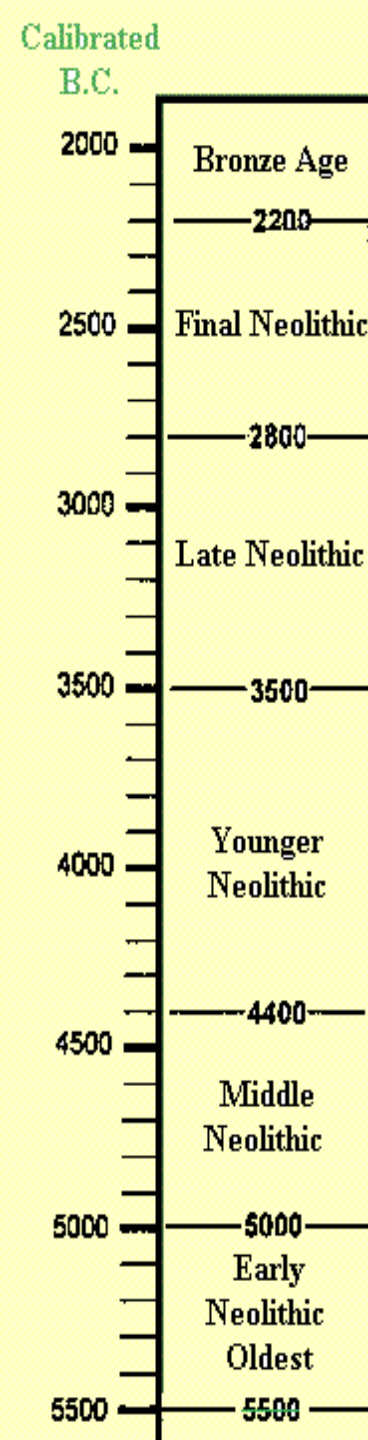
# Outline

□ The Neolithic revolution

□ Radiocarbon dating

□ Modelling Neolithic population dynamics

- Western Europe: spread from the Near East
- Pan-European model: spread from two centres



# The Neolithic:

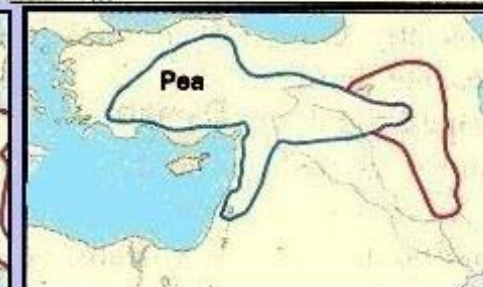
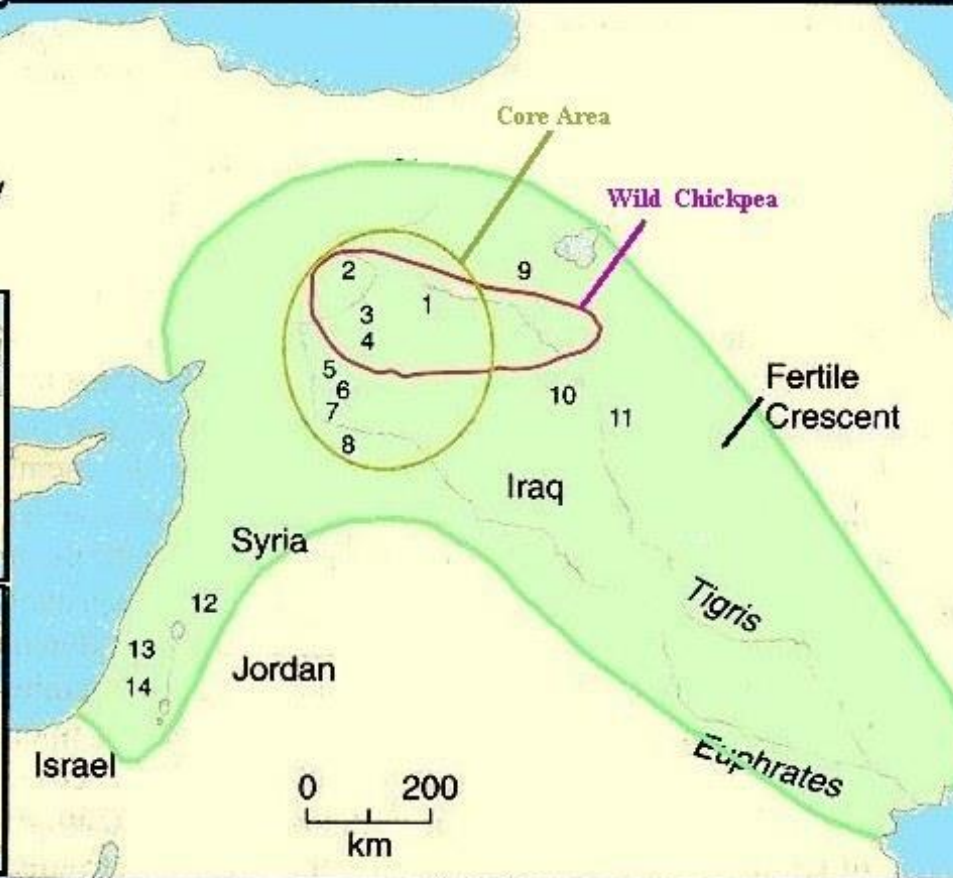
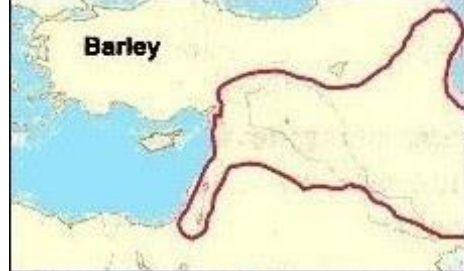
transition from food gathering to food production

- Origin in the *Fertile Crescent*
- Agro-pastoral farming
- Use of polished stone & bone tools
- Pottery making
- Settled lifestyle
- Rapid population growth
- Spread to Europe and Asia in 7-4 kyr BC
- 5000 BC: world population 5-20 mln

# *The Earliest Agriculture in the Near East*

- + Probable site of first einkorn wheat domestication
- Distribution of founder crops
- Range of genetic founder stocks for pea and lentil

Source: S. Lev-Yadun, A. Gopher, A. Abbo Science July 2, 2000, 288/5471:1602-1603

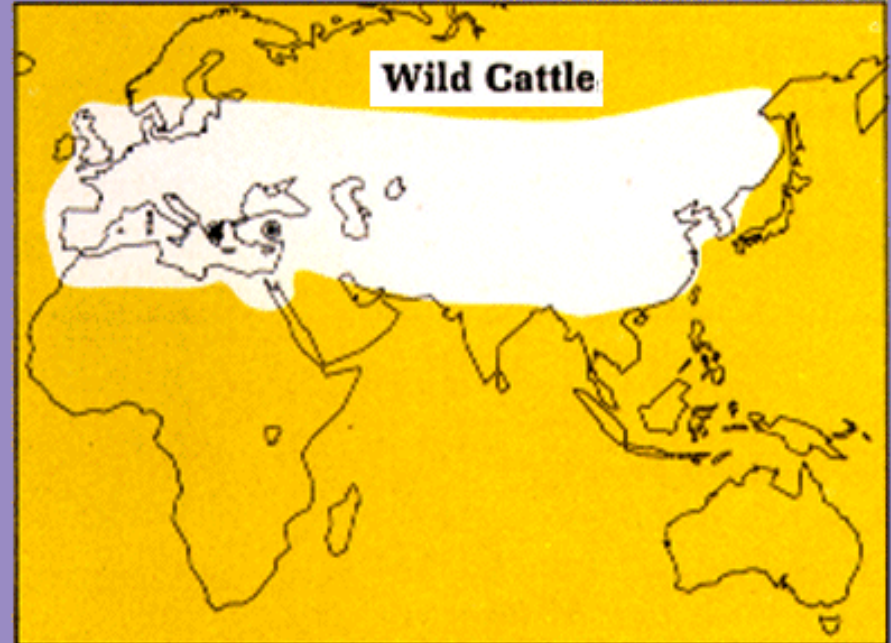
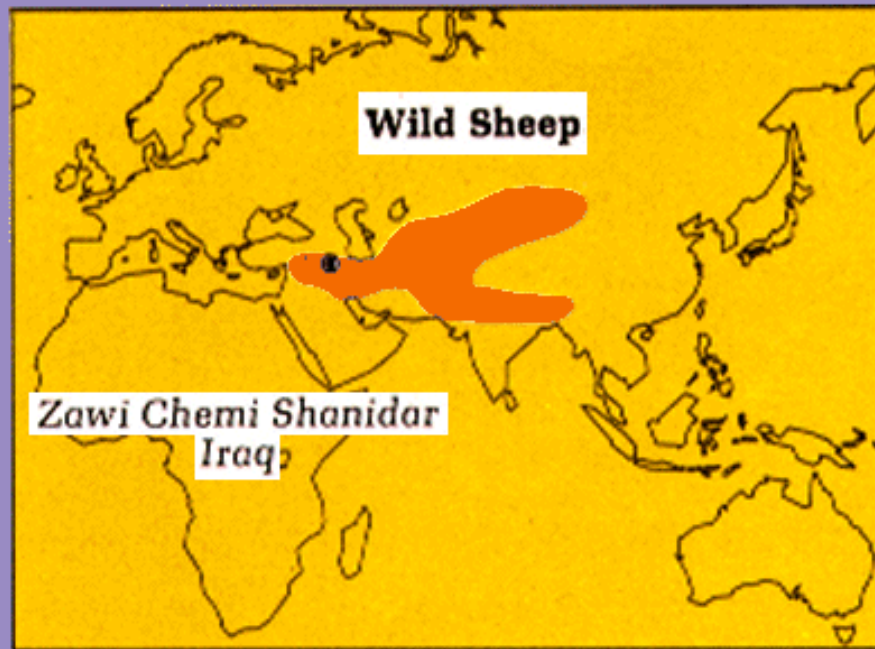


## Neolithic Sites in the Fertile Crescent

1. Cayönü
2. Cafer Hüyük
3. Nevali Çori
4. Göbekli Tepe
5. Djade
6. Jerf el-Ahmar
7. Tell Mureybet
8. Tell Abu Hureyra
9. Hallan Çemi Tepesi
10. Qermez Dere
11. Milefaat
12. Tell Aswad
13. Yiftahiel
14. Jericho



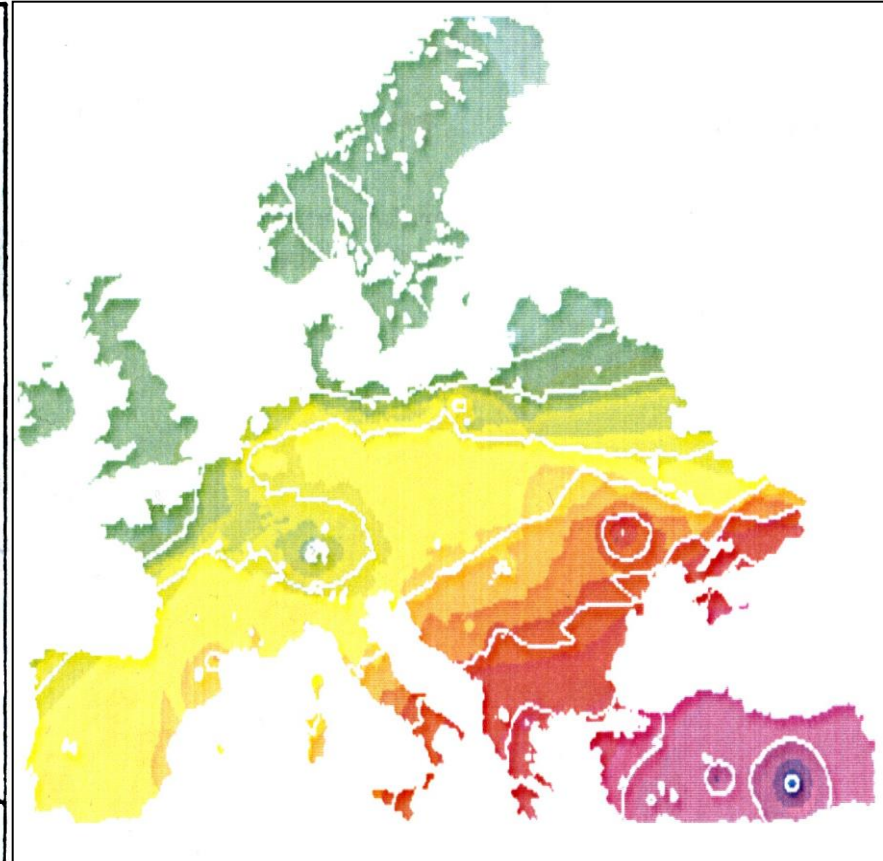
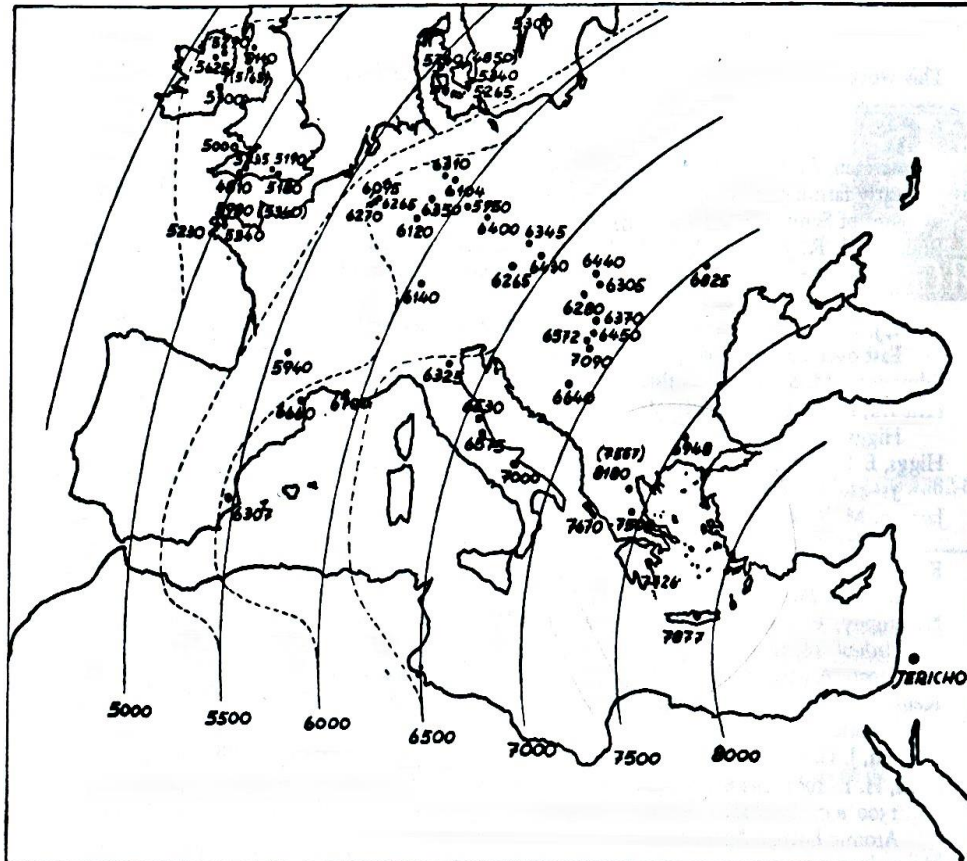
**Distribution of wild animals and the location of sites with evidence of early domestication.**



# The spread of farming to Europe: evidence from radiocarbon dating

THE RATE OF SPREAD OF EARLY FARMING IN EUROPE

685



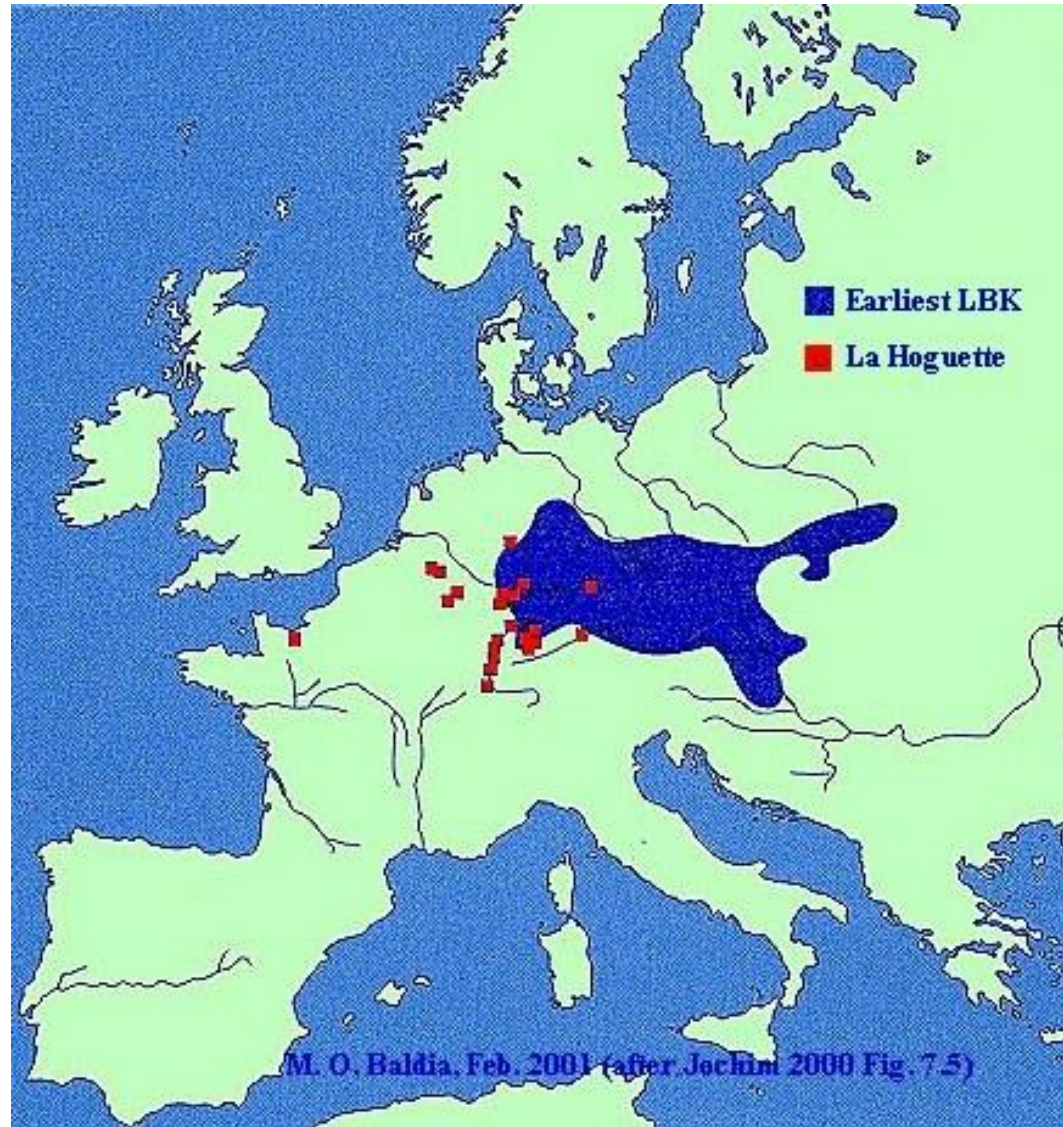
Ammerman & Cavalli-Sforza. *Man* 6, 674, 1971

Gkiasta et al. *Antiquity*, 77, 45, 2003

**Wave of advance,**  $\langle \bar{U} \rangle = 1$  km/yr; regional variations  $U = 5-10$  km/yr



# The Linearbandkeramik (LBK) tradition



- 5.5-5 kyr BC
- First farmers in Europe
- Rapid spread along the **Danube-Rhine** corridor
- Rate of spread 4-6 km/year

# LBK people: the first farmers in Europe



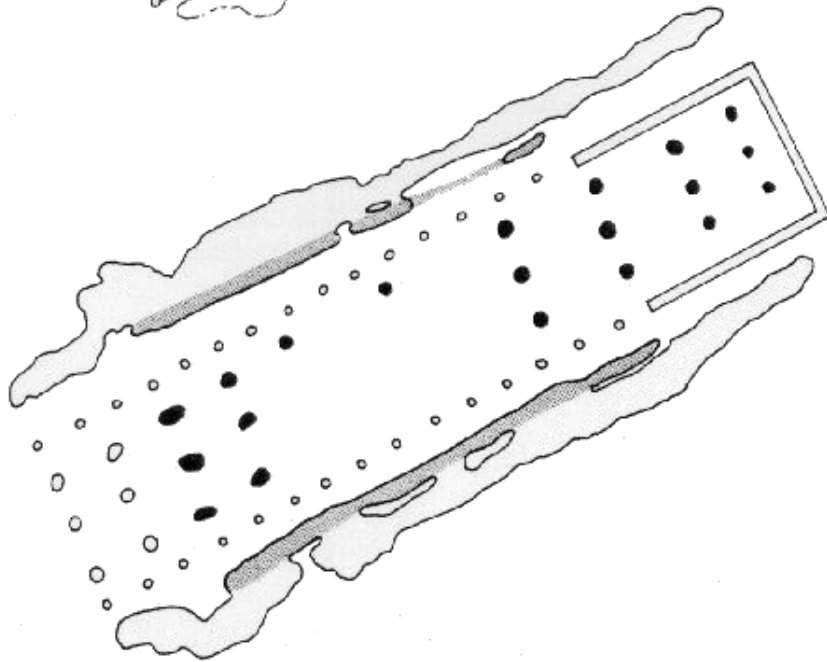
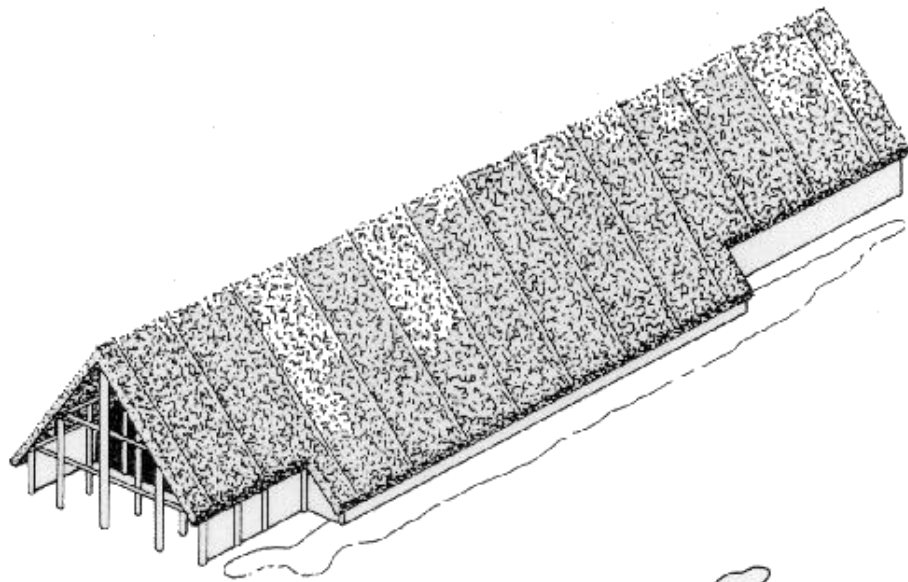
Stone implements and idol figurine from  
**Brunn-am-Gebirge, Austria**  
and  
pottery from the **Rhine**



**Bandkeramik**  
Photo: M. O. Baldia 1977  
(Rheinisches Landesmuseum  
Bonn September -1977)



## Reconstruction of a house from Brunn-am-Gebirge, Austria



**Swidden agriculture** (Eero Järnefelt 1863-1937)





Lough Gur,  
Co. Limerick



Alabaster statuette, Samarran site  
(northern Iraq), c.6000 BC.  
Eyes inlaid with bitumin.



Vase from Dimini, Greece,  
h25 cm, 5300-4800 BC



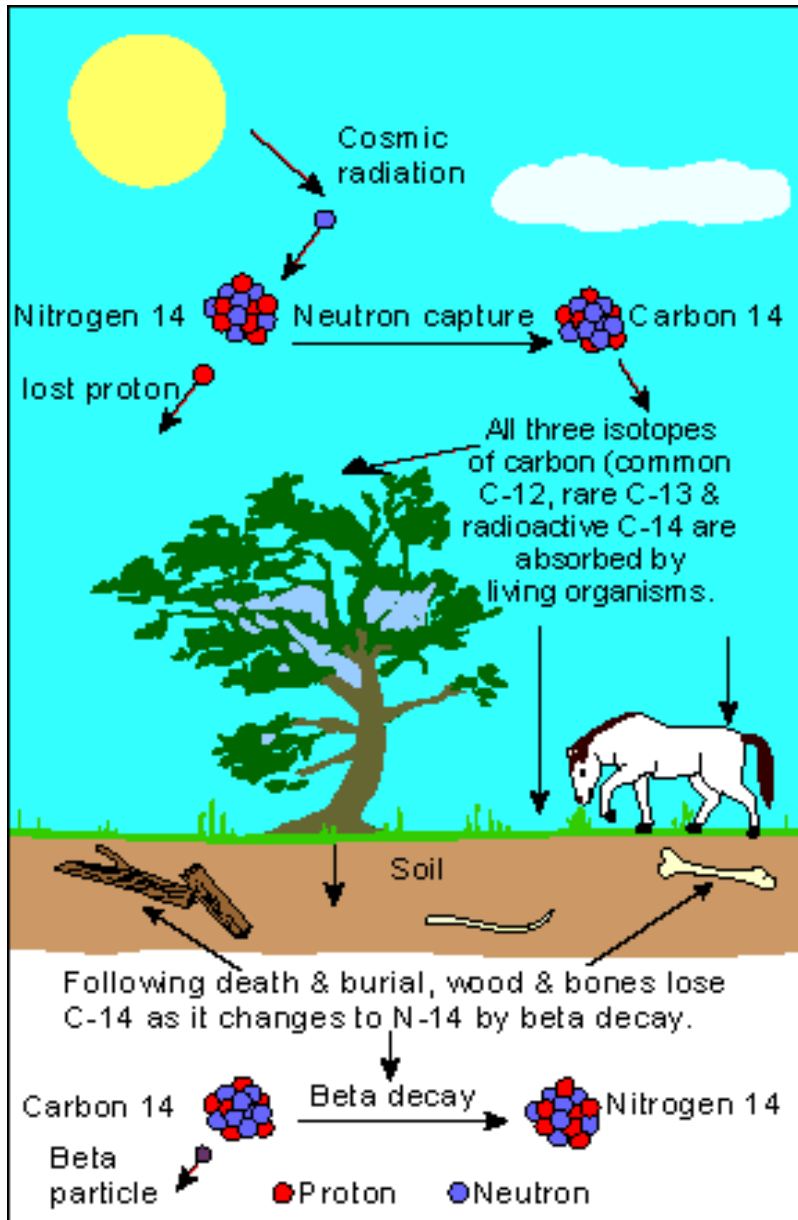
Vase from Sesklo, Greece, h35 cm, 5300-3800 BC



ˆAin Ghazal, Jordan, around 6500 B.C.  
Plaster and bitumen, H104 & 88 cm  
([http://www.asia.si.edu/jordan/html/jor\\_mm.htm](http://www.asia.si.edu/jordan/html/jor_mm.htm))



# Radiocarbon dating

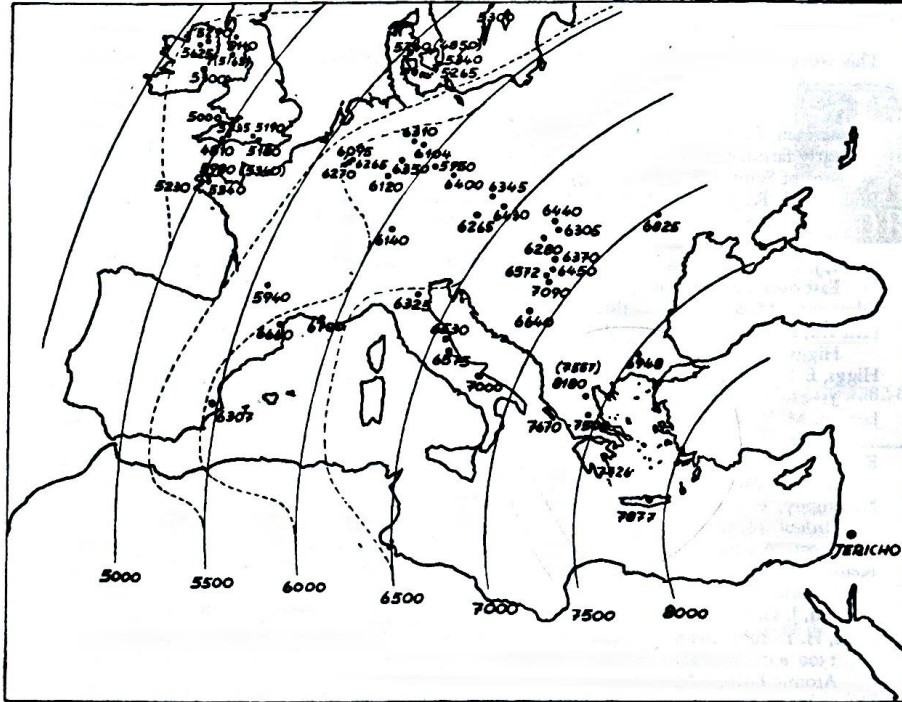


- $n + {}^{14}\text{N} \rightarrow {}^{14}\text{C} + \text{p}^+$
- at 10-15 km altitude
- $10^{-10}$  of  ${}^{14}\text{C}$
- ${}^{14}\text{C} \rightarrow {}^{14}\text{N} + \text{e}^-$
- half-life  $\approx 5730 \text{ yr}$
- No exchange with the reservoir  $\Rightarrow {}^{14}\text{C}$  decays

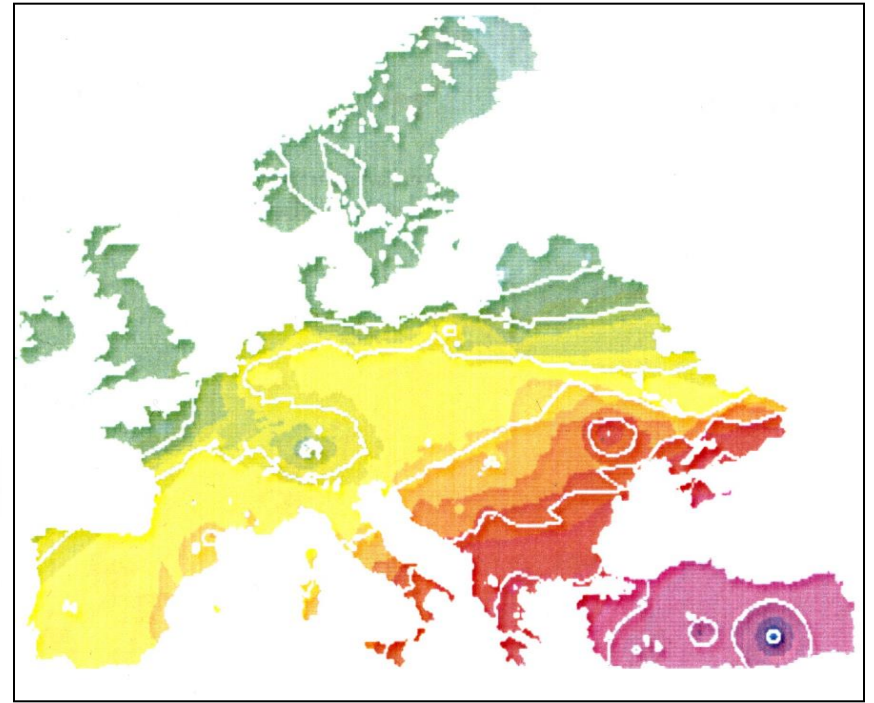
# The spread of the Neolithic in Europe

THE RATE OF SPREAD OF EARLY FARMING IN EUROPE

685



Ammerman & Cavalli-Sforza, *Man*, **6**, 674, 1971



Gkiasta et al., *Antiquity*, **77**, 45, 2003

Diffusive spread, modelled by the **reaction-diffusion equation**

# Standard population dynamics models

The Fisher-Kolmogorov-Petrovsky-Piskunov (FKPP) equation:

$$\frac{\partial n}{\partial t} = \gamma n \left( 1 - \frac{n}{n_0} \right) + \nabla \cdot (\nu \nabla n)$$

$(\theta, \varphi) = \text{position}$

$n(\theta, \varphi, t) = \text{population density}$

$\gamma(\theta, \varphi, t) = \text{birth rate}$

$n_0(\theta, \varphi, t) = \text{carrying capacity}$

$\nu(\theta, \varphi, t) = \text{diffusivity}$



# Wave of advance

$$n \propto \exp [\gamma t - x^2/(4\nu t)]$$

$$n = \text{const} \quad \Rightarrow \quad x \propto 2(\gamma\nu)^{1/2} t$$

The wave front (position where  $n = \text{const}$ ) propagates at a **constant speed**

$$U = 2\sqrt{\gamma\nu}$$

# Regional variations

$$U = 2\sqrt{\gamma\nu}$$

- $\bar{U} = 1$  km/yr on average in Europe
- $U_{\text{LBK}} = 4\text{-}6$  km/yr for the LBK
- $U_{\text{coast}} = 10\text{-}20$  km/yr in Mediterranean coastal regions

## Plausible reasons:

- ✓ **Local altitude and latitude**  $\Rightarrow \nu, n_0, \gamma$
- ✓ **Major rivers and coastlines**  $\Rightarrow \nu$  (anisotropy),  $n_0$
- × **Biomass and soil fertility**  $\Rightarrow n_0, \gamma$
- × **Climate variations**  $\Rightarrow n_0, \nu$

# Regional variations in the speed of advance

$$U = 2\sqrt{\gamma\nu}$$

$U$  varies by a factor **5-20**  $\Rightarrow \nu$  has to vary by a factor **25-400** (?!)

$\Rightarrow$  LBK and coastal regions are affected by **additional factors**

Major **water ways**  $\Rightarrow$  anisotropic spread  $\Rightarrow$  **advection**

$$\frac{\partial n}{\partial t} + (\vec{\mathbf{V}} \cdot \nabla)n = \gamma n \left(1 - \frac{n}{n_0}\right) + \nabla \cdot (\nu \nabla n)$$



# Advection due to anisotropic random walk

$$\bar{U} = 1 \text{ km/yr}, \quad \gamma = 0.02 \text{ yr}^{-1} \quad \Rightarrow \quad \nu = \bar{U}^2 / 4\gamma \approx 13 \text{ km}^2/\text{yr},$$

$$\nu = \frac{\bar{U}^2}{4\gamma} = \frac{\ell^2}{4\tau} \Rightarrow \ell = \bar{U} \sqrt{\frac{\tau}{\gamma}} \Rightarrow \ell \approx 27 \text{ km for } \tau = 15 \text{ yr}$$

Anisotropic random walk, step length  $\ell$  depending on direction:

$$\mu = \Delta\ell/\ell \quad \Rightarrow \quad \text{advection speed} \quad V = \frac{\ell\mu}{4\tau}$$

$$V = U_{\text{LBK}} \Rightarrow \mu = 4 \frac{U_{\text{LBK}}}{\bar{U}} \sqrt{\gamma\tau}$$

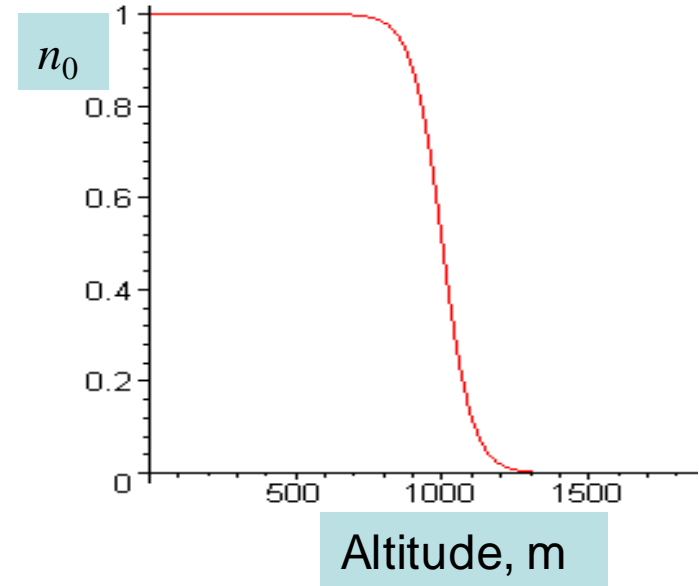
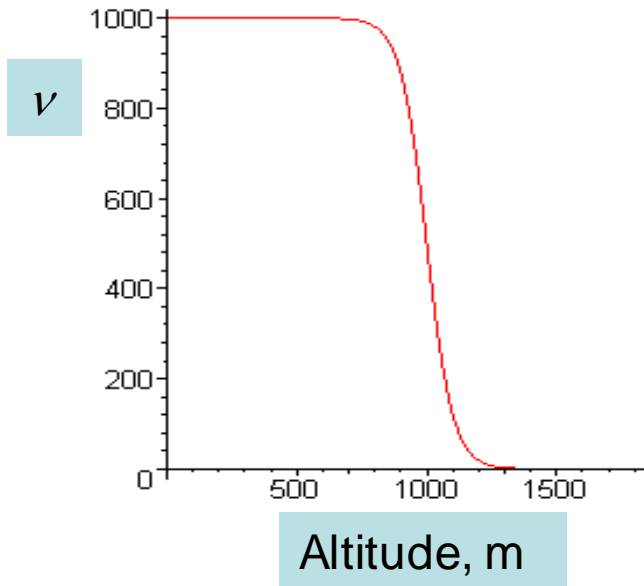
$$\tau = 15 \text{ yr}, \quad U_{\text{LBK}}/\bar{U} = 4\text{-}6 \quad \Rightarrow \quad \ell \approx 27 \text{ km}, \quad \mu \approx 8\text{-}13$$

# Numerical methods

$$\frac{\partial n}{\partial t} + (\vec{\mathbf{V}} \cdot \nabla)n = \gamma n \left(1 - \frac{n}{n_0}\right) + \nabla \cdot (\nu \nabla n)$$

- Discrete grid on sphere,  $\Delta(\varphi, \theta) = 1^\circ/12$ ,  $\Delta x = 2\text{-}9 \text{ km}$
- Explicit Euler time stepping
- Zero flux at the boundaries
- Adaptive time step

# $n_0, \nu, \gamma$ : functions of position



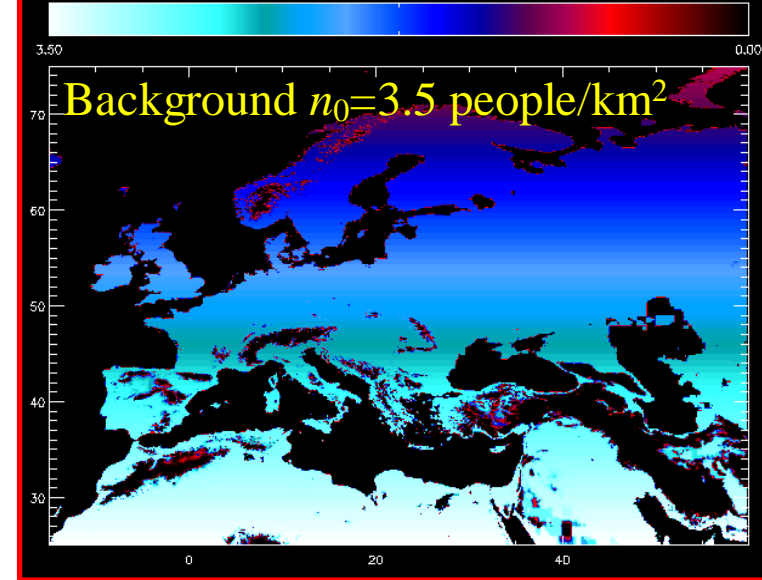
$$\gamma = \begin{cases} \text{const on land,} \\ 0 & \text{in sea.} \end{cases}$$

$\nu, n_0 \propto \exp(-d/40 \text{ km})$  :  
decrease **offshore**

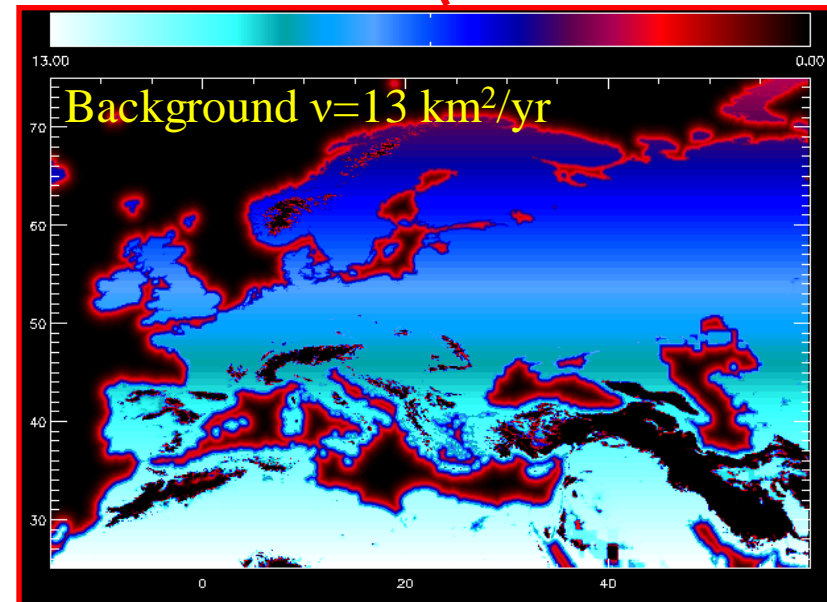
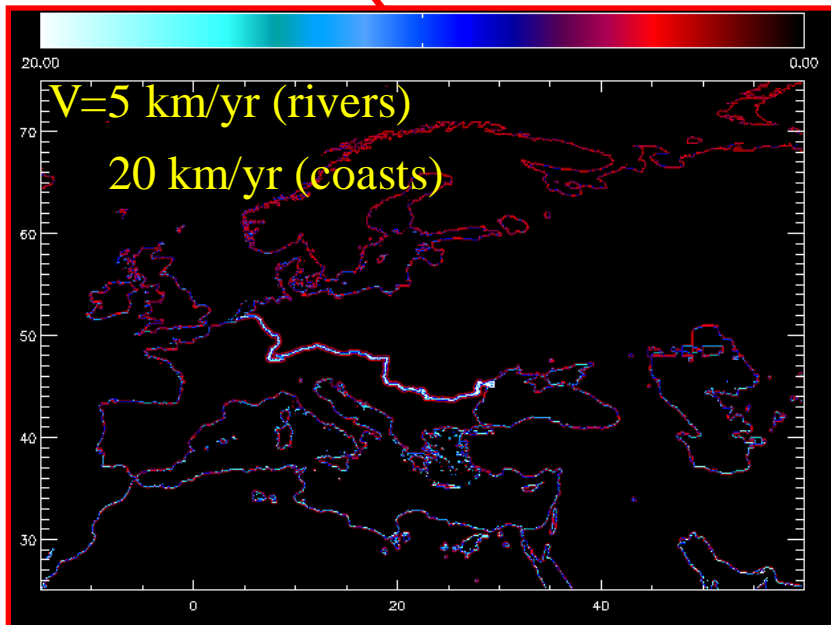
Slower advance beyond 54°N **latitude**:

$$n_0, \nu \propto 1 - \frac{y}{3750 \text{ km}}$$

$\gamma = 0.02 \text{ yr}^{-1}$   
(population doubles in 30 yr)



$$\frac{\partial n}{\partial t} + (\vec{V} \cdot \nabla)n = \gamma n \left[ 1 - \frac{n}{n_0} \right] + \nabla \cdot (v \nabla n)$$





# Rivers and coastlines:

## global consequences of local effects

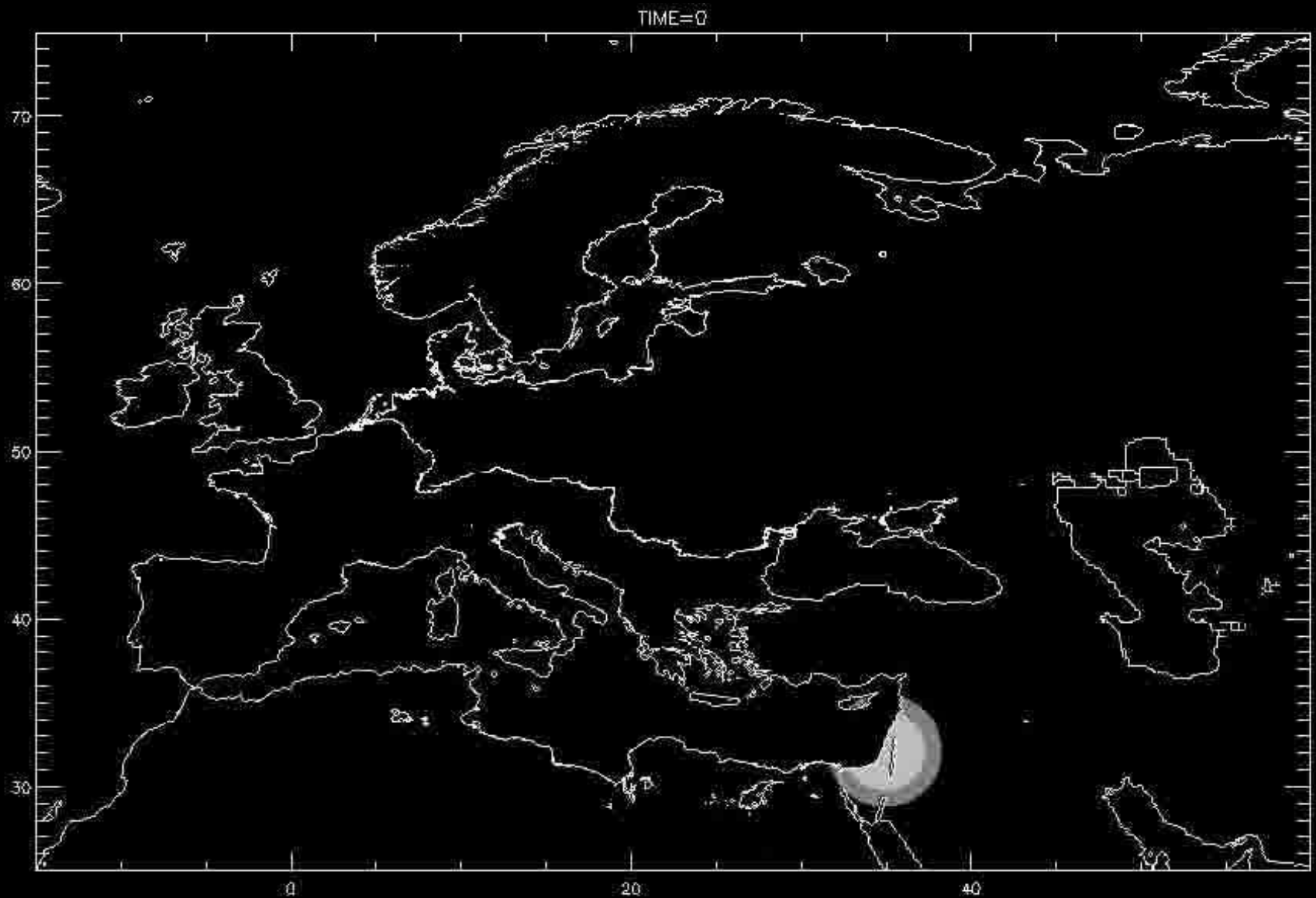
**Anisotropic diffusion**  $\Rightarrow$  faster spread within 15 km of major rivers, 30 km of coastlines

$V = 5 \text{ km/yr}$  for rivers (e.g. A & C-S, 1973)

$V = 20 \text{ km/yr}$  in coastal regions (Zilhão, 2003)

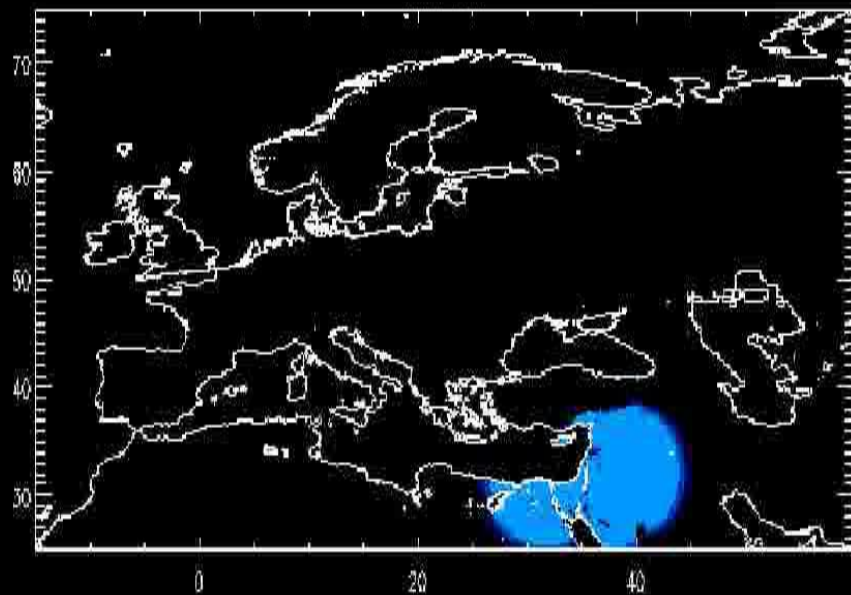
$$\frac{\partial n}{\partial t} + (\vec{V} \cdot \nabla)n = \gamma n \left(1 - \frac{n}{n_0}\right) + \nabla \cdot (\nu \nabla n)$$

# Spread from Jericho



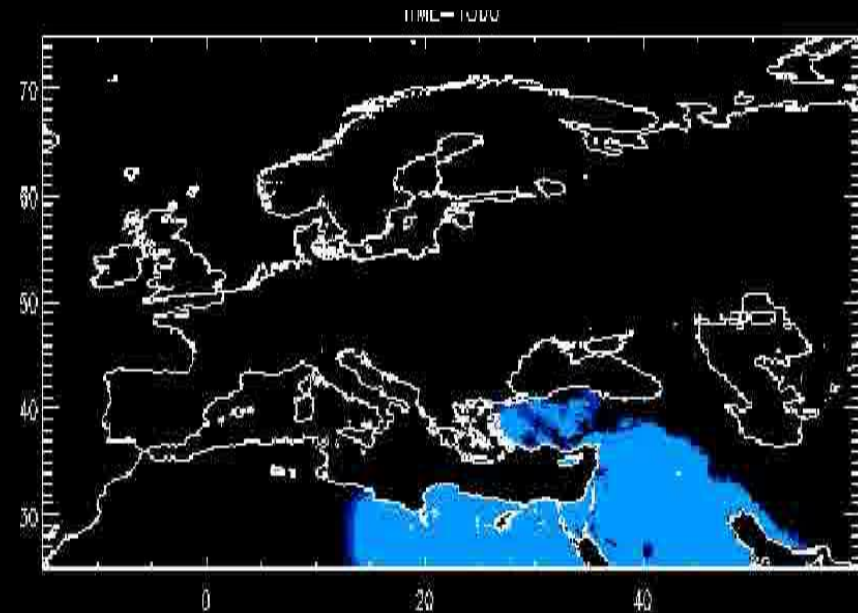
**Without** advection

Time = **500 yrs**



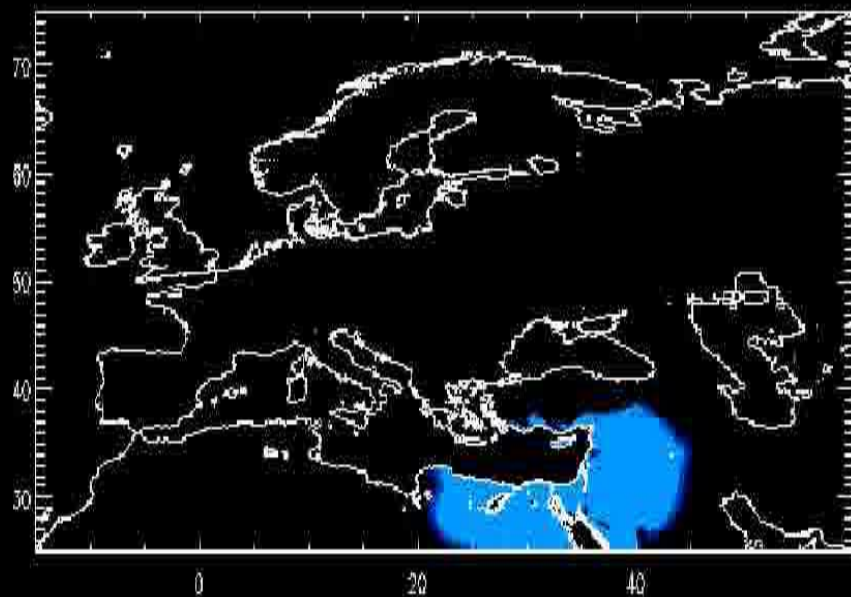
**Without** advection

Time = **1500 yrs**



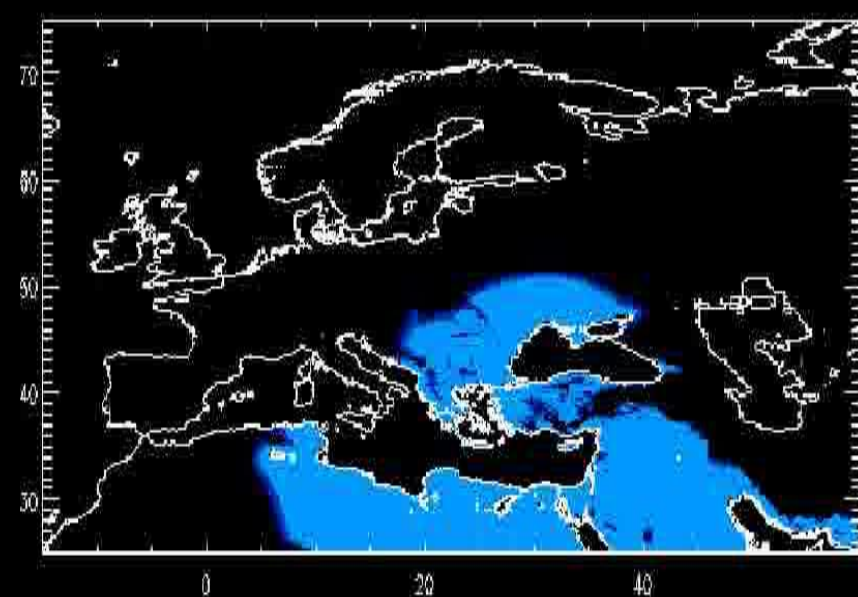
**With** advection

Time = **500 yrs**



**With** advection

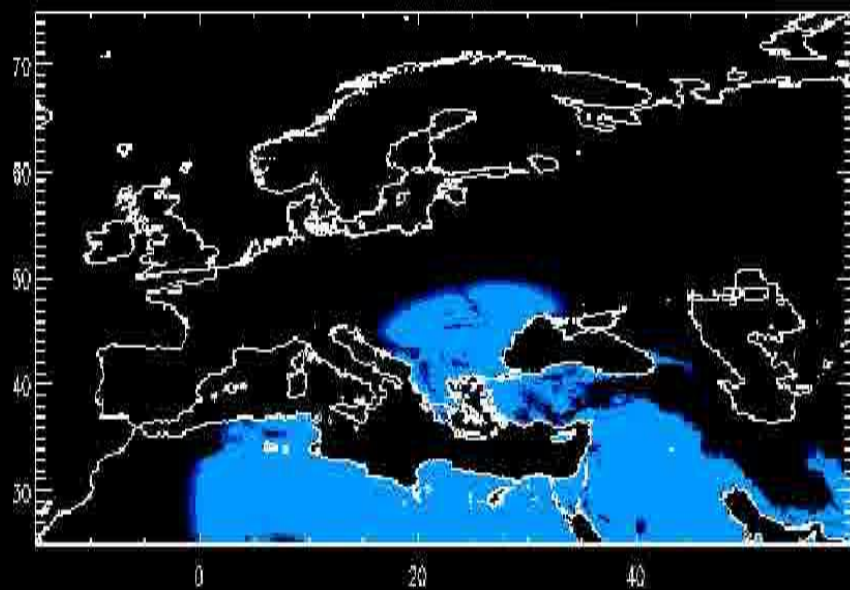
Time = **1500 yrs**



**Without** advection

Time = **2500 yrs**

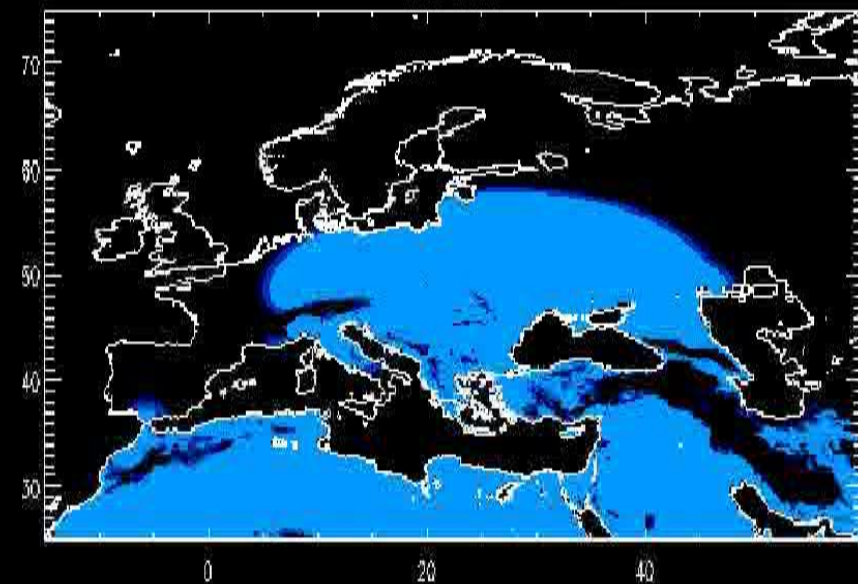
TIME=2500



**Without** advection

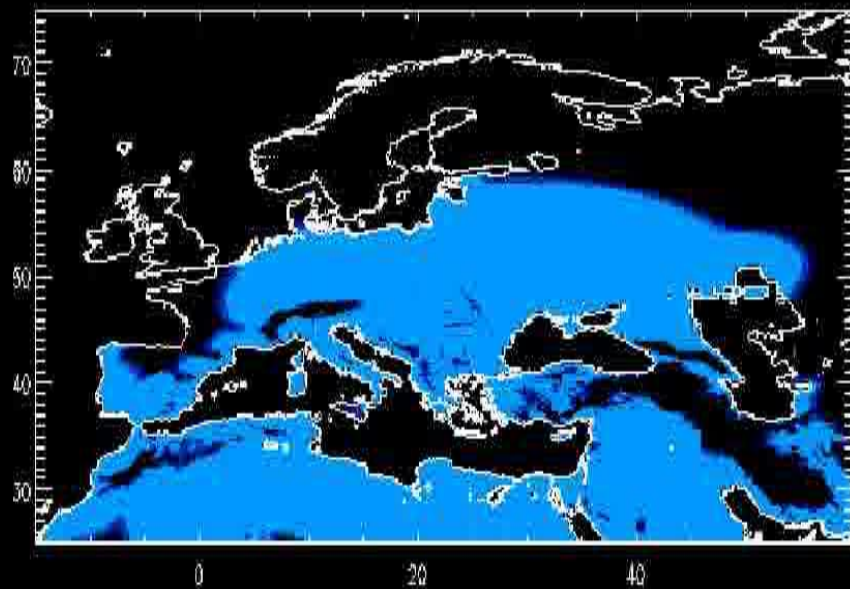
Time = **3500 yrs**

TIME=3500



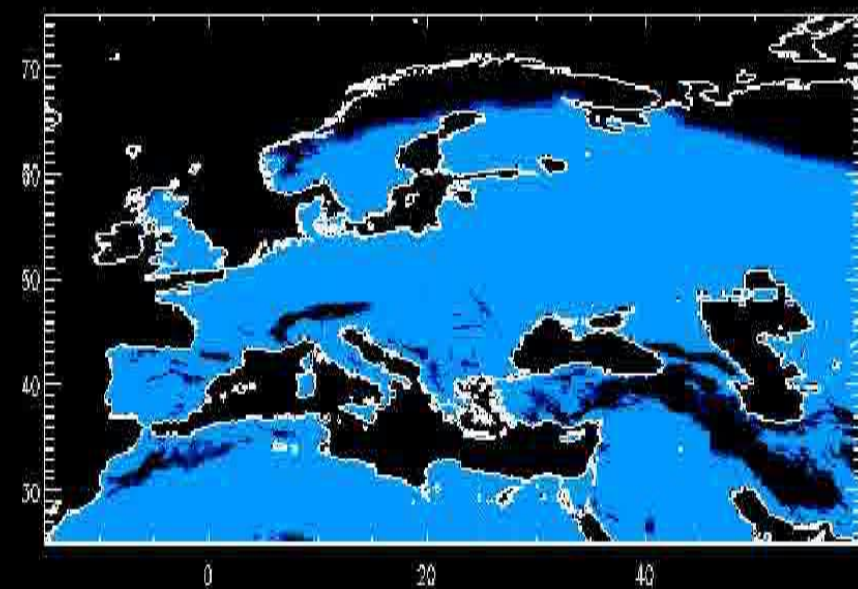
**With** advection

Time = **2500 yrs**



**With** advection

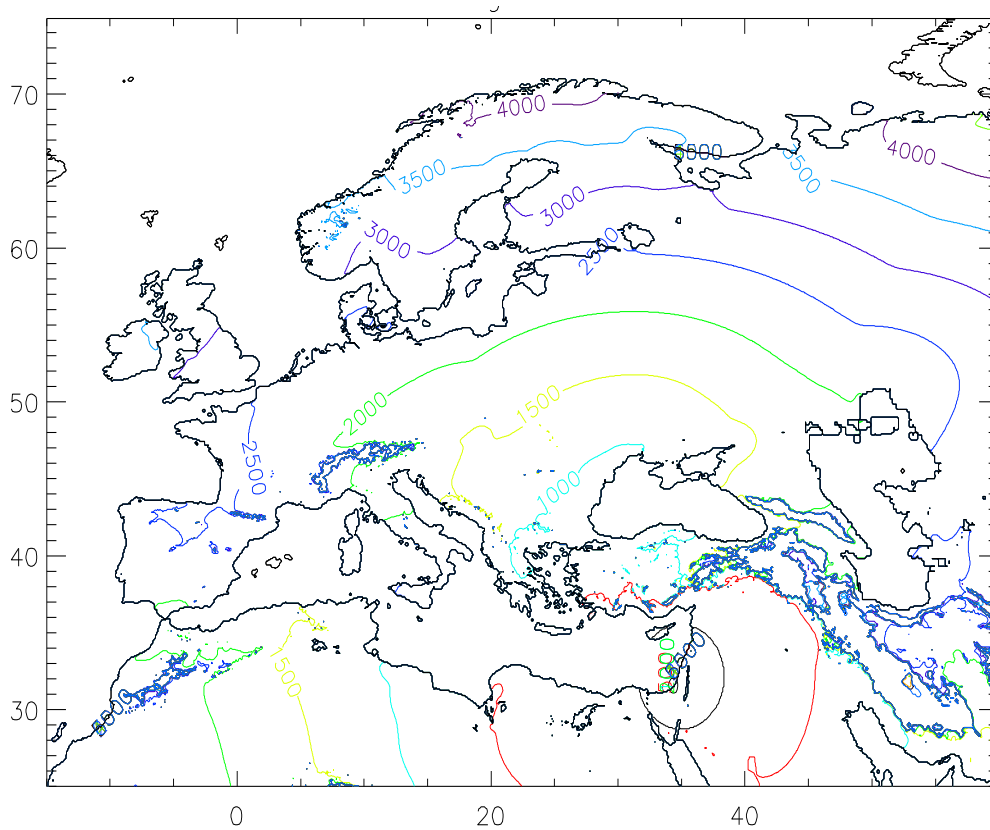
Time = **3500 yrs**



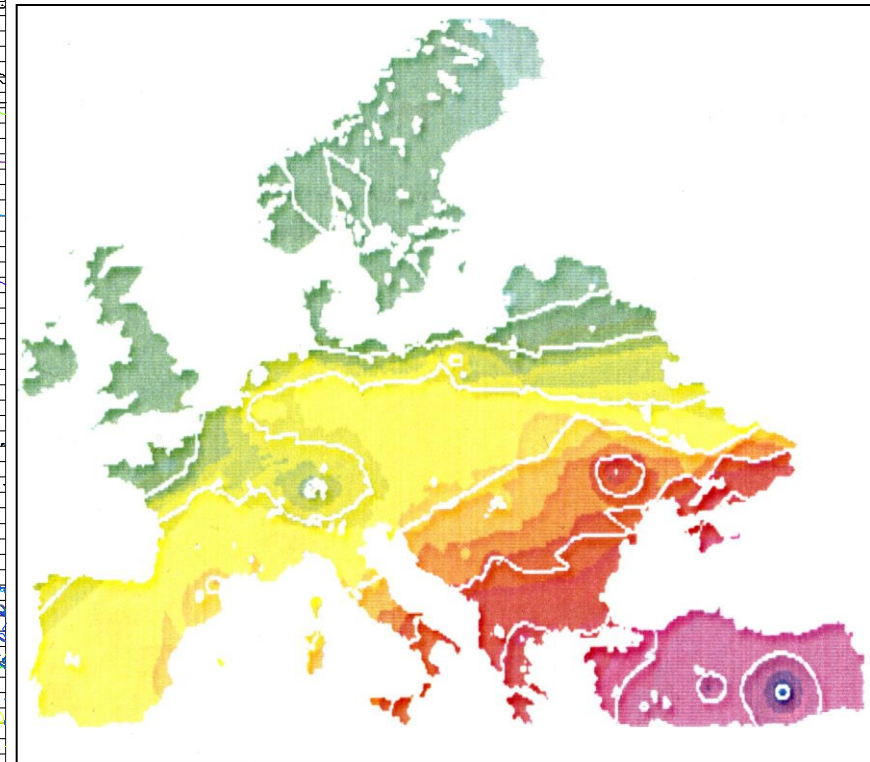


# Isochrones

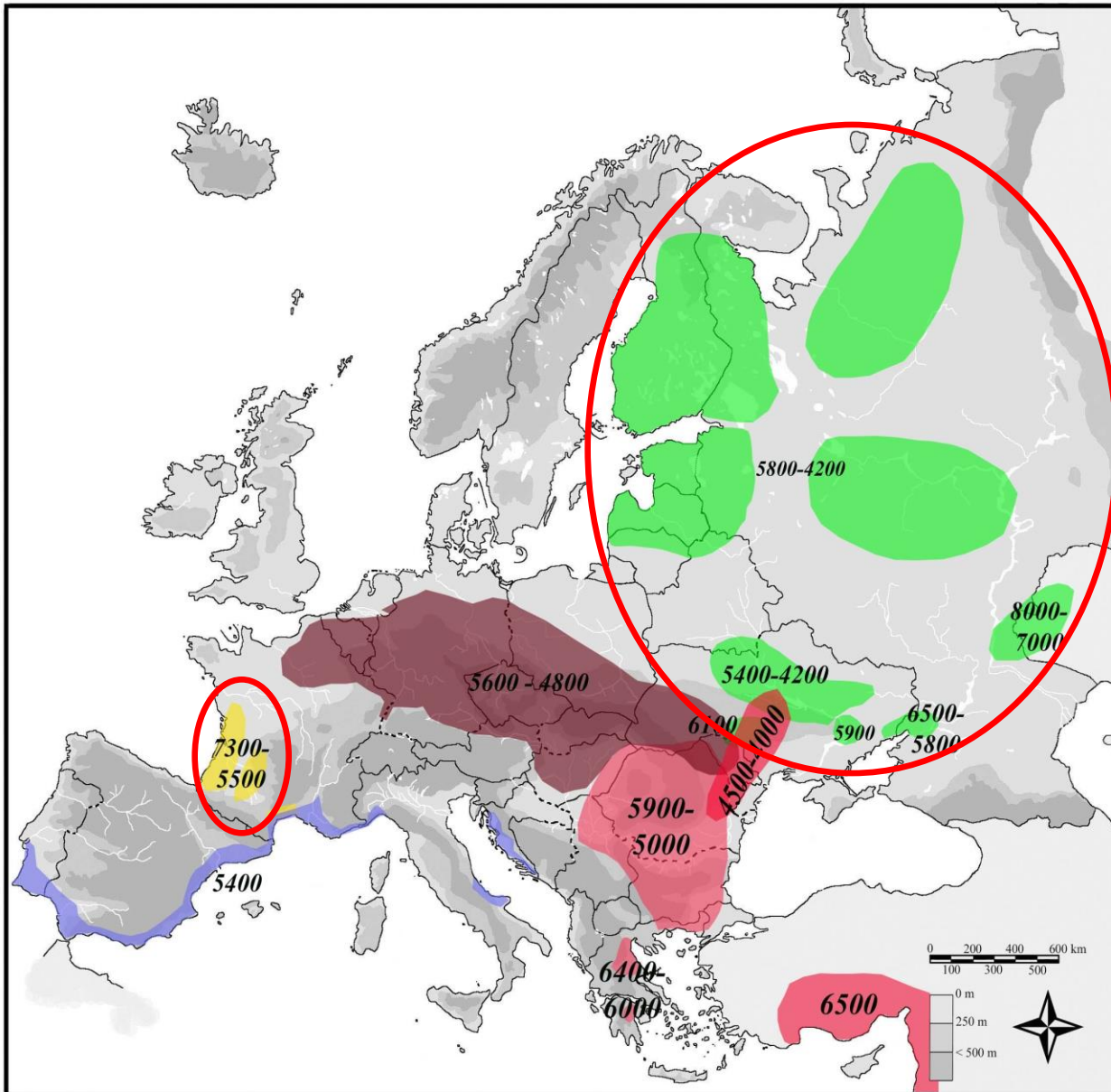
This model



Gkiasta et al., 2003



# Pan-European model



## East:

Limited evidence of farming

Well-developed pottery making

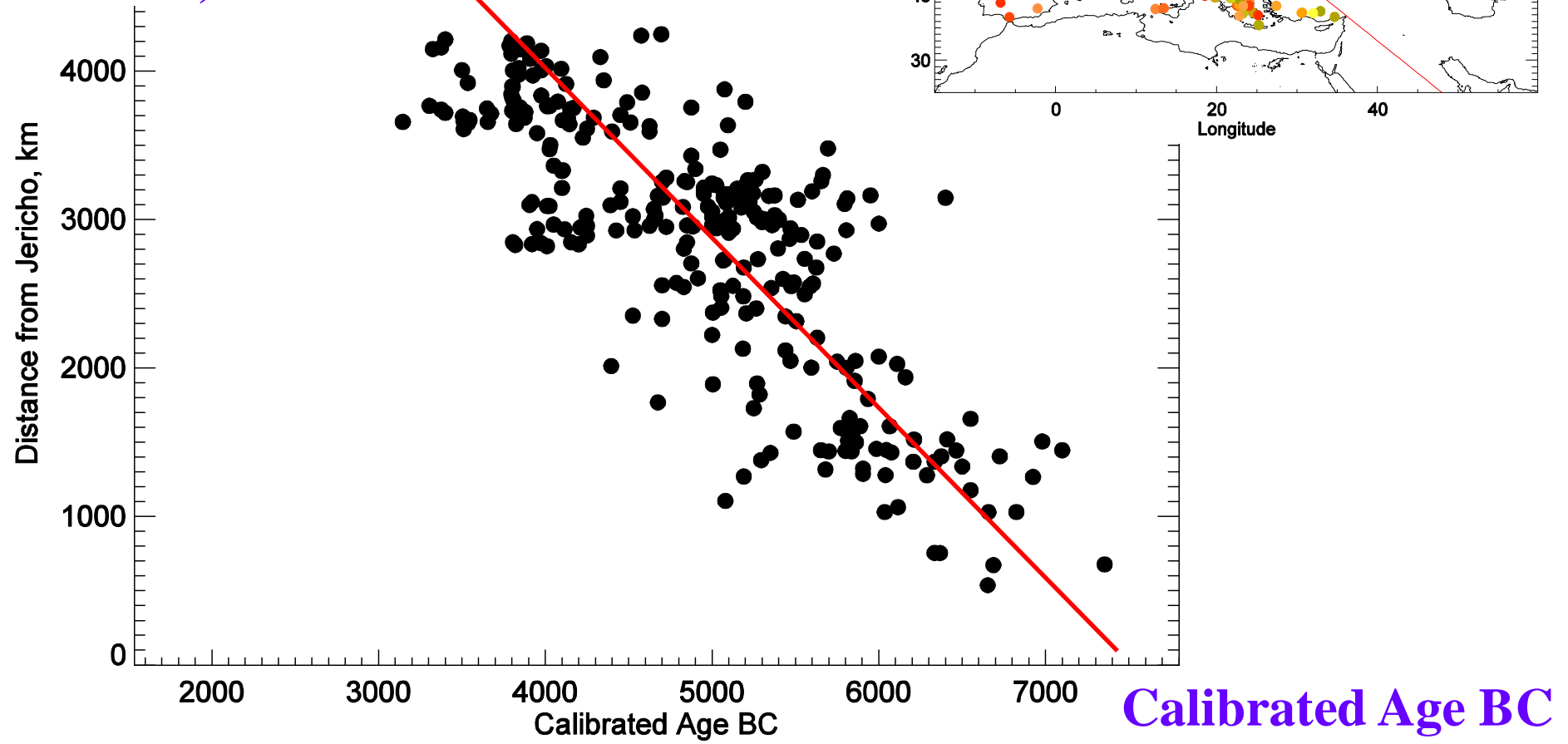
## West:

Pre-farming ceramic cultures

(La Hoguette & Roucadour)

# Spread from the Near East

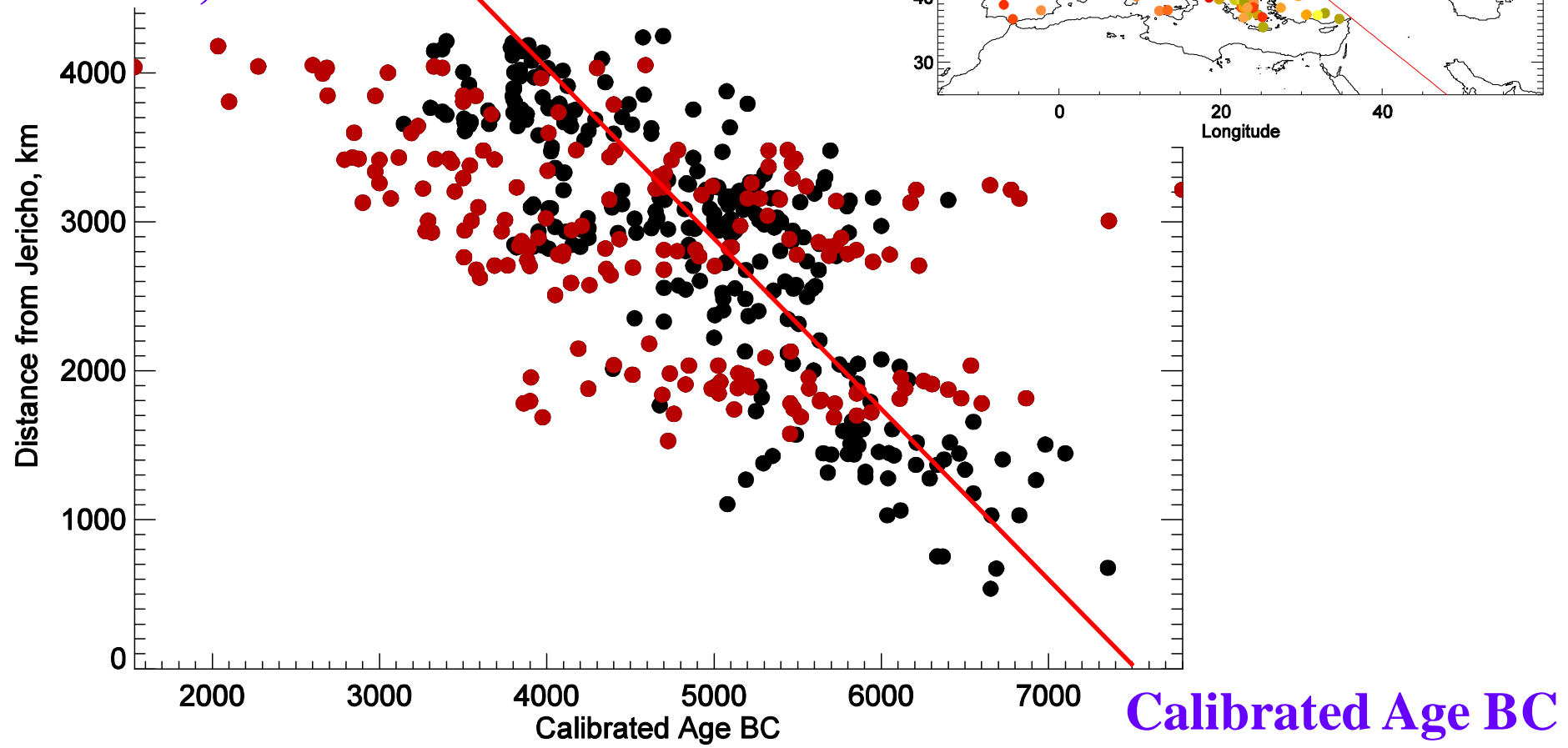
Distance from  
Jericho , km



Calibrated Age BC

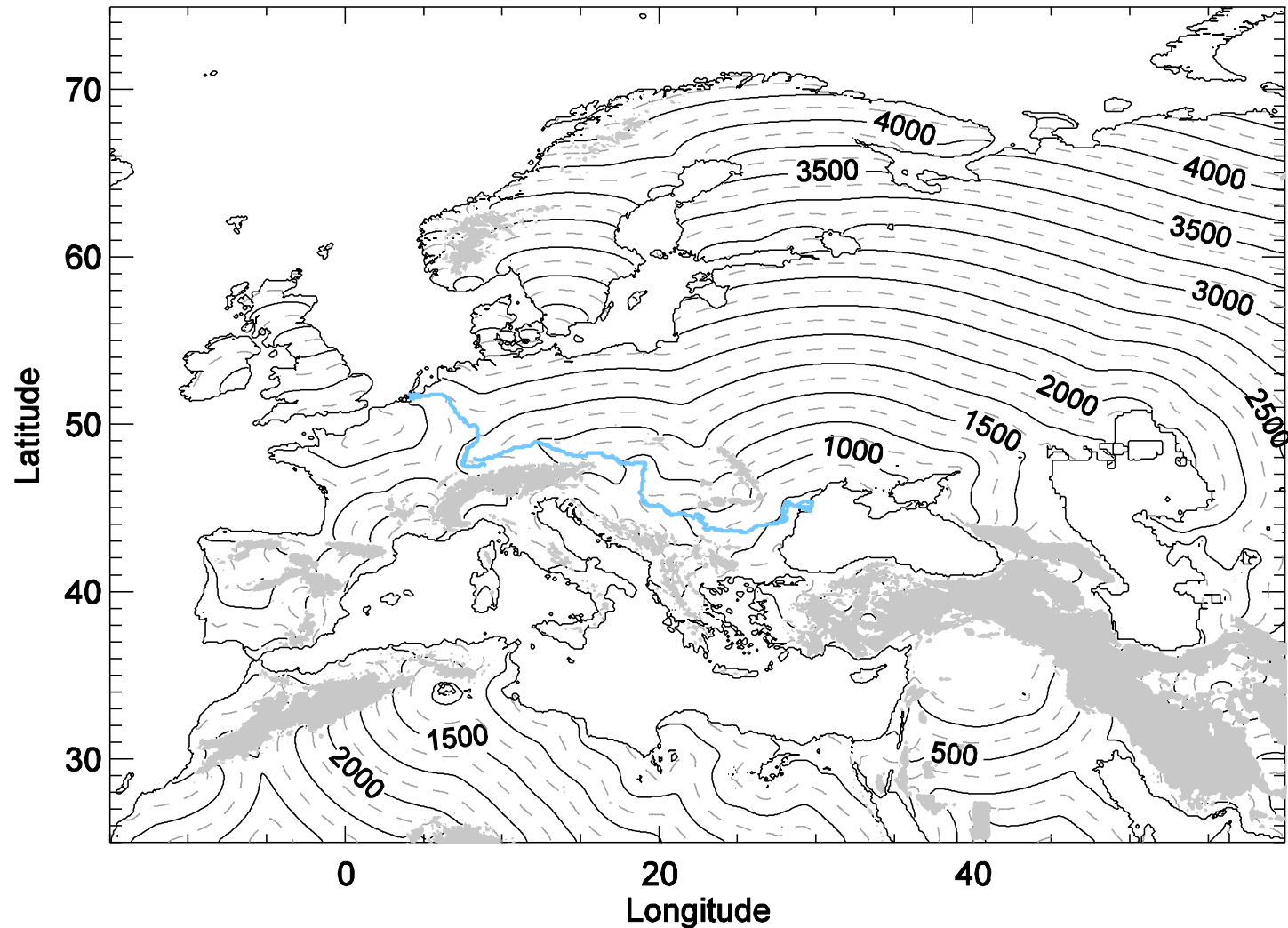
# cannot explain the Eastern Neolithic

Distance from  
Jericho , km

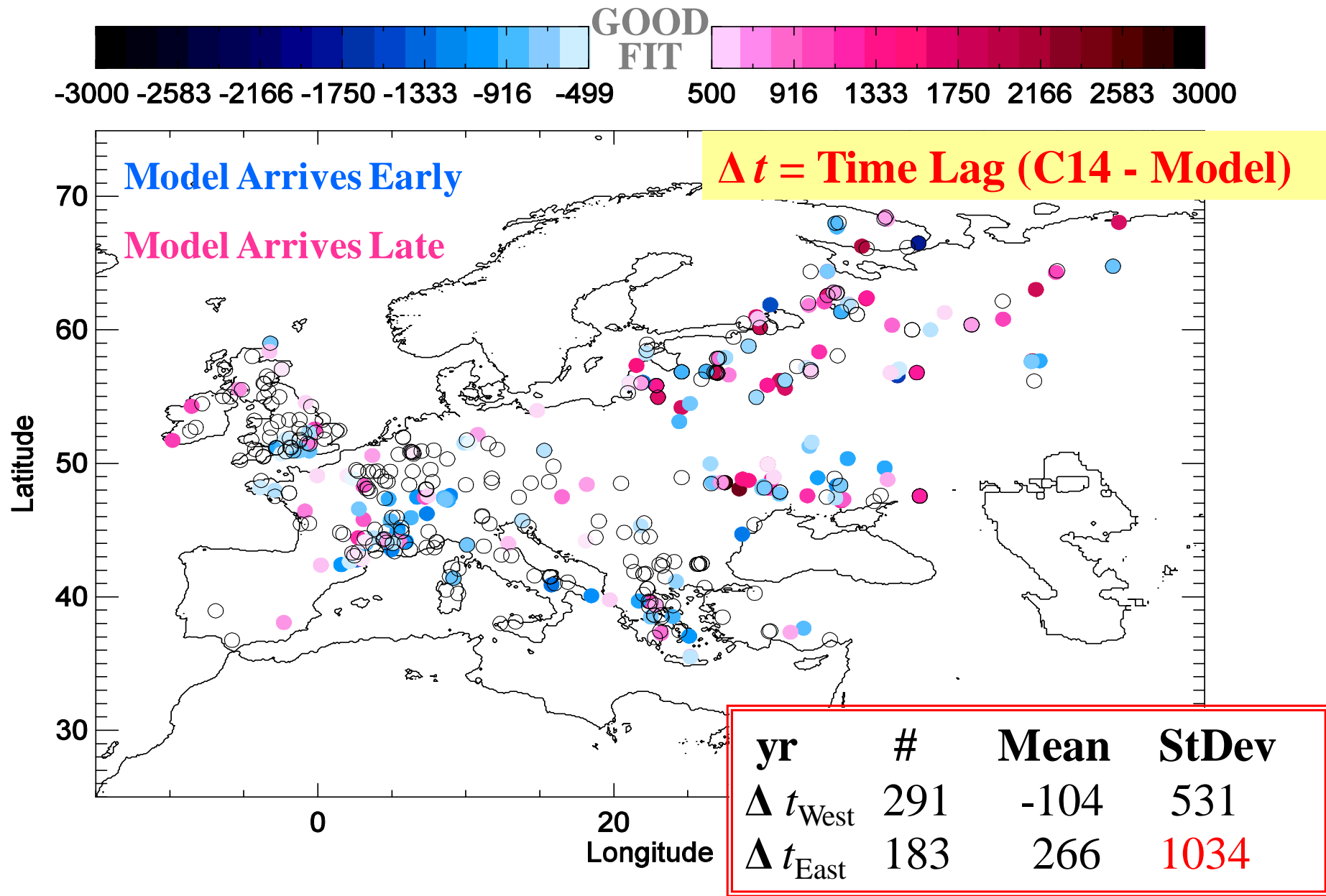




# Single source in Jericho: isochrones ( $n = \text{const}$ )



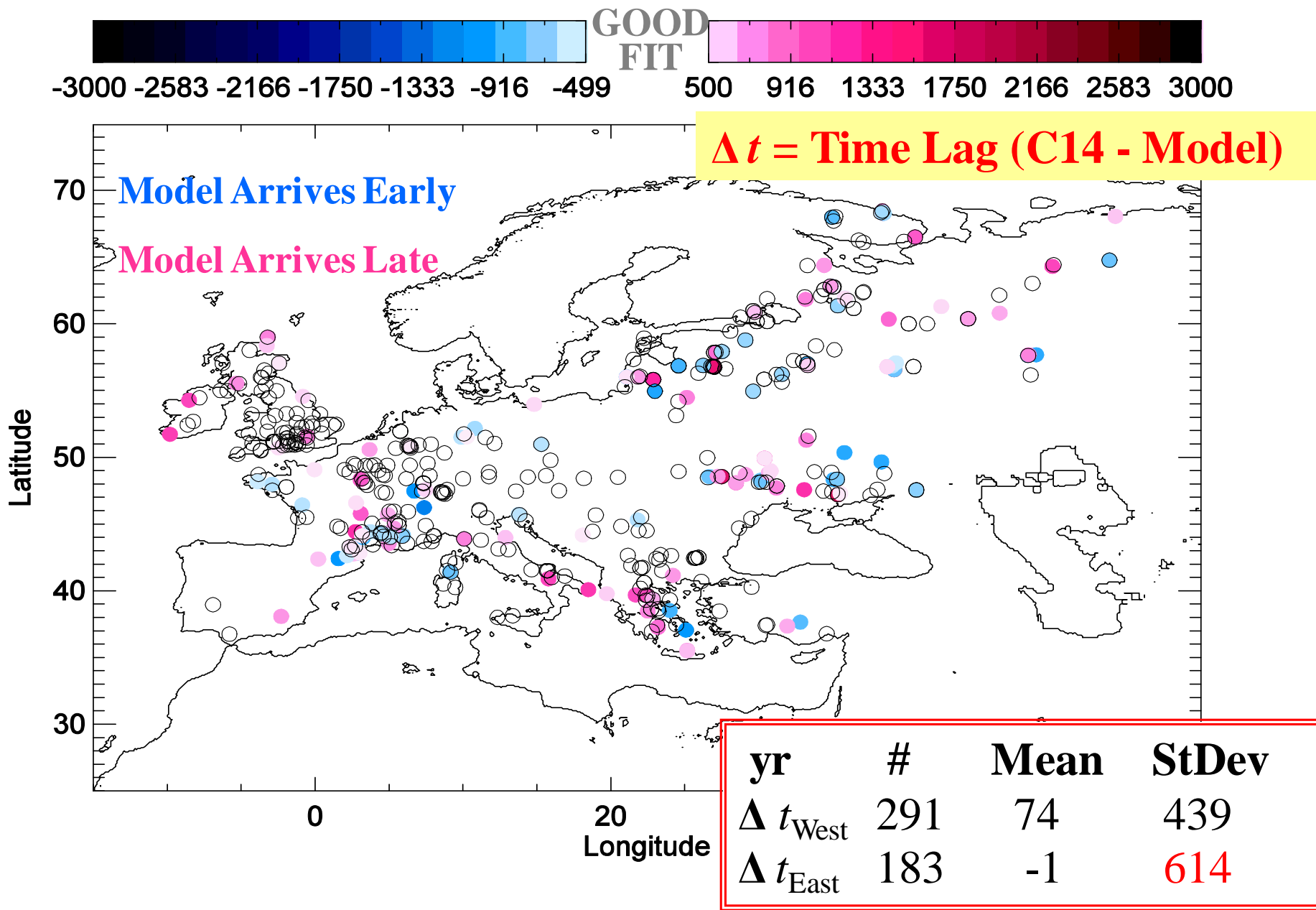
# Single-source model vs $^{14}\text{C}$ data



# Two sources of the European Neolithic

- $^{14}\text{C}$  dates in Eastern Europe do not all belong to the source in the Near East
- Additional source in Eastern Europe at  $71^\circ\text{N}$ ,  $56^\circ\text{E}$
- Hunter-gatherers:  $\gamma = 0.007 \text{ yr}^{-1}$ ;  
 $\nu = 90 \text{ km}^2/\text{yr}$  ( $\lambda = 75 \text{ km}$ ,  $\tau = 15 \text{ yr}$ );  
 $U = 0.8 \text{ km/yr}$ ;  $n_0 = 7$  people per  $100 \text{ km}^2$

# Two sources

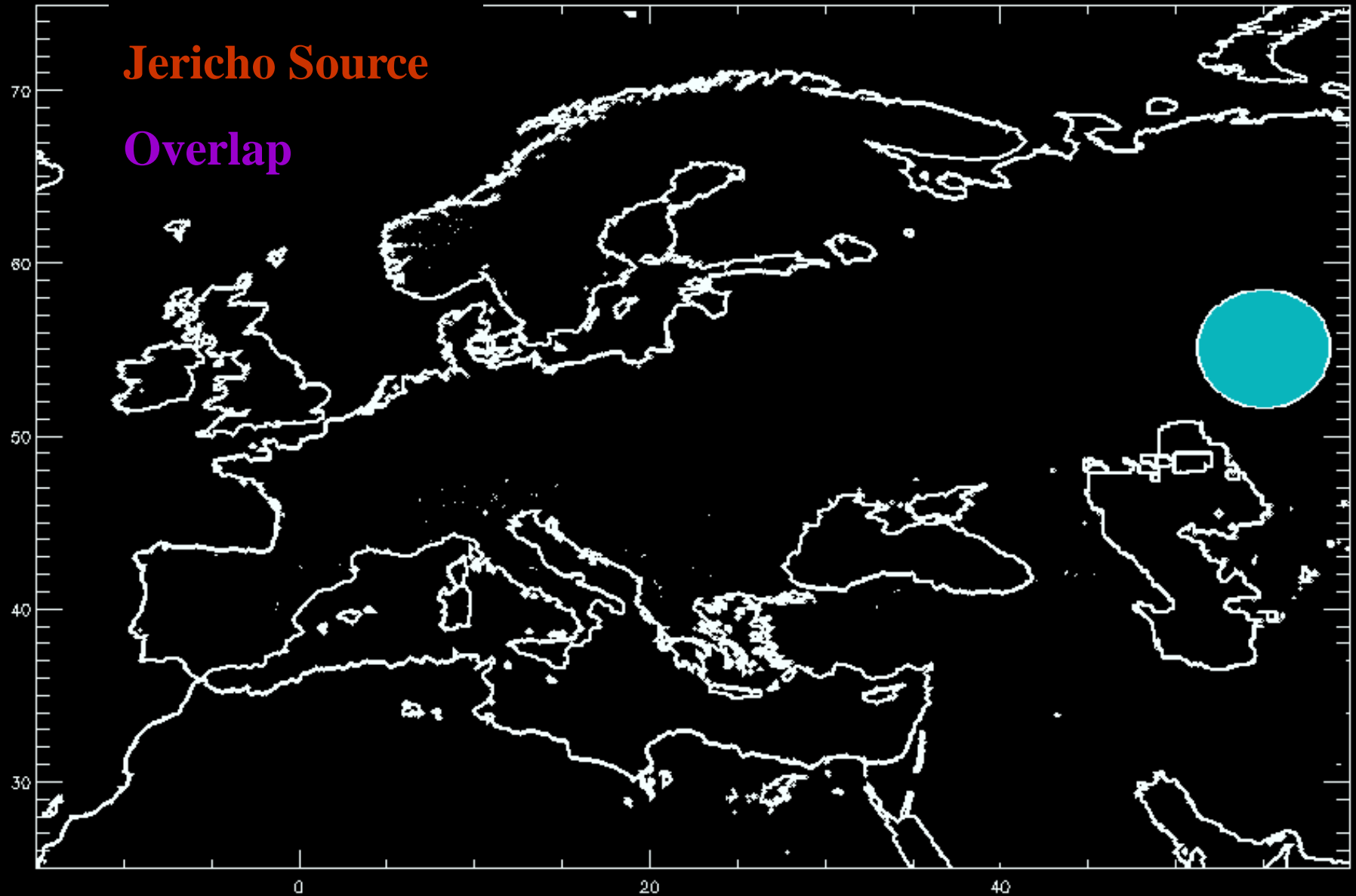




**Eastern Source**

**Jericho Source**

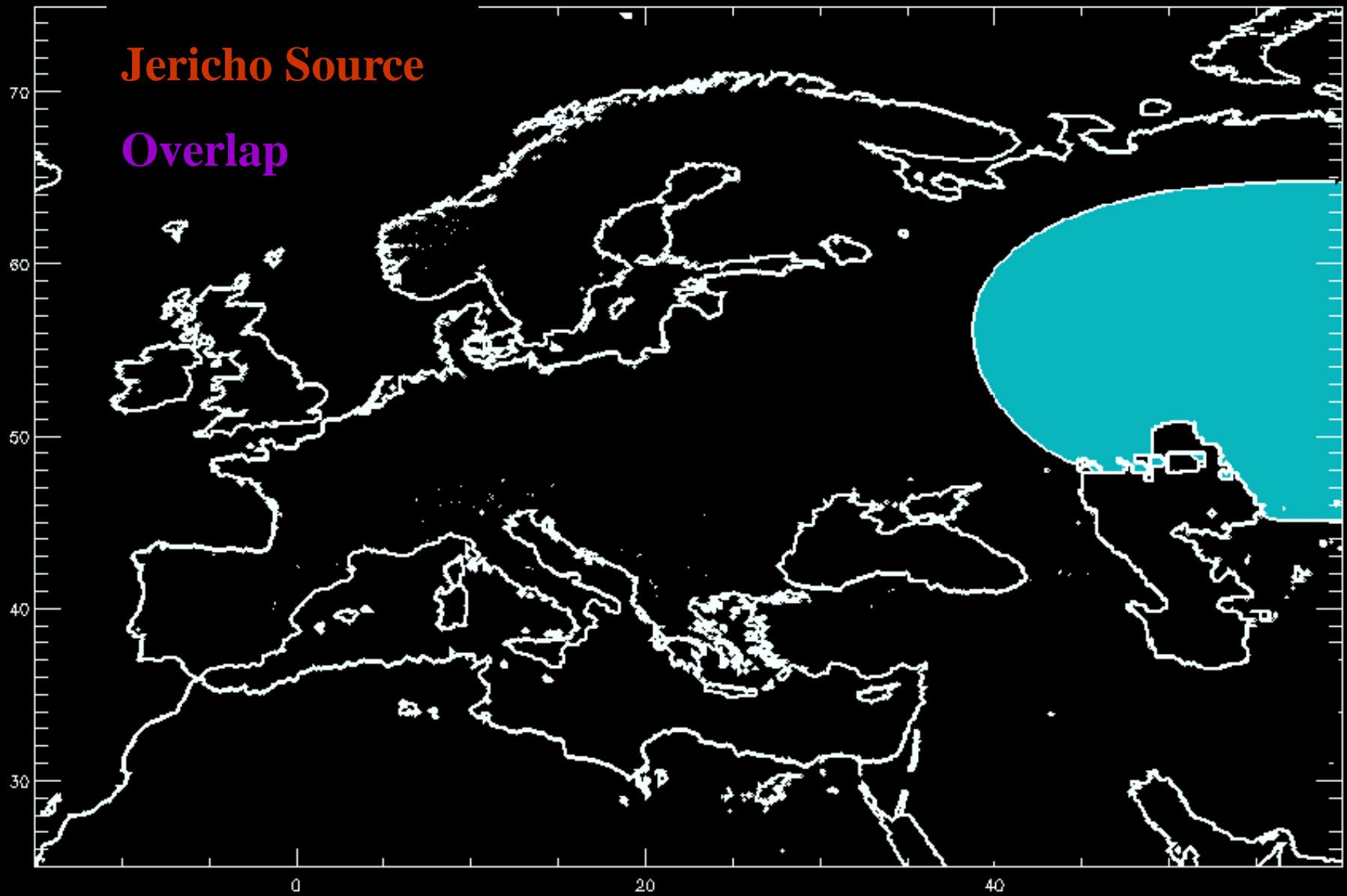
**Overlap**



**Eastern Source**

**Jericho Source**

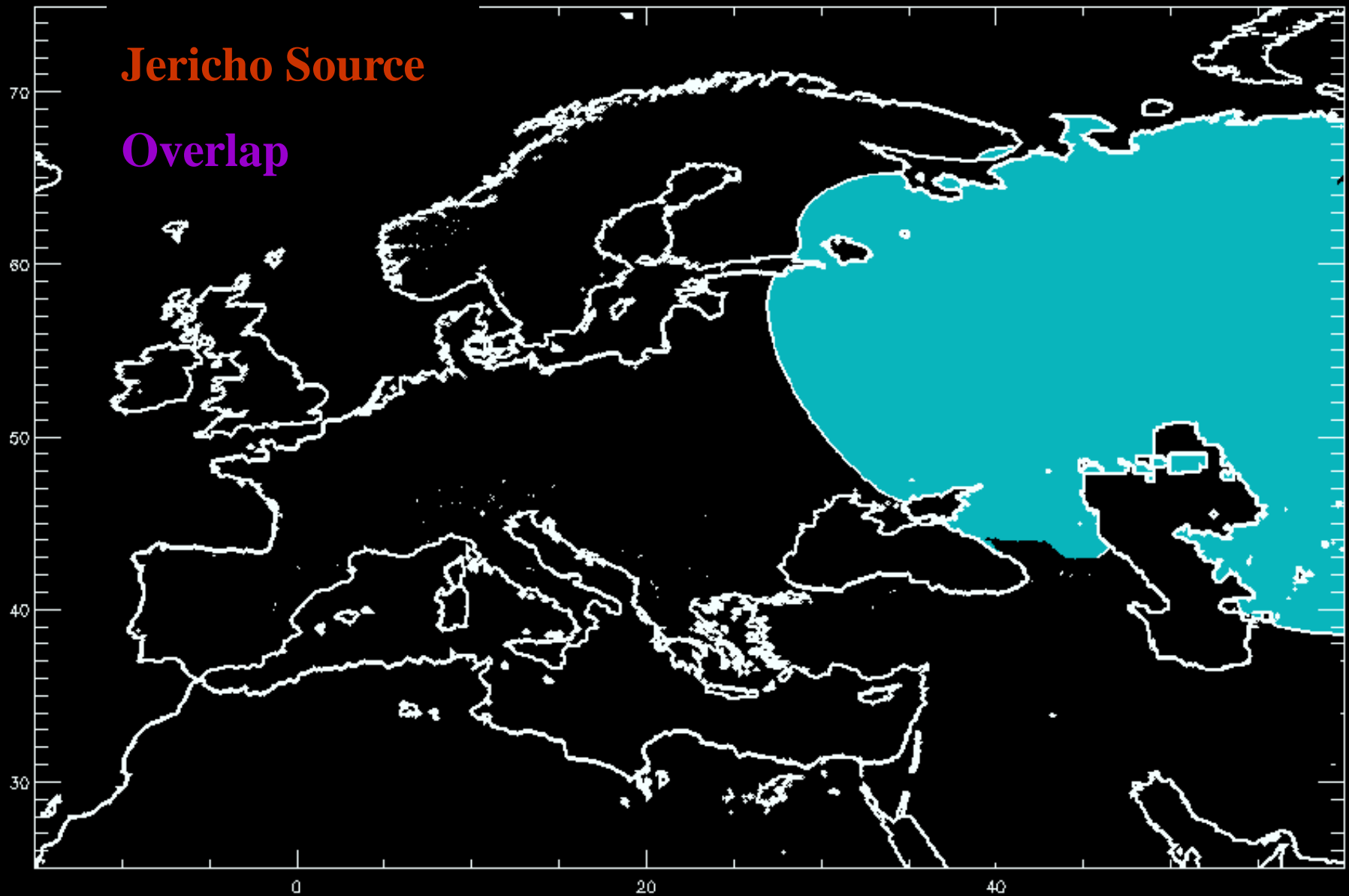
**Overlap**



**Eastern Source**

**Jericho Source**

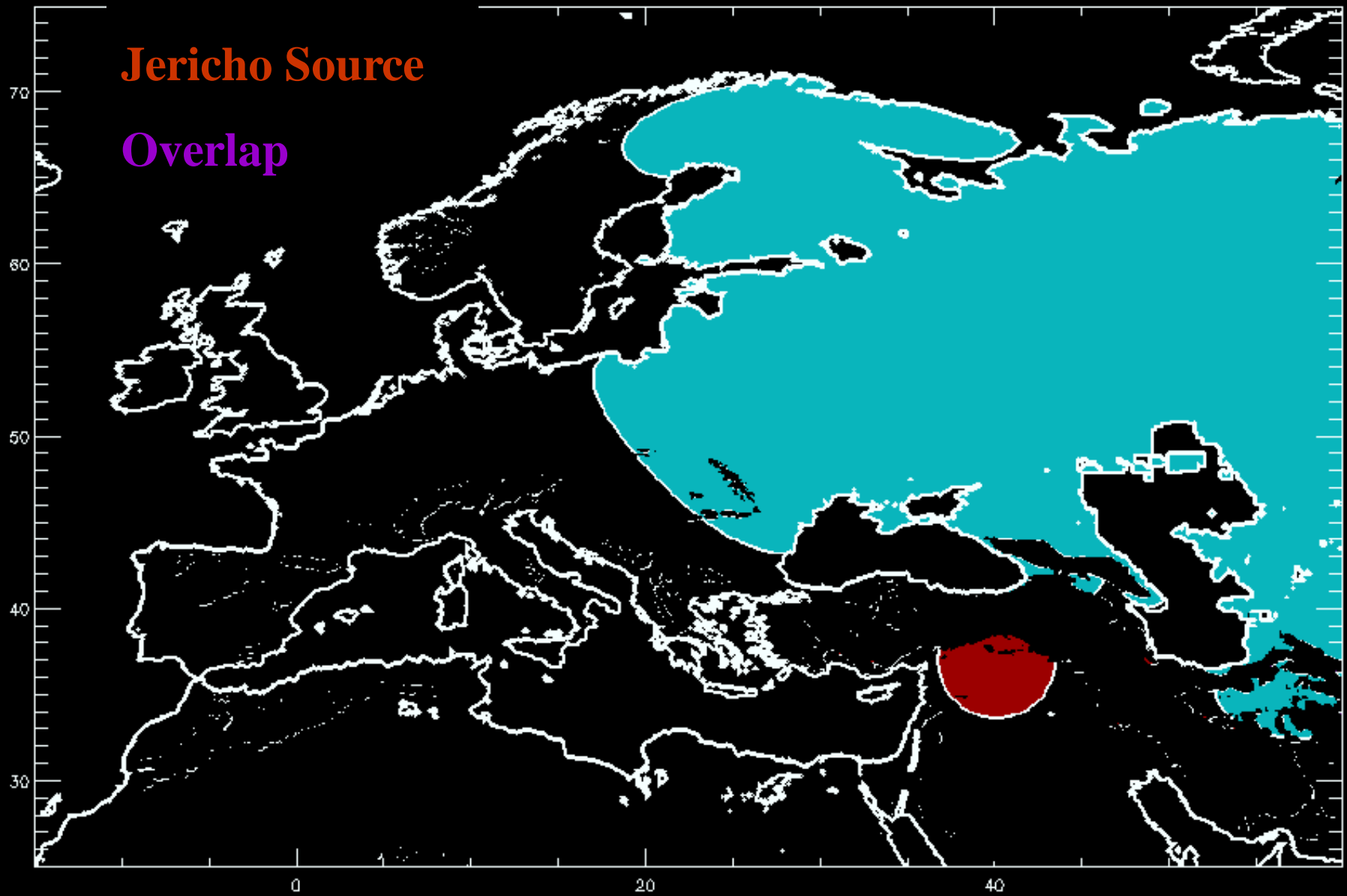
**Overlap**



**Eastern Source**

**Jericho Source**

**Overlap**

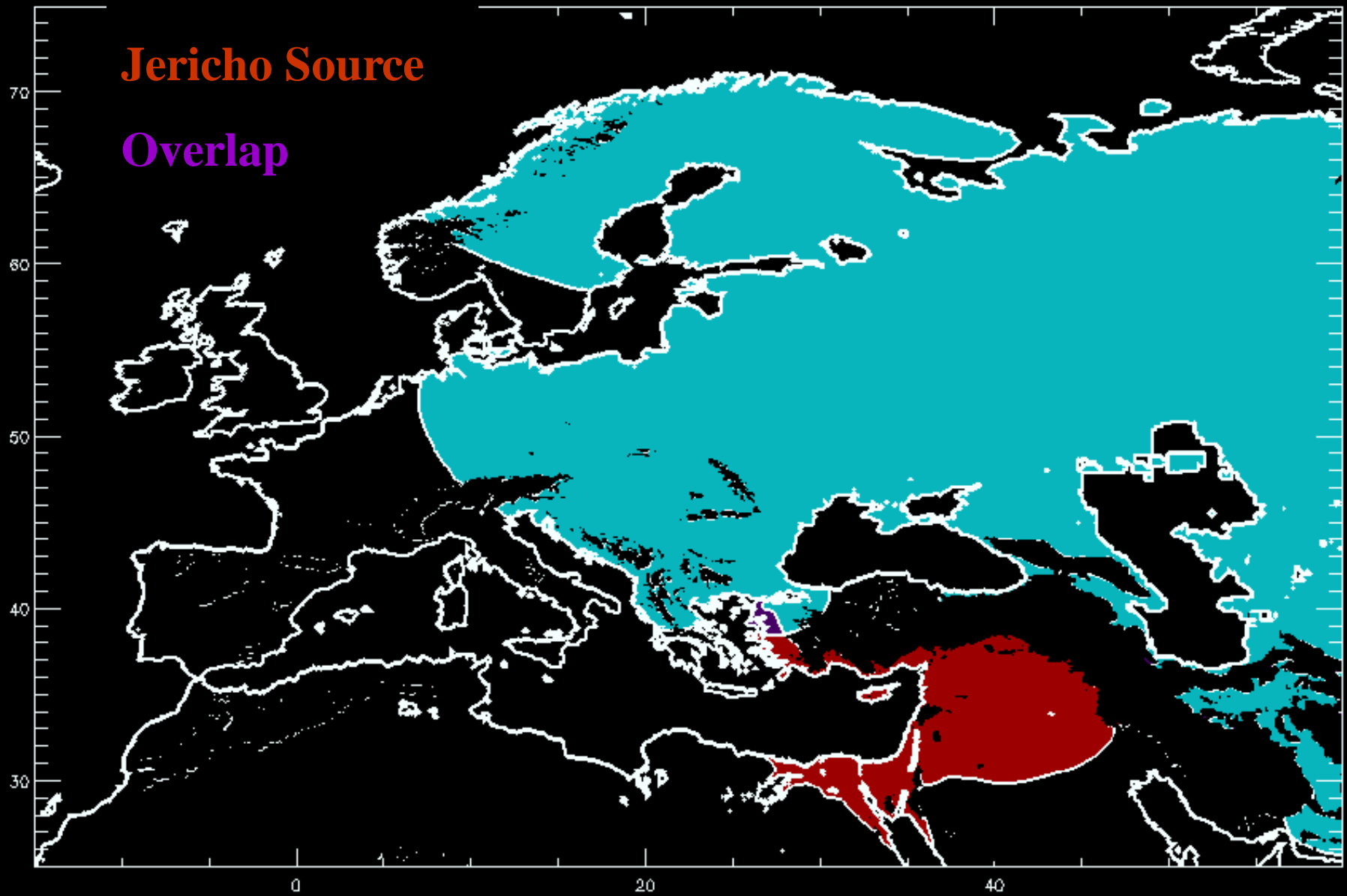




**Eastern Source**

**Jericho Source**

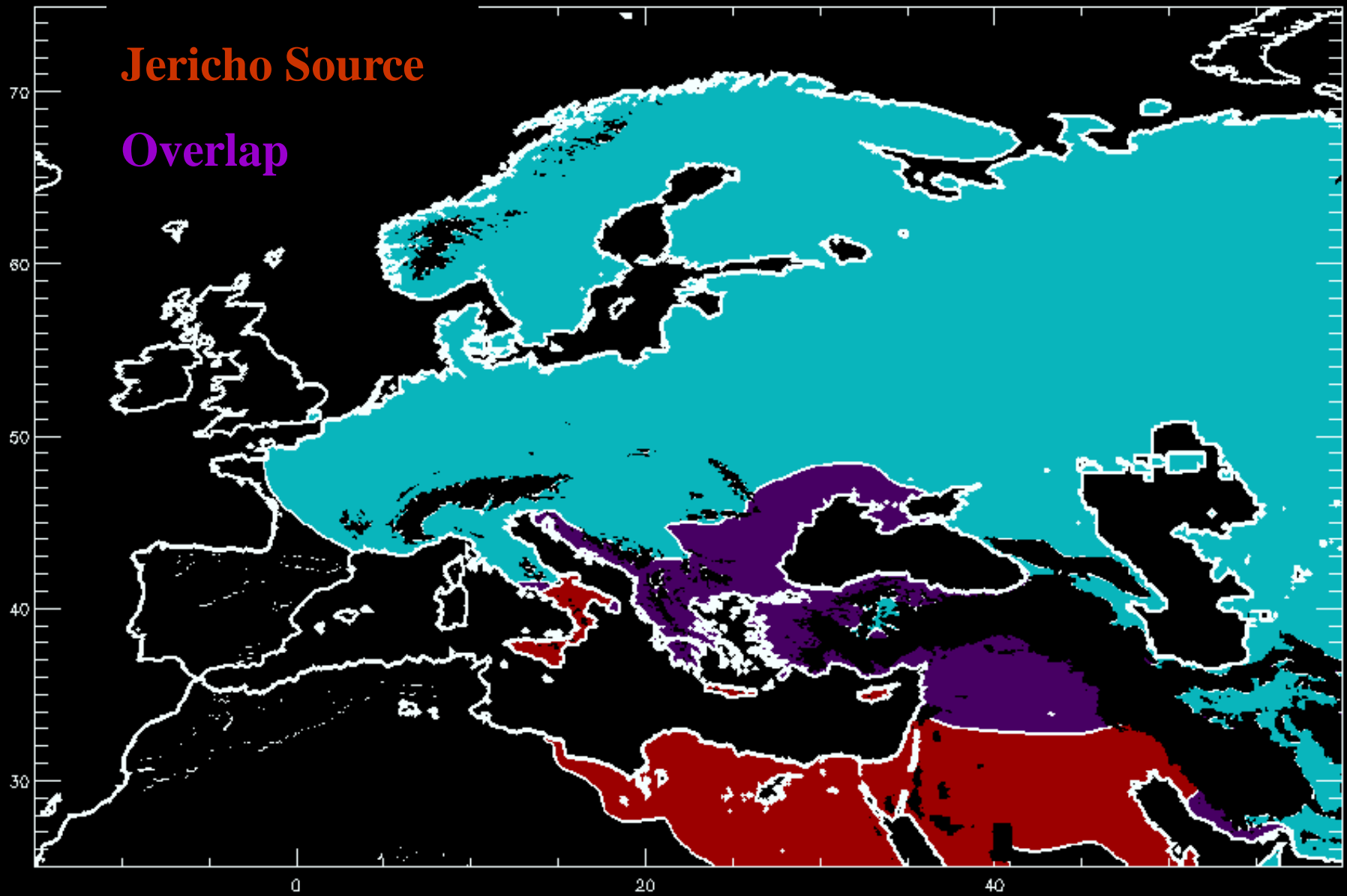
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**Eastern Source**

**Jericho Source**

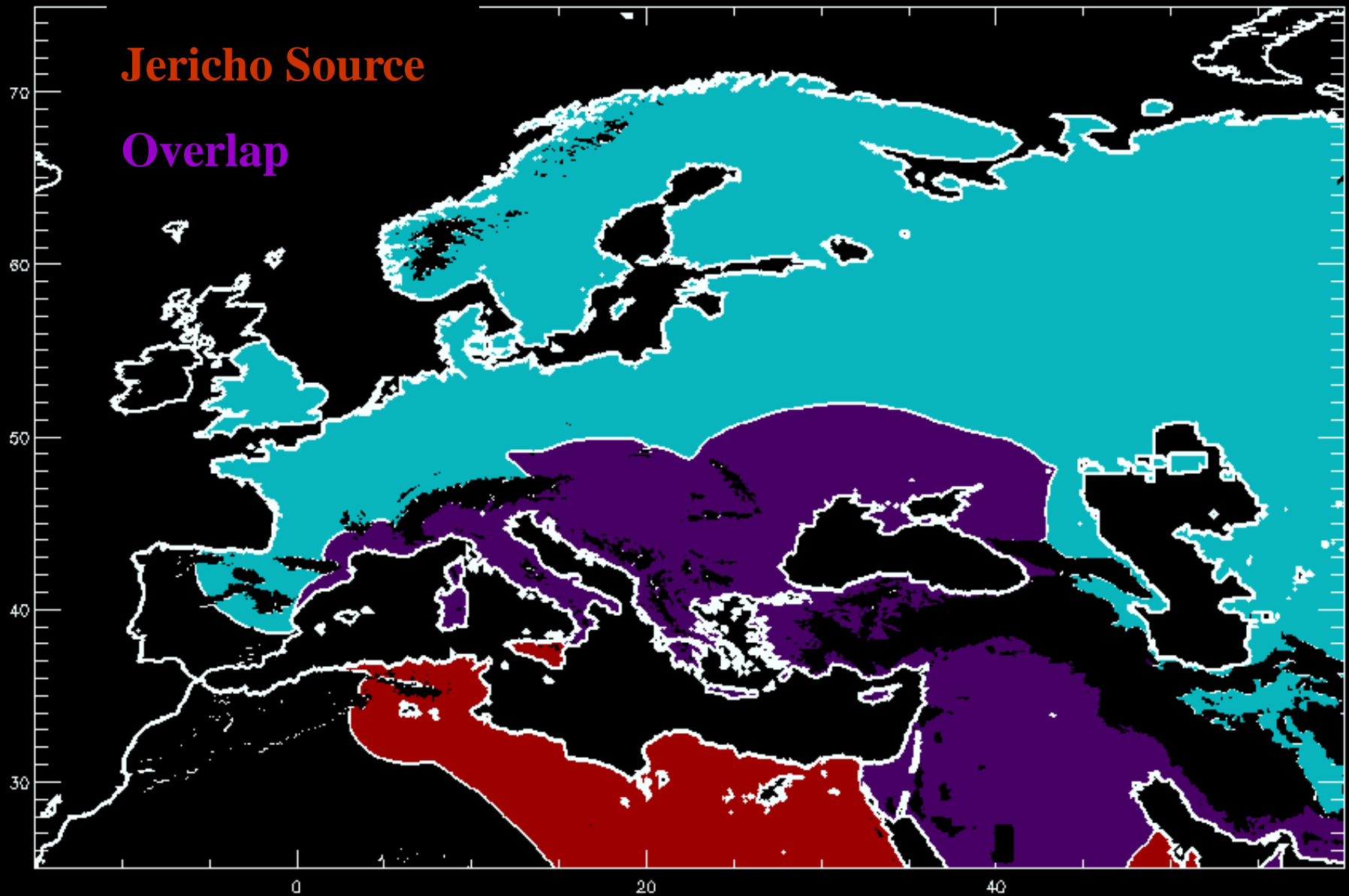
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**Eastern Source**

**Jericho Source**

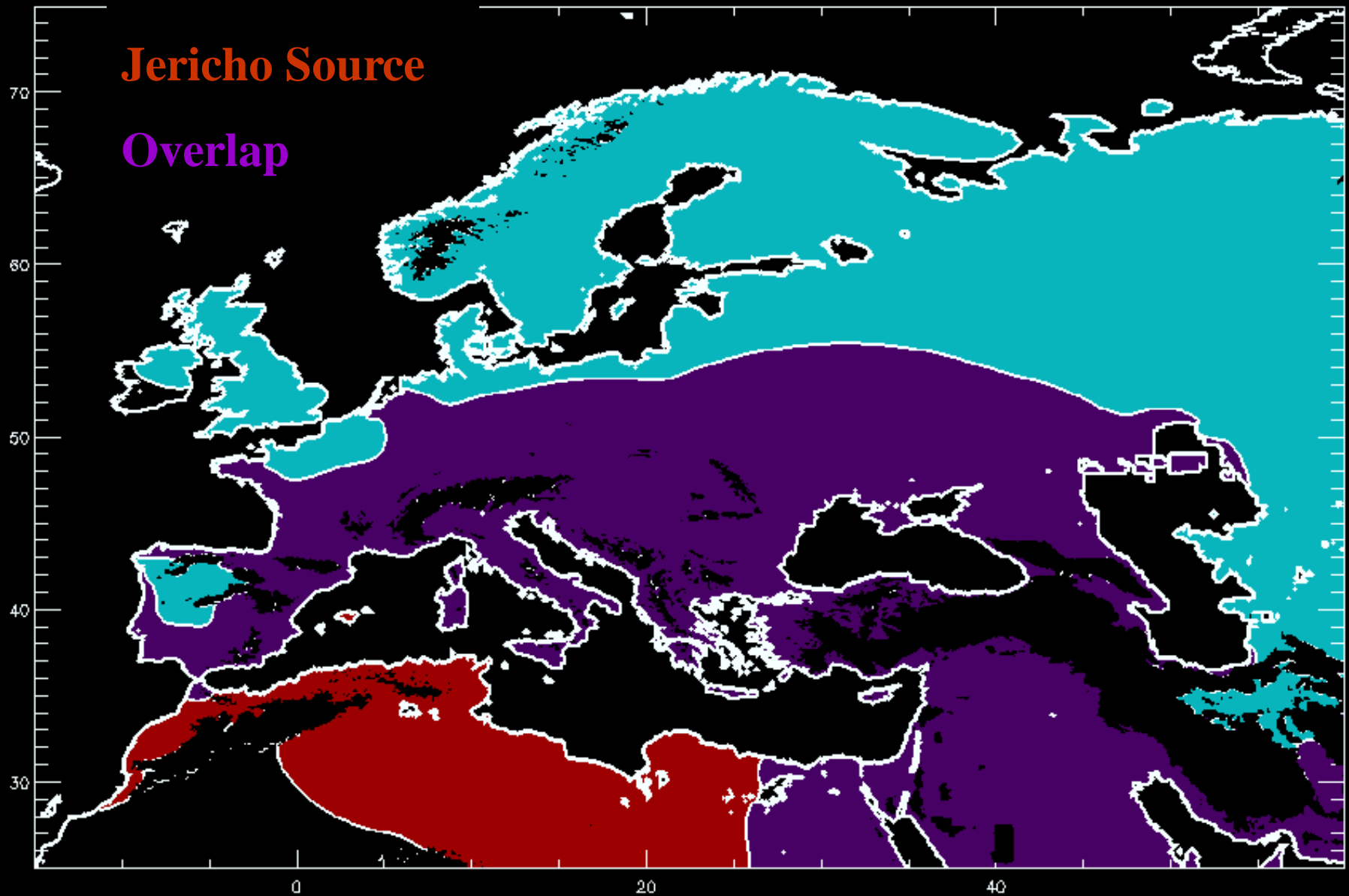
**Overlap**



**Eastern Source**

**Jericho Source**

**Overlap**

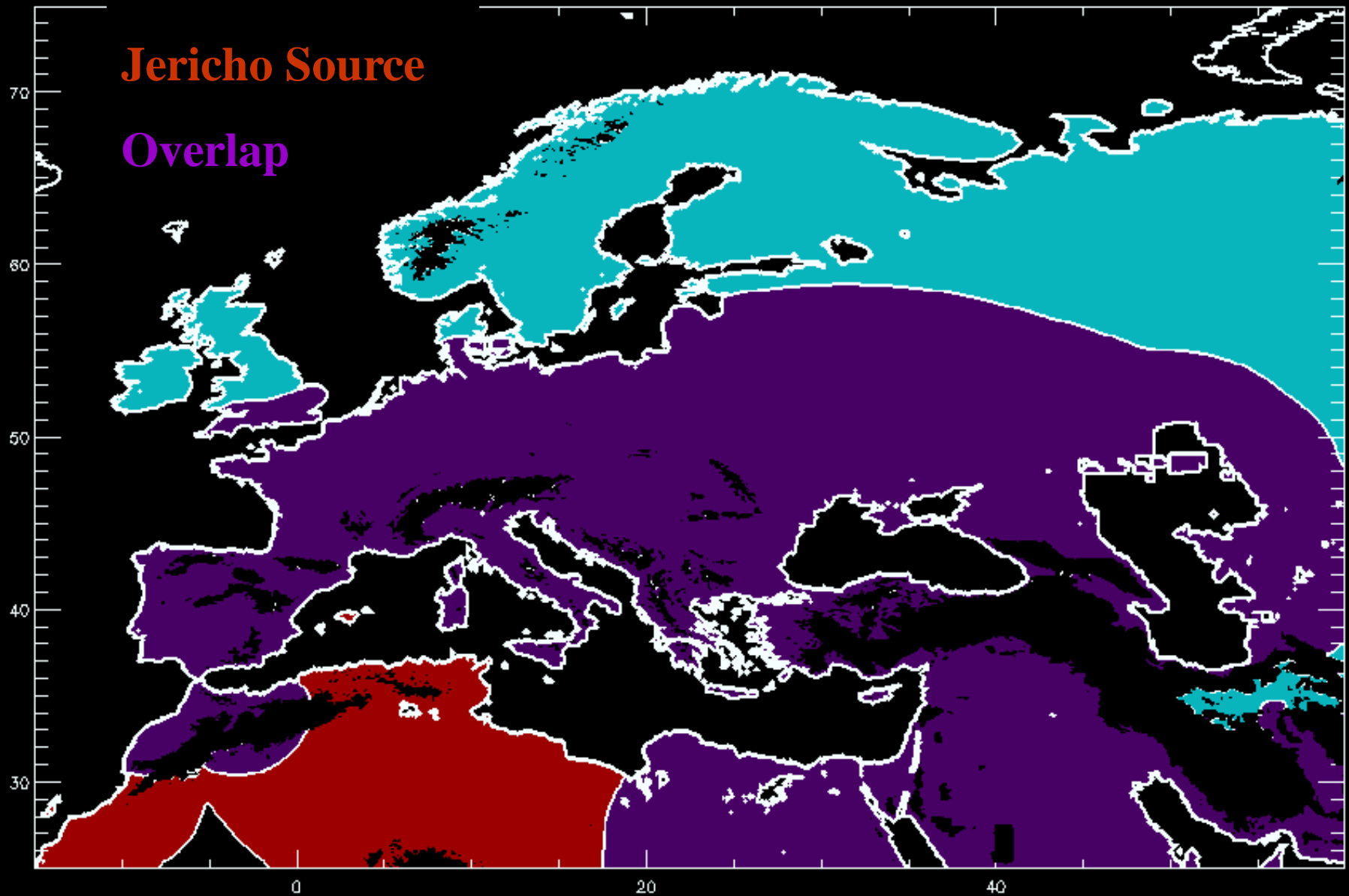




**Eastern Source**

**Jericho Source**

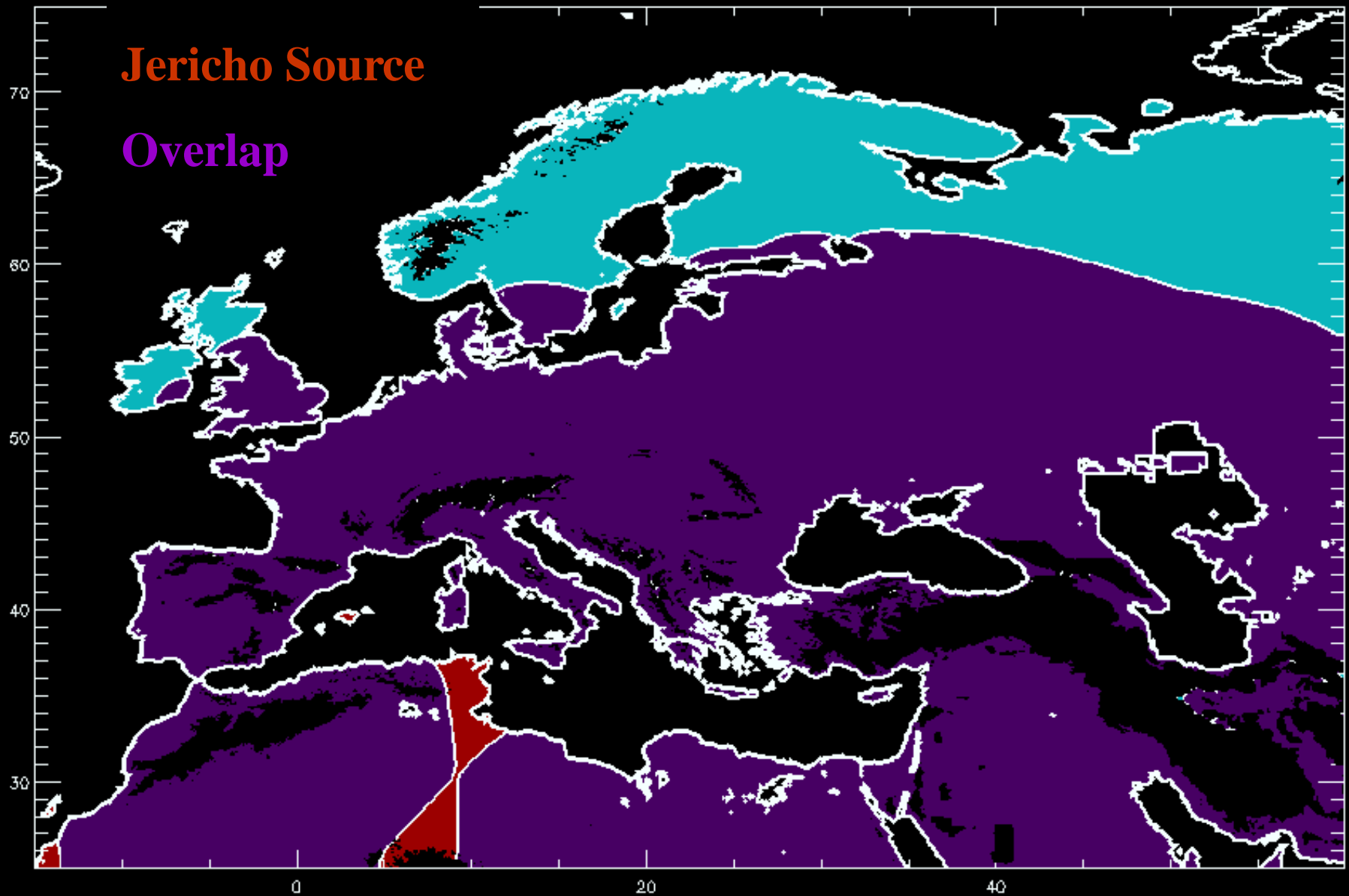
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**Eastern Source**

**Jericho Source**

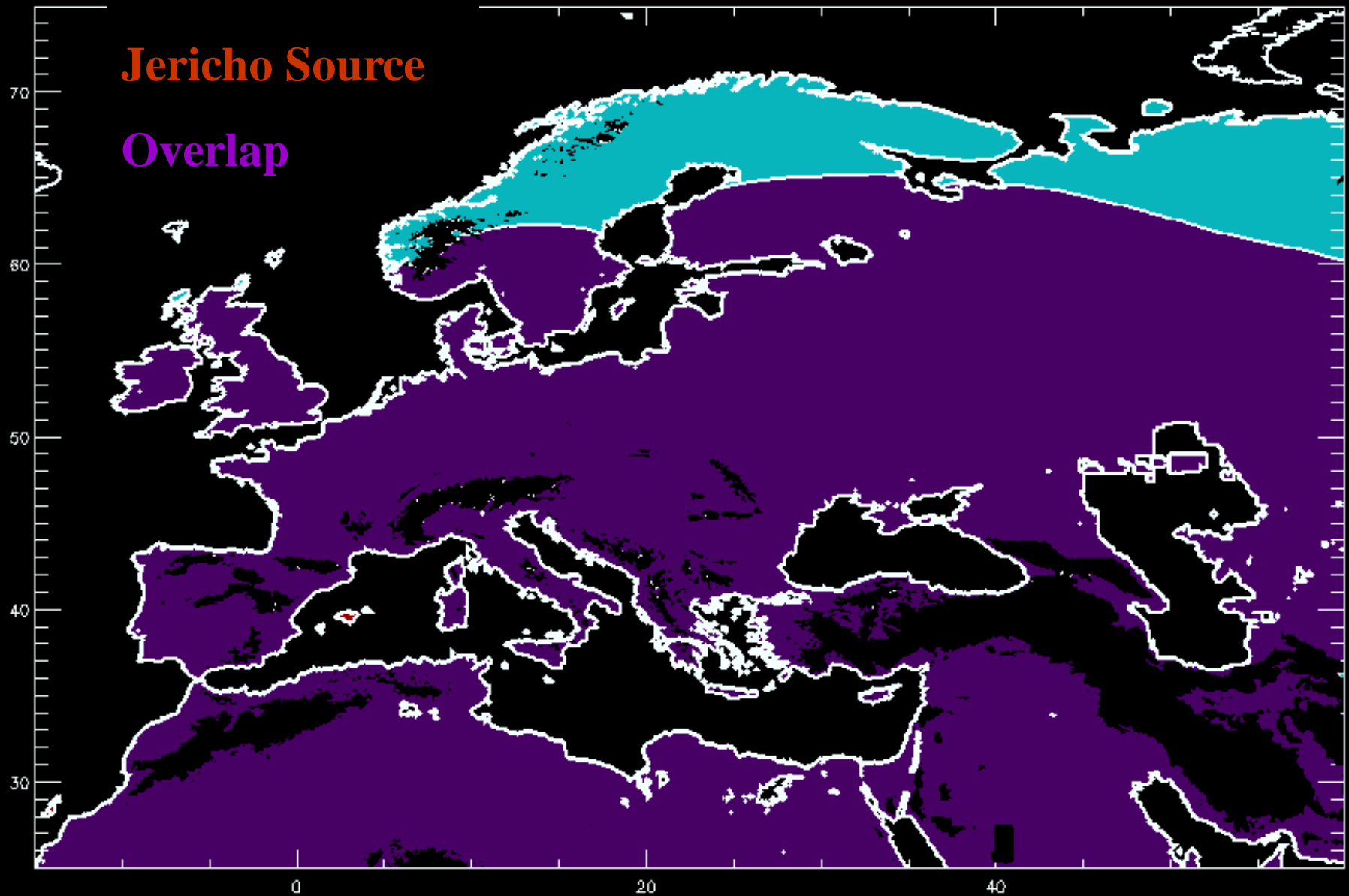
**Overlap**



**Eastern Source**

**Jericho Source**

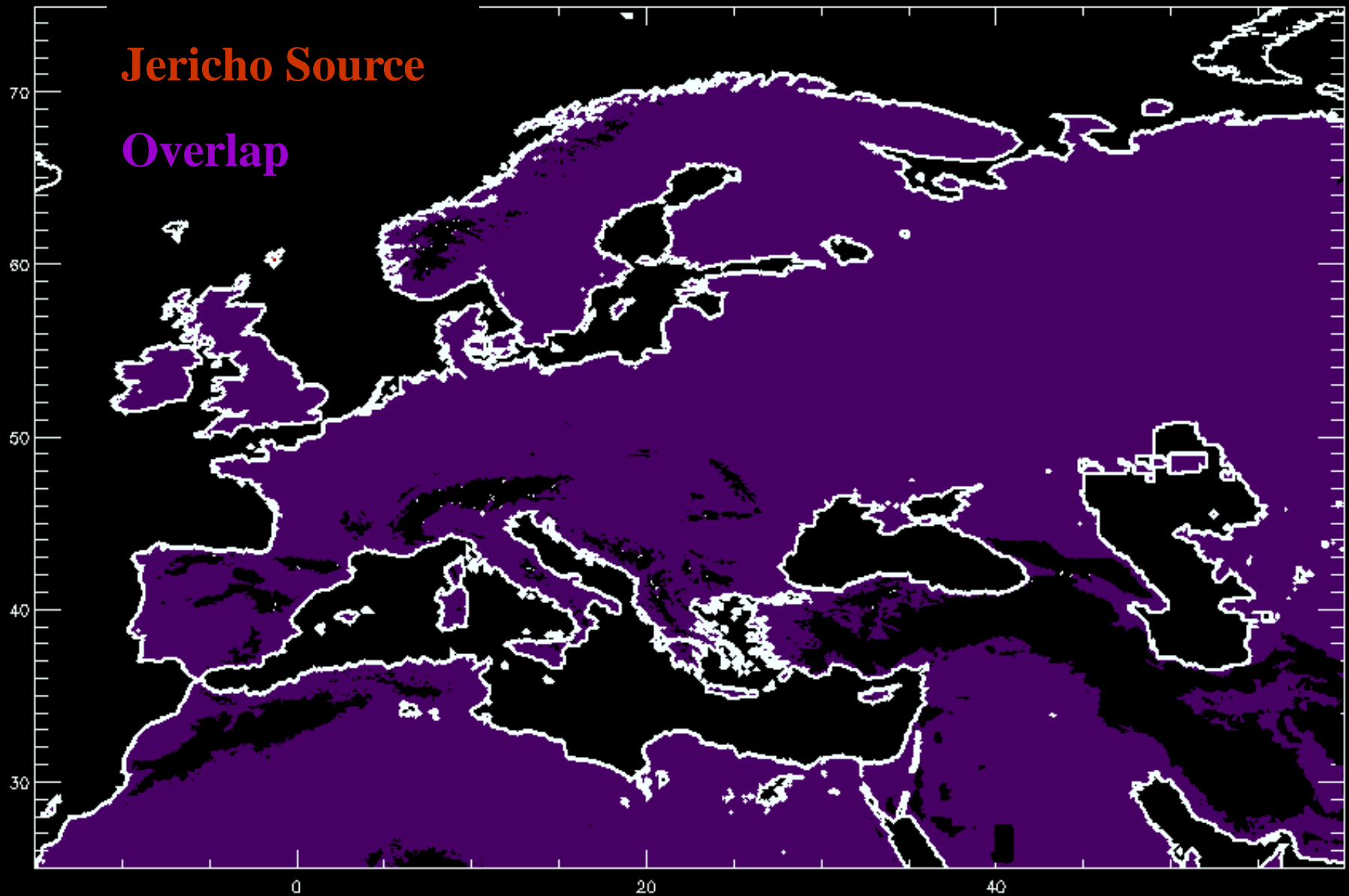
**Overlap**



**Eastern Source**

**Jericho Source**

**Overlap**



**Better fit with two sources,  $\Delta t = T_{C14} - T_{\text{model}}$  [yr]**

**Single source (Jericho)**

Region	#	Mean	St. Dev.
W & E	474	39	786
W	291	-104	531
E	183	<b>260</b>	<b>1034</b>

**Two sources (Jericho + Eastern Europe)**

Region	#	Mean	St. Dev.
W & E	474	45	514
W	291	74	439
E	183	<b>-1</b>	<b>614</b>



# Is the improvement significant?

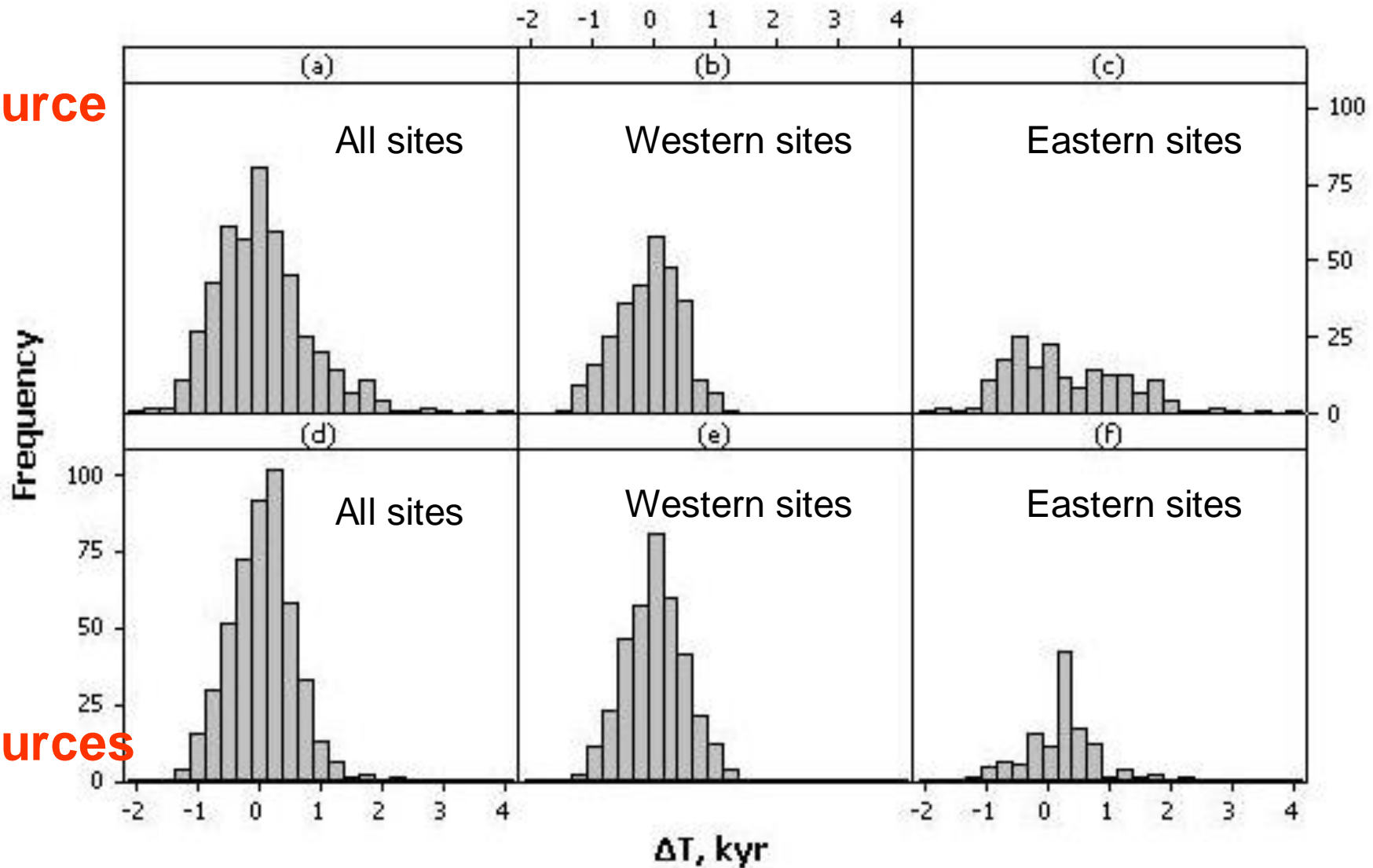
95% confidence intervals for the standard deviation of  $\Delta t$  do not overlap:

- Single source,  $740 < \sigma_1 < 840$  years
- Two sources,  $480 < \sigma_2 < 550$  years

**F-test:**  $\sigma_1 = \sigma_2$  rejected at 95% level

# Histograms of $\Delta t$

1 source

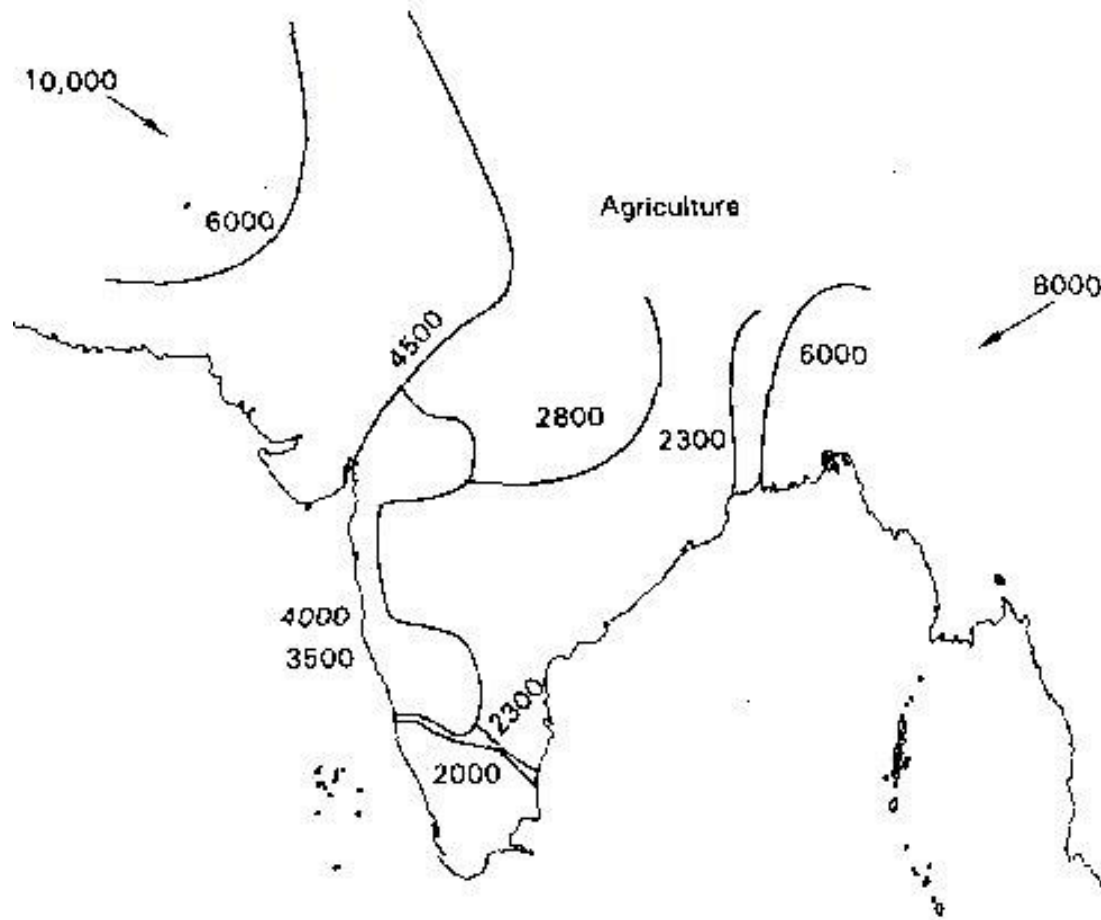


2 sources

# Conclusions

- Mathematical modelling of prehistory is feasible
- Anisotropic diffusion near major waterways affects the global pattern of the spread of farming
- Evidence for a second source of the Neolithic in the East
- Sites in the East are 50% of Eastern origin and 50% of Near-Eastern origin
- Sea-faring capabilities: 40 km offshore
- Mobility of hunter-gatherers:  
 $U = 0.8 \text{ km/yr} \rightarrow v = 90 \text{ km}^2/\text{yr}$   
( $\lambda = 75 \text{ km}$ ,  $\tau = 15 \text{ yr}$ )

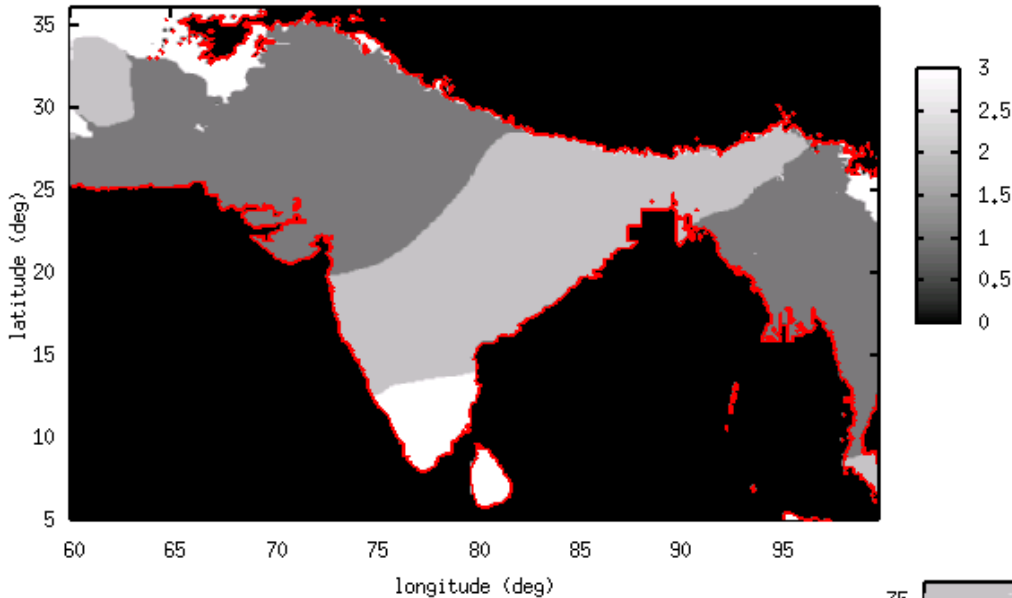
# Incipient agriculture in India: interaction of 3 populations



- ❑ Advance from **two centres**
- ❑ Isolated groups of **hunter-gatherers**
- ❑ Multi-population model:
  1. invading farmers
  2. retreating foragers
  3. foragers converted into farming

# Dominant population types

Plot of the Dominant Population in India after 2000yrs

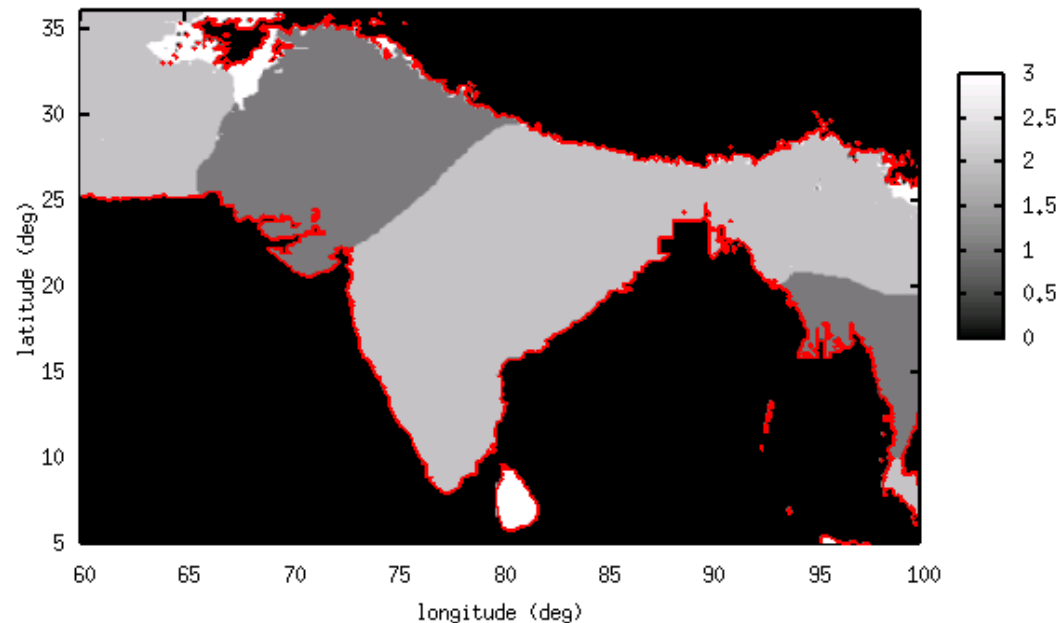


← after 2000 yrs

↓ after 5000 yrs

- Invading farmers
- Converted farmers
- Hunter-gatherers

Plot of the Dominant Population in India after 5000yrs





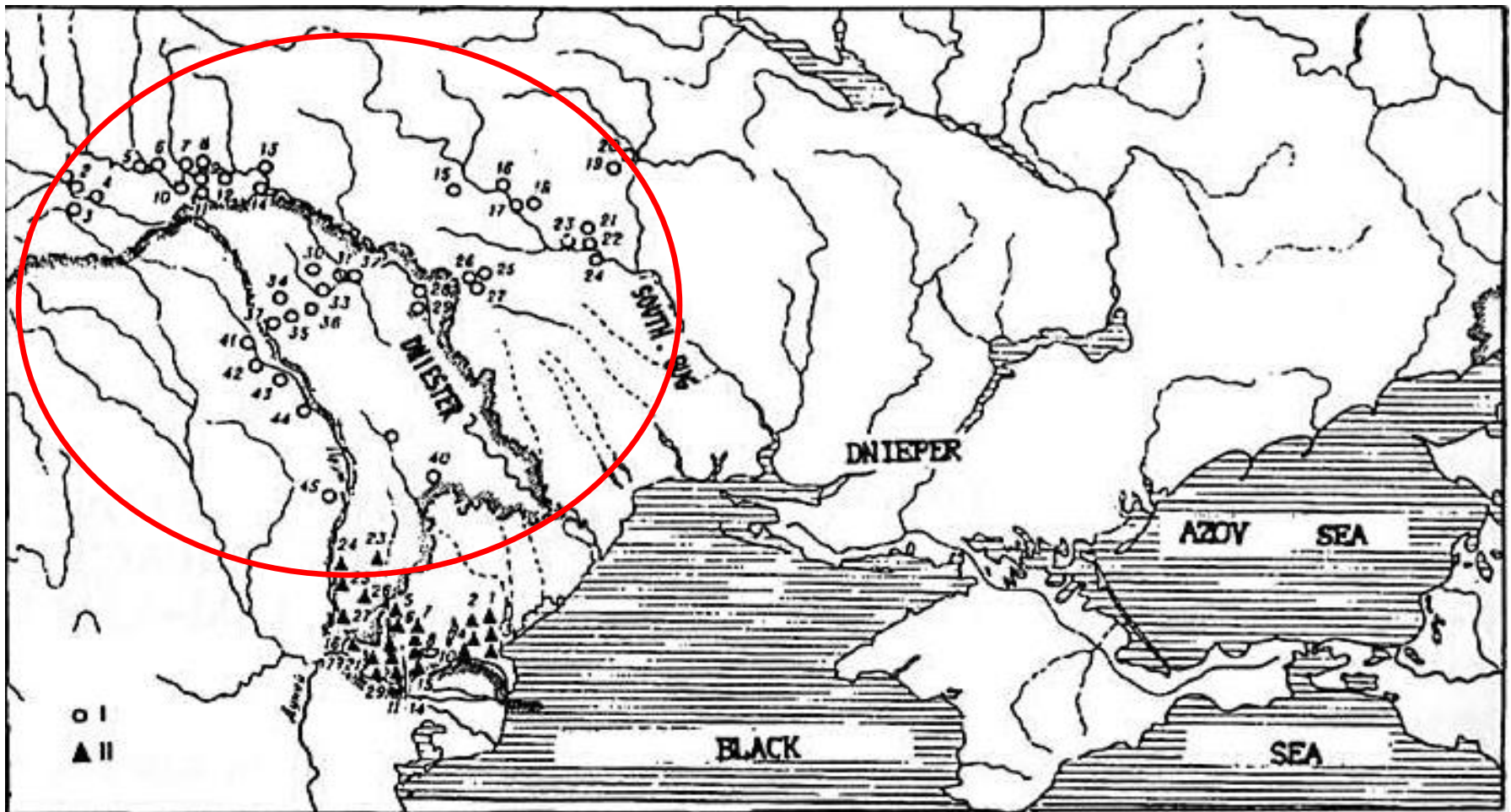
# Settled life: the Cucuteni-Tripolye culture



Cultural Stage		Time Span
In Ukraine	In Romania	kyr BC
Tripolye A	Precucuteni	5.4/5.3–4.7/4.6
Tripolye B-I	Cucuteni A	4.5–4.2
Tripolye B-I/II	Cucuteni A-B	4.2–4.0
Tripolye B-II + C-I	Cucuteni B	4.0–3.5
Tripolye C-II		3.2–2.75/2.65

# Cucuteni-Tripolye Phase A

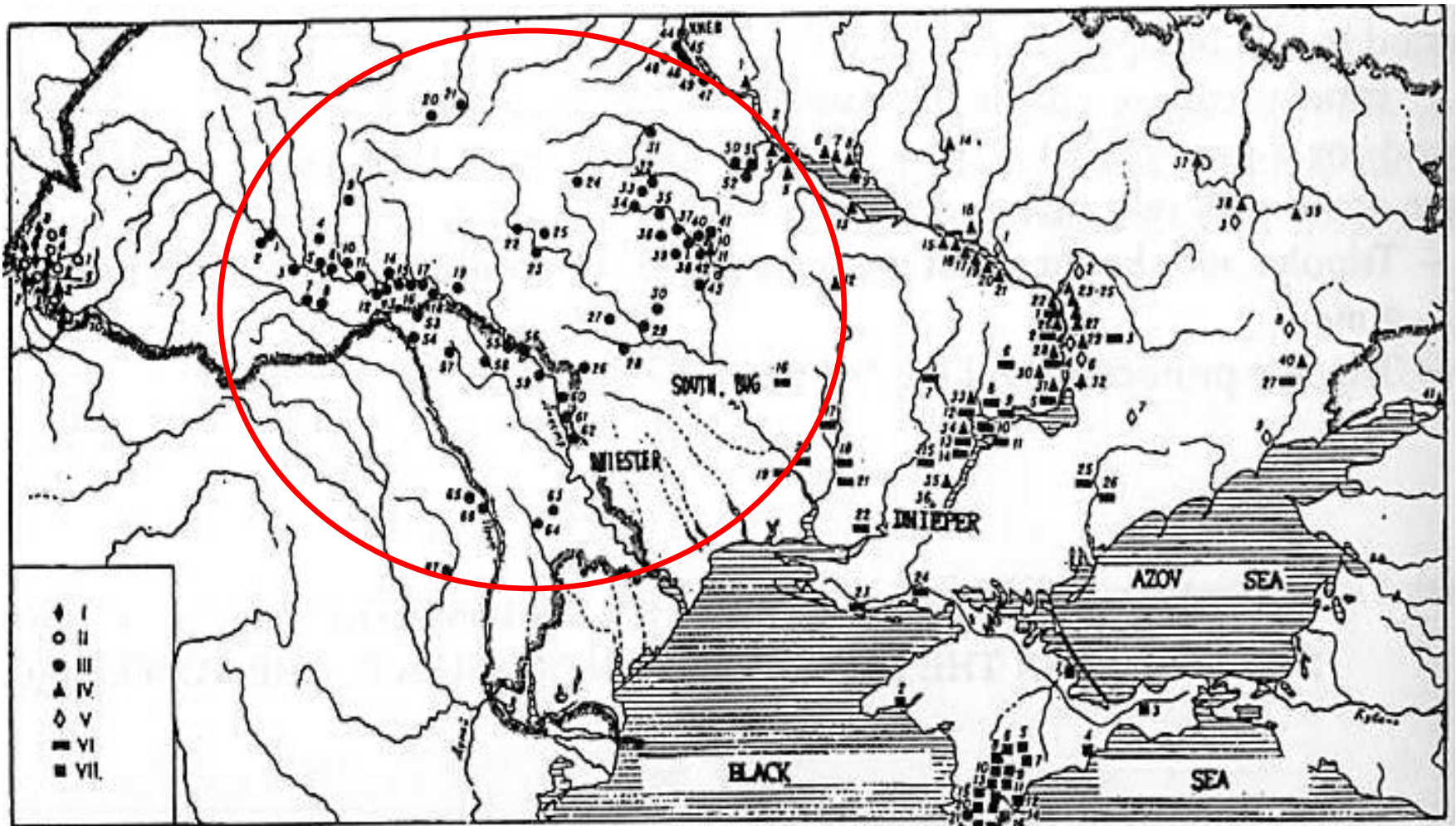
O = Tripolye A



Kadrow, Videiko et al, 1994

# Cucuteni-Tripolye Phase B

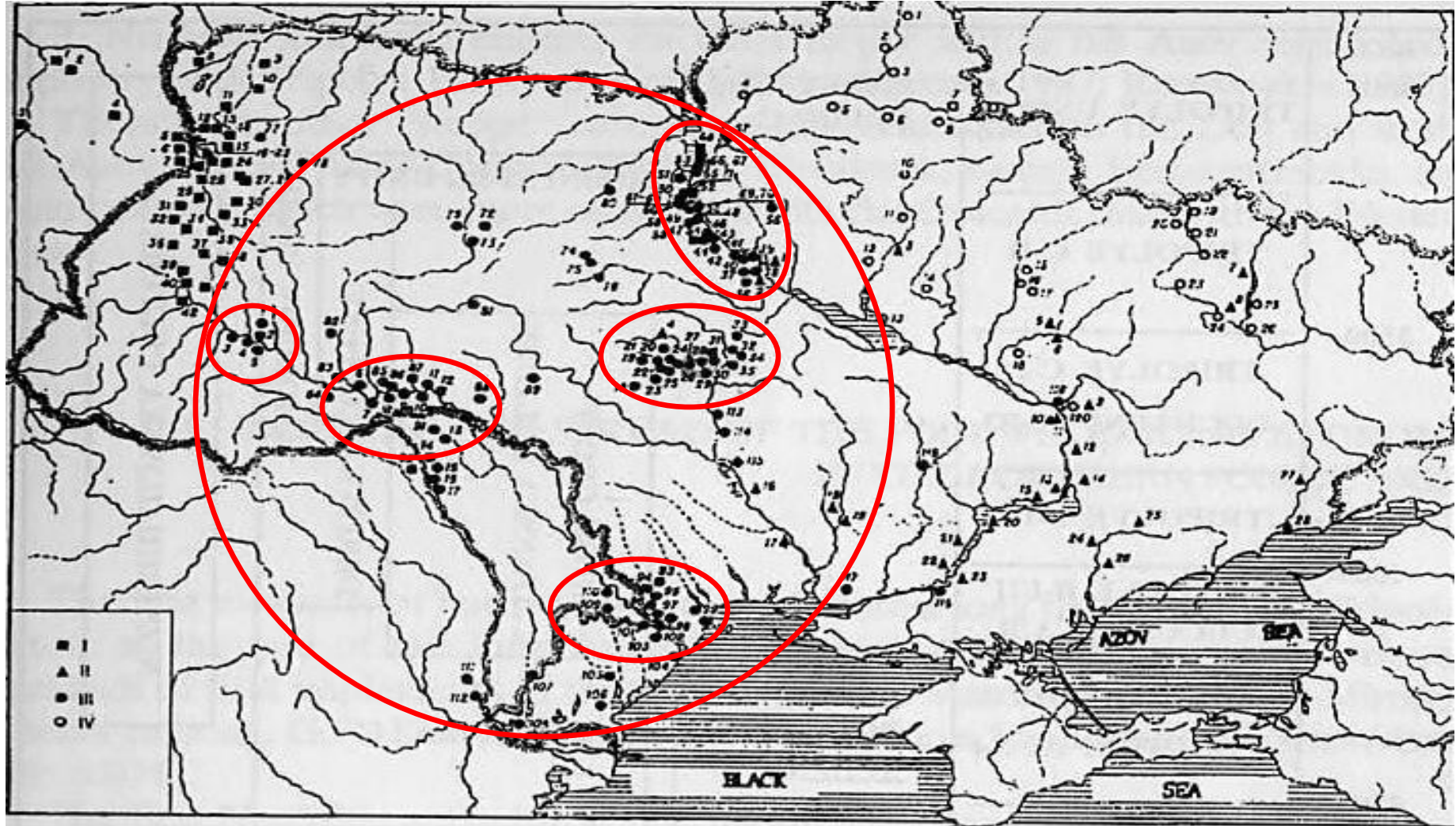
● = Tripolye B



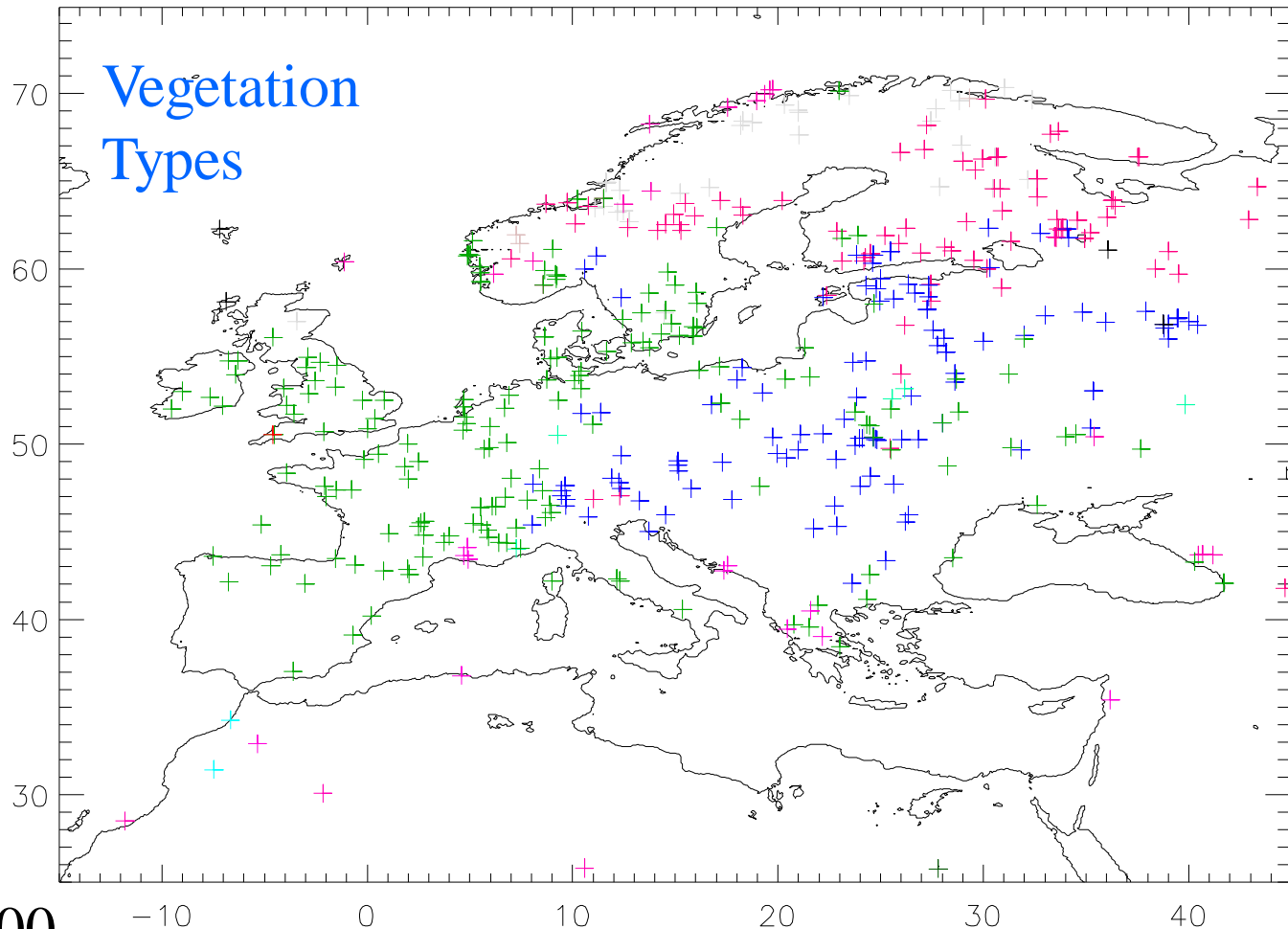


# Cucuteni-Tripolye Phase C

● = Tripolye C



# Further work: vegetation, soil type, nonlocal effects, ...





# Conclusion

Mathematical modelling of prehistory is feasible,

- but detailed models need to be developed,
- dominant environmental factors need to be identified
- and quantified,
- and methods need to be developed to compare the results with archaeological and radiometric data.

# Statistical screening of $^{14}\text{C}$ dates

- ❑ **Multiple  $^{14}\text{C}$  dates:** *need to isolate the most probable age*
- ❑ **Intrinsic statistical scatter in individual dates:** *need to obtain an accurate age estimate*
- ❑ **Multiple evolution phases at a given site:** *need to isolate and date individual phases*

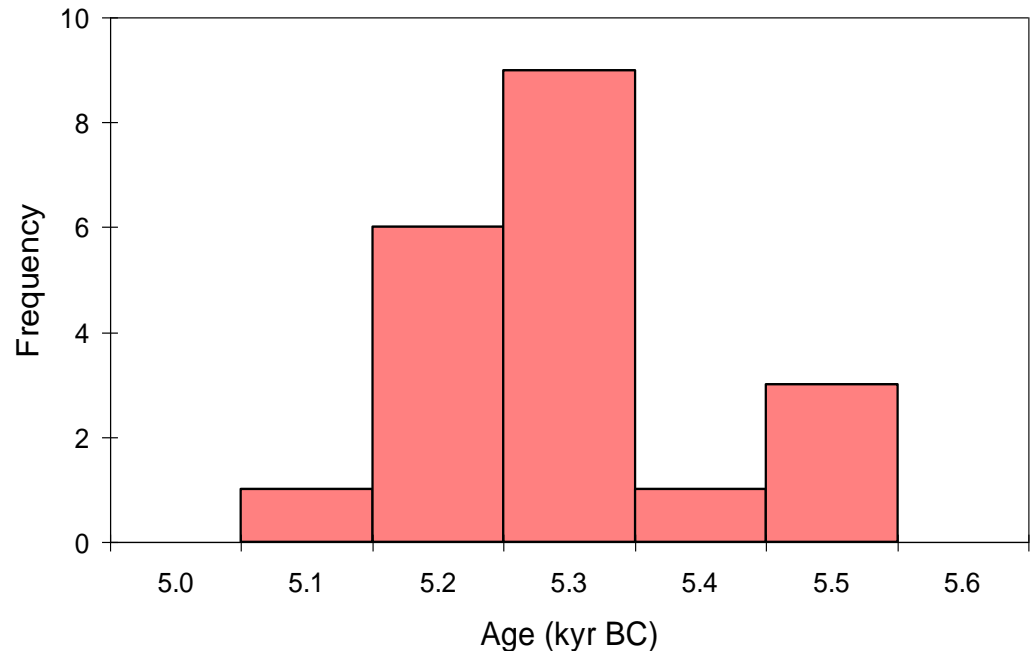
# Multiple $^{14}\text{C}$ dates for well-explored sites

(RADON Database, <http://www.jungsteinzeit.de/radon/radon.htm> )

ID Daten	KULTUR	FUNDORT	GEMEINDE	LABNR	BP	STD
182	LBK	Strzelce		GrN-5087	6260	60
183	LBK	Stúrovo		Bln-557	5565	120
184	LBK	Stúrovo		Bln-558	6170	100
185	LBK	Stúrovo		Bln-559	6260	100
186	LBK	Tomaszow		GrN-7050	5895	40
187	LBK	Ulm-Eggingen	Ulm	Hv-12982	5960	90
188	LBK	Ulm-Eggingen	Ulm	Hv-13594	5740	195
189	LBK	Ulm-Eggingen	Ulm	Hv-13595	5855	80
190	LBK	Ulm-Eggingen	Ulm	Hv-13596	6245	120
191	LBK	Ulm-Eggingen	Ulm	Hv-13597	5840	145
192	LBK	Ulm-Eggingen	Ulm	Hv-13598	5810	80
193	LBK	Ulm-Eggingen	Ulm	Hv-13599	5960	60
194	LBK	Ulm-Eggingen	Ulm	Hv-13600	6205	60
195	LBK	Ulm-Eggingen	Ulm	Hv-13601	5995	60
196	LBK	Ulm-Eggingen	Ulm	Hv-14721	5590	160

# Example: Brunn am Gebirge, Austria

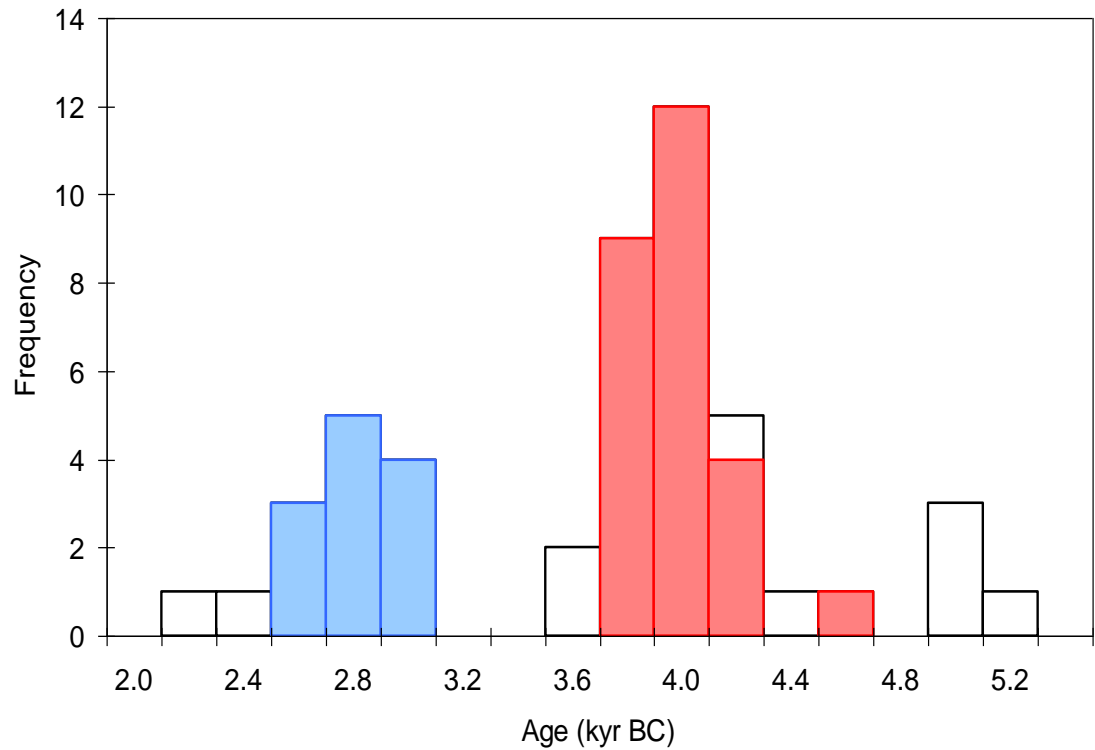
Compact cluster of 20 dates, interpreted as a single date contaminated by noise



- Most probable age:  $T_0 = 5252 \pm 99$  BC
- $\sigma = 100$  years adopted as the minimum error for LBK sites
- Fine temporal structure implied by archaeological evidence is not visible in  $^{14}\text{C}$  dates due to insufficient accuracy

# Example: Zedmar, Kaliningrad, Russia

48 dates in two clusters,  
interpreted as two dates  
(using the  $\chi^2$  test)



$T_0 = 3870 \pm 38$  BC,  $\sigma = 192$  years (26 dates)

$T_0 = 2770 \pm 76$  BC,  $\sigma = 179$  years (12 dates)

(minimum error 127 years suggested by similar sites)