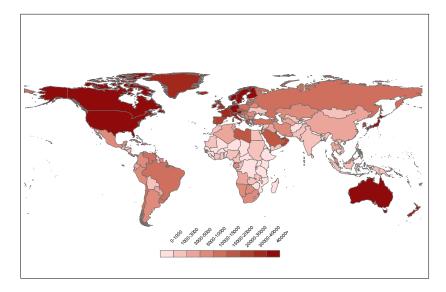
# Genetic Diversity and Comparative Development

# Ömer Özak

Department of Economics Southern Methodist University

## Economic Growth and Comparative Development

#### Income per Capita across the Globe in 2010



Ömer Özak

- What is the origin of the vast inequality in income per capita across countries and regions?
- What is the impact of deep-rooted factors on the observed patterns of comparative development?
- What fraction of the variation in income per capita across countries could be attributed to the long shadow of history?
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## • The Serial Founder Effect:

- Lower genetic diversity among indigenous populations at greater migratory distances from East Africa
- Existence of an optimal level of genetic diversity (for each stage of development)
  - Balances between:
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#### The Serial Founder Effect

#### • Exodus of modern humans from Africa (70-90K BP)

- Departing populations carry only a subset of the genetic diversity of their parental colonies
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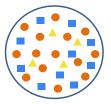
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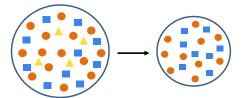
An Illustration of the Serial Founder Effect



#### 3 Alleles

**Original Population** 

#### An Illustration of the Serial Founder Effect



3 Alleles

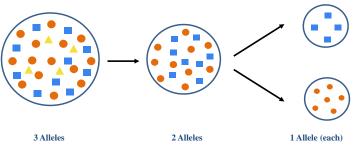
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2 Alleles Founder Population

Increasing Migratory Distance

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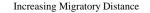
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**Original Population** 

Founder Population

Sub-founder Populations



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#### Genetic Diversity

## Genetic Diversity – Measurement

## • Expected Heterozygosity – Index of Genetic Diversity:

- The probability that two individuals, selected at random from a given population, are genetically different from one another (in a certain spectrum of genes)
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## • $H_{\lambda} \equiv$ Locus-specific heterozygosity:

• For a gene  $\lambda$  with  $k_{\lambda}$  alleles, where  $p_i^{\lambda}$  is the observed frequency of the *i*-th allele in gene  $\lambda$ :

$$H_{\lambda} = 1 - \sum_{i=1}^{k_{\lambda}} (p_i^{\lambda})^2$$

- $H \equiv$  Expected heterozygosity
  - Averaging over *m* genes:

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- The journey of humankind from Africa
- Consists of 53 ethnic groups (52 originally)
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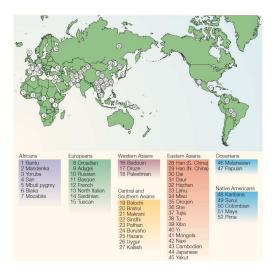
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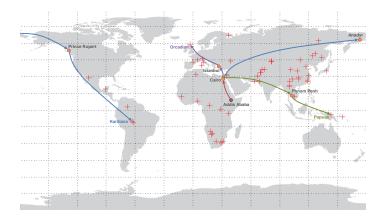
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#### **HGDP Ethnic Groups**



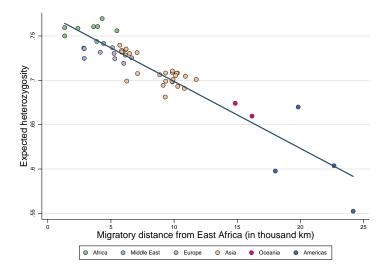
### The Spatial Distribution of the HGDP Ethnic Groups



+ Marks the location of an HGDP ethnic group.

o Marks an approximate critical juncture in the journey of humankind from Africa.

Migratory Distance from Africa and Genetic Diversity



- Expected heterozygosity calculated for the 53 ethnic groups in the HGDP using allelic frequencies for 783 microsatellite loci
- Advantage of using microsatellites a class of non-protein-coding regions of the human genome:
  - Selectively neutral
    - Ensures that the observed cross-sectional variation in diversity is not due to differential forces of natural selection
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    - Facilitates the construction of "population trees" and thus the genealogical and migratory histories of populations
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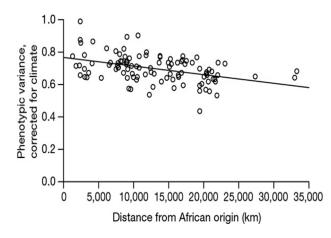
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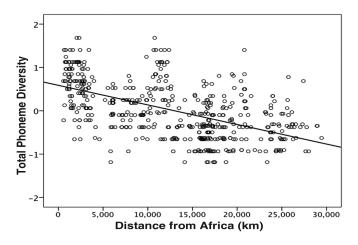
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### Distance from Africa and Craniometric Diversity



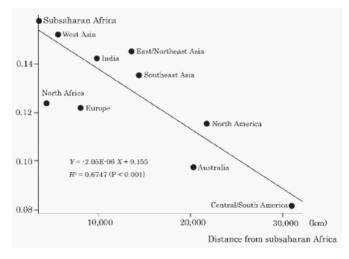
Source: Manica et al. (Nature 2007)

### Distance from Africa and Linguistic Diversity



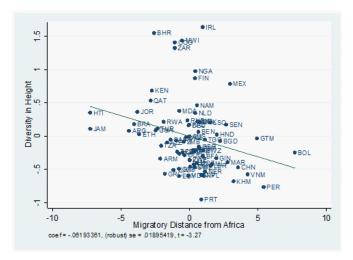
Source: Atkinson (Science 2011)

#### Distance from Africa and Dental Diversity



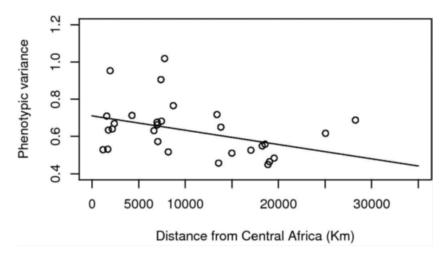
Source: Hanihara (American Journal of Physical Anthropology, 2008)

### Distance from Africa and Height Diversity



Source: Galor and Klemp (2014)

# Distance from Africa and Pelvic Bone Diversity



Source: Betti et al. (Human Biology, 2012)

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- Homogeneity on cohesiveness
  - A hump-shaped relationship between diversity and development
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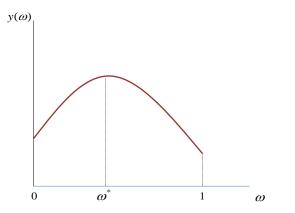
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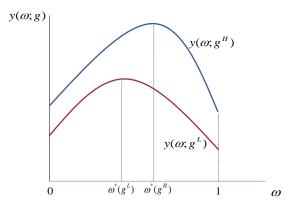
## The Optimal Level of Genetic Diversity



Ömer Özak

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The Rise in the Optimal Diversity - Faster Technological Progress



# Cross-country Analysis

- Pre-colonial era:
  - Observed genetic diversity (21 countries)
  - Projected diversity (145 countries)
- Contemporary analysis:
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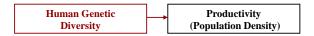
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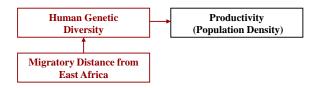
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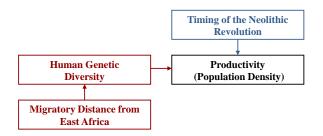
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  - Productivity is captured by population density (Malthusian Epoch)
  - Disentangle effects of:
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    - Geographic Factors: Land productivity, Absolute latitude
    - Time elapsed since the Neolithic Revolution

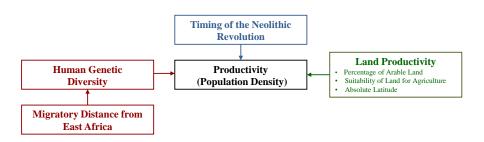
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Productivity (Population Density)

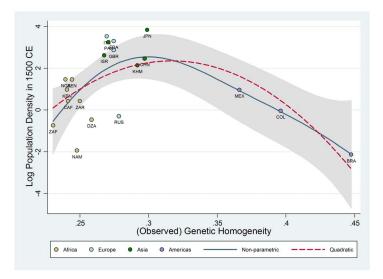








#### Observed Diversity and Development in 1500: Unconditional Relationship



# • Testing the hypothesis using observed genetic diversity from the HGDP

- 21-country sample
- Empirical specification

- $P_{it} \equiv$  population density in country *i* in year t
- $G_i \equiv actual$  genetic diversity of country *i*
- $T_i \equiv$  years elapsed since the Neolithic Revolution (NR) for country *i*
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#### Actual Diversity and Comparative Development in 1500

	(1)	(2)	(3)	(4)	(5)	
	Dependent Variable: Log Population Density in 1500					
Genetic Diversity	413.51***			225.44***	203.82*	
	(97.32)			(73.78)	(97.64)	
Genetic Diversity Sqr.	-302.65***			-161.16**	-145.72	
	(73.34)			(56.16)	(80.41)	
Log Years since NR		2.40***		1.21***	1.14	
		(0.27)		(0.37)	(0.66)	
Log % of Arable Land			0.73**	0.52***	0.55*	
			(0.28)	(0.17)	(0.26)	
Log Absolute Latitude			0.15	-0.16	-0.13	
			(0.18)	(0.13)	(0.17)	
Log Agri. Suitability			0.73*	0.57*	0.59	
			(0.38)	(0.29)	(0.33)	
Optimal Diversity	0.683			0.699	0.699	
	(0.008)			(0.015)	(0.055)	
Continent Dummies	No	No	No	No	Yes	
Observations	21	21	21	21	21	
R-squared	0.42	0.54	0.57	0.89	0.90	

Robust standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

#### Migratory Distance from East Africa vs. Genetic Diversity

	(1)	(2)	(3)	(4)	(5)	
	Dependent Variable: Log Population Density in 1500					
Genetic Diversity	417.003*** (90.909)			300.978*** (76.371)	361.421** (121.429)	
Genetic Diversity Sqr.	-306.218*** (68.308)			-241.755*** (61.099)	-268.515*** (87.342)	
Migratory Distance		0.463*** (0.142)		-0.003 (0.178)		
Migratory Distance Sqr.		-0.021*** (0.006)		-0.010 (0.009)		
Mobility Index			0.353** (0.127)		0.051 (0.154)	
Mobility Index Sqr.			-0.012*** (0.004)		-0.003 (0.006)	
Observations	18	18	18	18	18	
R-squared	0.43	0.30	0.30	0.47	0.43	
P-value for:						
Joint Sig. of Diversity Joint Sig. of Distance				0.006 0.320	0.027	
Joint Sig. of Mobility a					0.905	

Robust standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

## • Testing the hypothesis using projected genetic diversity

- 145-country sample
- Empirical specification

- $P_{it} \equiv$  population density of country *i* in year t
- $\hat{G}_i \equiv$  genetic diversity of country *i* projected by migratory distance
- $T_i \equiv$  years elapsed since the Neolithic Revolution (NR) for country *i*
- $X_i \equiv$  vector of land productivity controls for country *i*
- $\Delta_j \equiv$  vector of continental dummies for country  $\mu$
- $\varepsilon_{it} \equiv$  a country-year specific error term for country *i*

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  - 145-country sample
- Empirical specification

 $\ln P_{it} = \beta_{0t} + \beta_{1t}\hat{G}_i + \beta_{2t}\hat{G}_i^2 + \beta_{3t}\ln T_i + \beta'_{4t}\ln X_i + \beta'_{5t}\ln\Delta_i + \varepsilon_{it}$ 

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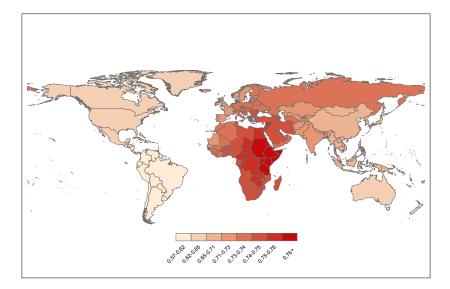
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# Projected Genetic Diversity across Countries in the Pre-Colonial Era



Ömer Özak

Genetic Diversity and Development

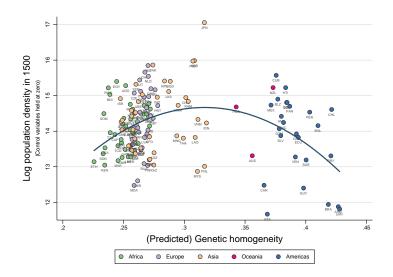
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## Predicted Diversity and Comparative Development in 1500

	(1)	(2)	(3)	(4)	(5)	(6)	
	Dependent Variable is Log Population Density in 1500						
Predicted Diversity	250.99***		213.54***	203.02***	195.42***	199.73**	
	(68.26)		(63.50)	(61.05)	(56.09)	(80.51)	
Predicted Diversity Sqr.	-177.40***		-152.11***	-141.98***	-137.98***	-146.17***	
	(50.22)		(46.65)	(44.83)	(40.84)	(56.26)	
Log Years since NR		1.29***	1.05***		1.16***	1.24***	
-		(0.18)	(0.19)		(0.15)	(0.24)	
Log % of Arable Land				0.52***	0.40***	0.39***	
				(0.12)	(0.09)	(0.10)	
Log Absolute Latitude				-0.17*	-0.34***	-0.42***	
-				(0.09)	(0.09)	(0.12)	
Log Agri. Suitability				0.19	0.31***	0.26***	
				(0.12)	(0.10)	(0.10)	
Optimal Diversity	0.707		0.702	0.715	0.708	0.683	
. ,	(0.021)		(0.025)	(0.110)	(0.051)	(0.110)	
Continent Dummies	No	No	No	No	No	Yes	
Observations	145	145	145	145	145	145	
R-squared	0.22	0.26	0.38	0.50	0.67	0.69	

Bootstrap standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

### Predicted Diversity and Comparative Development in 1500



# • Optimal GD in 1500 = 0.6832 pprox GD in Japan = 0.6835

- Increasing GD of the most homogeneous population in South America by:
  - 0.11  $\implies$  6-fold increase in population density in 1500
  - 0.01  $\implies$  44% increase in population density in 1500
- Decreasing GD of the most heterogeneous population in East Africa by:
  - 0.09  $\implies$  3-fold increase in population density in 1500
  - ullet 0.01  $\implies$  18% increase in population density in 1500
- 0.01 change from the optimal level of GD
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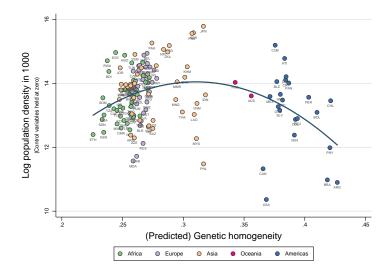
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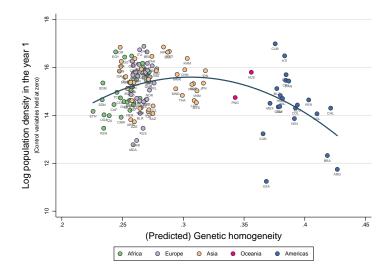
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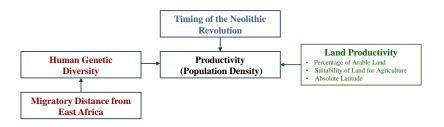
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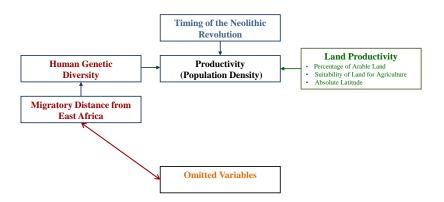
### Predicted Diversity and Comparative Development in 1000 CE

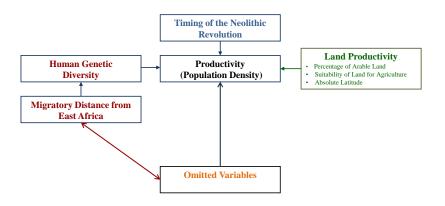


### Predicted Diversity and Comparative Development in 1 CE

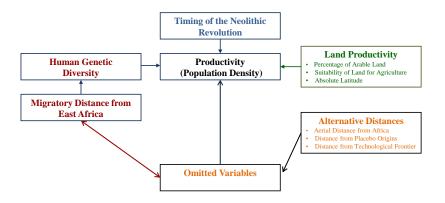








# The Role of Omitted Variables - Alternative Distances



## Robustness: Distances from Placebo Origins

	(1)	(2)	(3)	(4)	(5)	
	Dependent Variable: Log Population Density in 1500					
Distance calculated from:	Addis Ababa	Addis Ababa	London	Tokyo	Mexico City	
Migratory Distance	0.138** (0.061)		-0.040 (0.063)	0.052 (0.145)	-0.063 (0.099)	
Migratory Distance Sqr.	-0.008*** (0.002)		-0.002	-0.006	0.005	
Aerial Distance		-0.008 (0.106)	. ,	. ,	. /	
Aerial Distance Sqr.		-0.005 (0.006)				
Log Years since NR	1.160*** (0.144)	1.158*** (0.138)	1.003*** (0.164)	1.047*** (0.225)	1.619*** (0.277)	
Log % of Arable Land	0.401*** (0.091)	0.488*** (0.102)	0.357*** (0.092)	0.532*** (0.089)	0.493*** (0.094)	
Log Absolute Latitude	-0.342*** (0.091)	-0.263*** (0.097)	-0.358*** (0.112)	-0.334*** (0.099)	-0.239*** (0.083)	
Log Agri. Suitability	0.305*** (0.091)	0.254** (0.102)	0.344*** (0.092)	0.178** (0.080)	0.261*** (0.092)	
Observations R-squared	145 0.67	145 0.59	145 0.67	145 0.59	145 0.63	

Robust standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

# Regional Technological Frontiers

City & Modern Location	Continent	Sociopolitical Entity	Period
Cairo, Egypt	Africa	Mamluk Sultanate	1500 CE
Fez. Morocco	Africa	Marinid Kingdom of Fez	1500 CE
London, UK	Europe	Tudor Dynasty	1500 CE
Paris, France	Europe	Valois-Orléans Dynasty	1500 CE
Constantinople, Turkey	Asia	Ottoman Empire	1500 CE
Peking, China	Asia	Ming Dynasty	1500 CE
Tenochtitlan. Mexico	Americas	Aztec Civilization	1500 CE
Cuzco. Peru	Americas	Inca Civilization	1500 CE
	Americas		1500 CE
Cairo, Egypt	Africa	Fatimid Caliphate	1000 CE
Kairwan, Tunisia	Africa	Berber Zirite Dynasty	1000 CE
Constantinople, Turkey	Europe	Byzantine Empire	1000 CE
Cordoba, Spain	Europe	Caliphate of Cordoba	1000 CE
Baghdad, Iraq	Asia	Abbasid Caliphate	1000 CE
Kaifeng, China	Asia	Song Dynasty	1000 CE 1000 CE
Tollan. Mexico	Americas	Classic Maya Civilization	1000 CE
Huari. Peru	Americas	Huari Culture	1000 CE
	Americas		1000 CL
Alexandria, Egypt	Africa	Roman Empire	1 CE
Carthage, Tunisia	Africa	Roman Empire	1 CE
Athens, Greece	Europe	Roman Empire	1 CE
Rome, Italy	Europe	Roman Empire	1 CE
Luoyang, China	Asia	Han Dynasty	1 CE
Seleucia, Iraq	Asia	Seleucid Dynasty	1 CE
Teotihuacán. Mexico	Americas	Pre-classic Maya Civilization	1 CE
Cahuachi. Peru	Americas	Nazca Culture	1 CE
Canuacin, i elu	Americas	Nazca Culture	I CL

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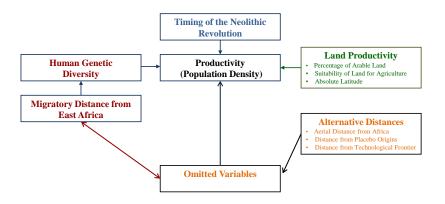
## Robustness to Distance from Regional Technological Frontiers

	(1)	(2)	(3)
	Log Population Density 1500 CE	Log Population Density 1000 CE	Log Population Density 1 CE
Predicted Diversity	156.74** (77.98)	183.77** (91.20)	215.86** (106.50)
Predicted Diversity Sqr.	-114.63** (54.67)	-134.61** (63.65)	-157.72** (74.82)
Log Years since NR	Yes	Yes	Yes
Land Prod. Controls	Yes	Yes	Yes
Log Distance to Frontier in 1500 CE	-0.19*** (0.07)		
Log Distance to Frontier in 1000 CE		-0.23** (0.11)	
Log Distance to Frontier in 1 CE		, , ,	-0.30*** (0.10)
Optimal Diversity	0.684 (0.169)	0.683 (0.218)	0.684 (0.266)
Continent Dummies	Yes	Yes	Yes
Observations	145	140	126
R-squared	0.72	0.64	0.66

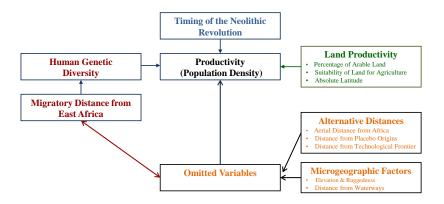
Bootstrap standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

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# The Role of Omitted Variables – Microgeographic Factors



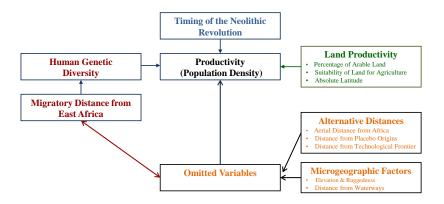
## Robustness to Microgeographic Factors

	(1)	(2)	(3)	(4)	(5)	
	Dependent Variable: Log Population Density in 1500					
Predicted Diversity	159.92*** (56.00)	153.20*** (53.39)	157.07** (78.82)	150.02*** (49.36)	157.06** (68.61)	
Predicted Diversity Sqr.	-110.39*** (41.08)	-105.33*** (39.11)	-112.78** (55.48)	-102.76*** (36.23)	-114.99** (48.26)	
Log Years since NR	Yes	Yes	Yes	Yes	Yes	
Land Prod. Controls	Yes	Yes	Yes	Yes	Yes	
Mean Elevation	-0.48** (0.23)			0.51* (0.27)	0.50* (0.27)	
Roughness	5.15*** (1.77)			3.09* (1.74)	4.08** (1.84)	
Roughness Sqr.	-7.05** (3.11)			-7.05** (2.96)	-7.63*** (2.91)	
Distance to Nearest Waterway		-0.49*** (0.18)	-0.44** (0.18)	-0.47** (0.18)	-0.39** (0.18)	
% Land within 100 km of Waterway		0.70** (0.28)	0.73** (0.31)	1.11*** (0.29)	1.18*** (0.29)	
Optimal Diversity	0.724 (0.201)	0.727 (0.190)	0.696 (0.187)	0.730 (0.229)	0.683 (0.095)	
Continent Dummies	No	No	Yes	No	Yes	
Observations	145	145	145	145	145	
R-squared	0.69	0.74	0.75	0.76	0.78	

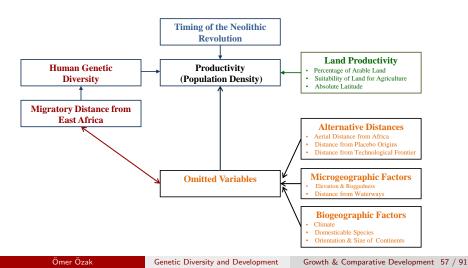
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# The Role of Omitted Variables – Biogeography



### Robustness to Biogeography

	(1)	(2)	(3)	(4)	(5)	
	Dependent Variable is Log Population Density in 1500					
Predicted Diversity	216.85*** (62.06)	252.08*** (70.81)	174.41*** (62.75)	212.12*** (72.13)	274.92*** (72.12)	
Predicted Diversity Sqr.	-154.75*** (45.19)	-180.65*** (51.89)	-125.14*** (45.72)	-151.58*** (52.79)	-197.12*** (52.40)	
Log Years since NR	1.30*** (0.16)				1.16*** (0.31)	
Land Prod. Controls	Yes	Yes	Yes	Yes	Yes	
Climate		0.62*** (0.14)		0.42 (0.27)	0.37* (0.22)	
Orientation of Axis		0.28 (0.33)		0.04 (0.30)	-0.17 (0.27)	
Size of Continent		-0.01 (0.02)		-0.01 (0.01)	-0.01 (0.01)	
Domesticable Plants			0.02 (0.02)	-0.01 (0.02)	0.00 (0.02)	
Domesticable Animals			0.15** (0.06)	0.12 (0.07)	-0.01 (0.07)	
Optimal Diversity	0.701 (0.123)	0.698 (0.016)	0.697 (0.159)	0.700 (0.045)	0.697 (0.041)	
Observations	96	96	96	96	96	
R-squared	0.74	0.70	0.70	0.72	0.78	

Bootstrap standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

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Genetic Diversity and Development

# Robustness to the Use of Urbanization Rates in 1500

	(1)	(2)	(3)	(4)	(5)
	Dependent Variable: Log Urbanization Rate in 1500				
Predicted Diversity	120.583** (51.618)	165.167*** (50.088)	93.467* (48.769)	148.757*** (48.373)	234.410*** (67.321)
Predicted Diversity Square	-84.760** (38.423)	-120.124*** (37.208)	-62.408* (36.650)	-106.165*** (36.506)	-166.786*** (48.780)
Log Years since NR		0.457** (0.224)		0.402** (0.202)	0.752*** (0.257)
Log % of Arable Land			-0.097** (0.043)	-0.116*** (0.044)	-0.119** (0.052)
Log Absolute Latitude			-0.334** (0.151)	-0.236 (0.155)	-0.151 (0.170)
Log Agri. Suitability			0.002 (0.057)	-0.036 (0.058)	0.031 (0.059)
Continent Dummies	No	No	No	No	Yes
Observations	80	80	80	80	80
R-squared	0.30	0.35	0.40	0.44	0.51

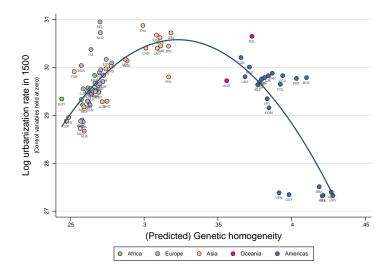
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# Genetic Diversity and Urbanization Rates in 1500



# • The index of contemporary genetic diversity captures:

- Proportional representation of each ancestral population within a country
- Genetic diversity among the ancestral populations of each country
  - Projected based on migratory distance of this ancestral population from East Africa
- Genetic distance between all pairs of ancestral populations of each country
  - Projected based on migratory distance between these ancestral populations

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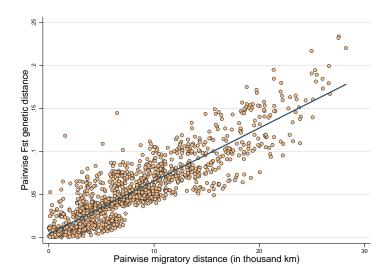
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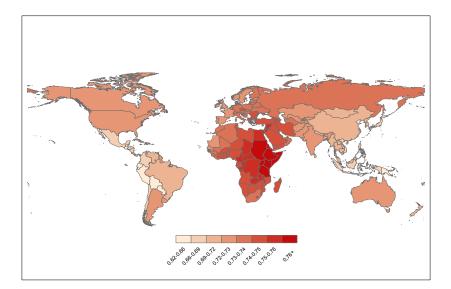
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#### Genetic Distance



## Genetic Diversity across Countries in 2000



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Genetic Diversity and Development

# • Testing the hypothesis using contemporary genetic diversity

- 145-country sample
- Empirical specification

 $\ln y_i = \gamma_0 + \gamma_1 \hat{G}_i + \gamma_2 \hat{G}_i^2 + \gamma_3 \ln T_i + \gamma'_4 \ln X_i + \gamma'_5 \ln \Lambda_i + \gamma_6 \ln \Gamma_i + \eta_i$ 

- $y_i \equiv$  income per capita of country *i* in the year 2000
- $G_i \equiv$  index of contemporary genetic diversity of country *i*
- $T_i \equiv$  years elapsed since the Neolithic Revolution (NR) for country *i*
- $X_i \equiv$  vector of land productivity controls for country *i*
- $\Lambda_i \equiv$  vector of institutional and cultural controls for country *i*
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- $\eta_i \equiv$  error term for country *i*

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  - 145-country sample
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#### Genetic Diversity and Economic Development in 2000 and 1500

	(1)	(2)	(3)	(4)
	Lo	og Income per Ca in 2000	Log Population Densit in 1500	
Adjusted Diversity	204.610** (88.466)	237.238*** (86.278)	244.960*** (85.454)	
Adjusted Diversity Sqr.	-143.437** (62.545)	-166.507*** (61.363)	-171.364*** (60.843)	
Unadjusted. Diversity			(*****)	198.587** (79.110)
Unadjusted. Diversity Sqr.				-145.320*** (55.472)
Log Adj. Years since NR		0.061 (0.262)	0.002 (0.305)	
Log Years since NR	-0.151 (0.186)			1.238*** (0.230)
Log % of Arable Land	-0.110 (0.100)	-0.119 (0.107)	-0.137 (0.111)	0.378*** (0.100)
Log Absolute Latitude	0.164 (0.125)	0.172 (0.119)	0.192 (0.143)	-0.423*** (0.124)
Log Agri. Suitability	-0.193** (0.095)	-0.177* (0.102)	-0.189* (0.102)	0.264*** (0.096)
Log Population Density in 1500			0.047 (0.097)	
Optimal Diversity	0.713 (0.100)	0.712 (0.036)	0.715 (0.118)	0.683 (0.095)
Continent Dummies	Yes	Yes	Yes	Yes
Observations R-squared	143 0.57	143 0.57	143 0.57	143 0.68

Bootstrap standard errors in parentheses; \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

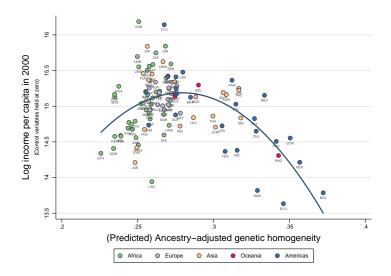
# Genetic Diversity and Comparative Development in 2000

	(1)	(2)	(3)	(4)	(5)			
	Dependent Variable: Log Income per Capita in 2000							
Adjusted Diversity	315.282*** (84.215)	225.858*** (67.669)	204.102*** (66.984)	277.342*** (70.232)	215.675*** (63.954)			
Adjusted Diversity Sqr.	-220.980*** (59.562)	-155.826*** (47.962)	-140.850*** (47.393)	-192.386*** (49.675)	-150.871*** (45.554)			
Log Adj. Time from NR	-0.273 (0.269)	-0.092 (0.200)	-0.062 (0.203)	0.396*	-0.046 (0.208)			
Log % of Arable Land	-0.218*** (0.061)	-0.159*** (0.049)	-0.163*** (0.050)	-0.183*** (0.051)	-0.084 (0.056)			
Log Absolute Latitude	0.123 (0.122)	0.083 (0.100)	0.080 (0.101)	0.009 (0.108)	-0.006 (0.087)			
Social Infrastructure		2.359*** (0.269)	2.069*** (0.377)	1.826*** (0.417)	0.880** (0.418)			
Democracy			0.036 (0.029)					
Ethnic Fractionalization			. ,	-0.333 (0.280)	-0.122 (0.265)			
% Population at Risk of Contracting Malaria				-0.502 (0.351)	-0.723** (0.353)			
Avg. Schooling					0.134*** (0.042)			
Optimal Diversity	0.713 (0.014)	0.725 (0.032)	0.725 (0.045)	0.721 (0.008)	0.715 (0.073)			
Continent Dummies	Yes	Yes	Yes	Yes	Yes			
Legal Origin Dummies	No	No	No	Yes	Yes			
Major Religion Shares	No	No	No	Yes	Yes			
Observations	109	109	109	109	94			
R-squared	0.74	0.84	0.85 *** p<0.01, ** p<	0.90	0.93			

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Genetic Diversity and Development

#### Genetic Diversity and Comparative Development in 2000



 $\bullet$  Optimal GD in 2000 = 0.7208  $\approx$  GD in US = 0.7206

• Increasing GD of Bolivia (0.63), the most homogeneous country, by:

• 0.09  $\implies$  5.4-fold increase income per capita in 2000

 $\sim$  From 9% to 40% of that of the US .

•  $0.01 \implies 39\%$  increase income per capita in 2000

• Decreasing GD of Ethiopia (0.77), the most heterogeneous country, by:

ullet 0.05  $\implies$  1.7-fold increase in income per capita in 2000

From 2% to 4% of that of the US

- 0.01  $\implies$  21% increase in income per capita in 2000
- 0.01 change from the optimal level of GD

- Optimal GD in 2000 = 0.7208  $\approx$  GD in US = 0.7206
- Increasing GD of Bolivia (0.63), the most homogeneous country, by:

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- Increasing GD of Bolivia (0.63), the most homogeneous country, by:
  - 0.09  $\implies$  5.4-fold increase income per capita in 2000
    - From 9% to 40% of that of the US
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   0.05 => 1.7-fold increase in income per capita in 2000
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# Addressing Endogenous Post-1500 Migrations

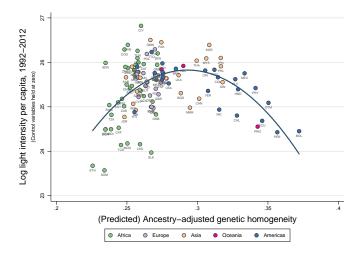
	(1)	(2)	(3)	(4)	(5)	(6)				
	Full	Non	w/o Neo	w/o Latin	w/o Sub	>0.97				
	Sample	OECD	Europes	America	Sahara	Indigenous				
	Dependent Variable is Log Income per Capita in 2000									
Adjusted Diversity	277.342***	271.979***	261.367***	412.222***	264.805**	304.735**				
	(70.232)	(88.479)	(70.533)	(148.584)	(111.365)	(111.588)				
Adjusted Diversity Sqr.	-192.386***	-188.974***	-181.811***	-287.067***	-183.863**	-213.389**				
	(49.675)	(62.096)	(49.671)	(101.906)	(80.398)	(77.255)				
Log Adj. Time of NR	0.396*	0.390	0.355	0.518*	0.068	0.448*				
	(0.233)	(0.281)	(0.231)	(0.298)	(0.442)	(0.254)				
Log % of Arable Land	-0.183***	-0.236***	-0.201***	-0.189 <sup>***</sup>	-0.211**	-0.104				
	(0.051)	(0.060)	(0.055)	(0.050)	(0.097)	(0.061)				
Log Absolute Latitude	0.009 (0.108)	-0.021 (0.119)	-0.025 (0.111)	-0.139 (0.126)	0.218 (0.242)	-0.074 (0.130)				
Social Infrastructure	1.826***	1.313**	1.416***	2.044***	1.585***	1.311*				
	(0.417)	(0.579)	(0.507)	(0.545)	(0.486)	(0.716)				
Ethnic Frac.	-0.333	-0.437	-0.390	-0.752**	0.104	-0.044				
	(0.280)	(0.375)	(0.300)	(0.348)	(0.408)	(0.412)				
% Population at Risk	-0.502	-0.605	-0.591	-0.308	-0.425	-0.153				
of Malaria	(0.351)	(0.381)	(0.370)	(0.486)	(0.581)	(0.434)				
% Population Living	-0.319	-0.196	-0.302	-0.520**	-0.528	-0.339				
in Tropical Zones	(0.204)	(0.239)	(0.219)	(0.252)	(0.341)	(0.312)				
Optimal Diversity	0.721	0.720	0.719	0.718	0.720	0.714				
	(0.083)	(0.085)	(0.015)	(0.023)	(0.180)	(0.012)				
Observations	109	83	105	87	71	37				
R-squared	0.90	0.82	0.89	0.93	0.86	0.98				

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Genetic Diversity and Development

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## Genetic Diversity and Light Intensity per Capita 1992-2012



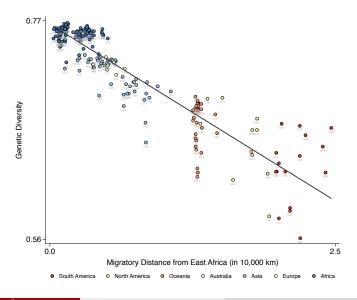
Source: Ashraf-Galor-Klemp (2014)

# Observed Genetic Diversity - 232 Ethnic Groups

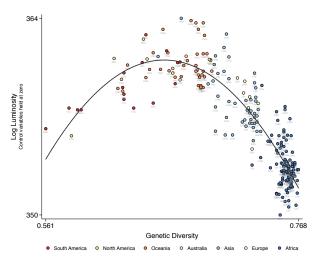


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Migratory Distance from Africa and Genetic Diversity



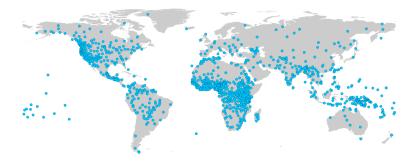
# Genetic Diversity and Productivity of Ethnic Group - (IV Regressions)



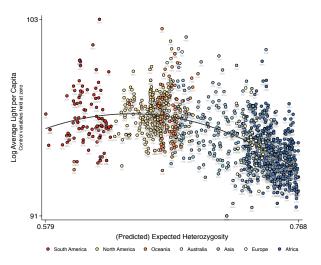
Source: Ashraf-Galor-Klemp (2015)

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## Predicted Genetic Diversity - 1331 Ethnic Groups



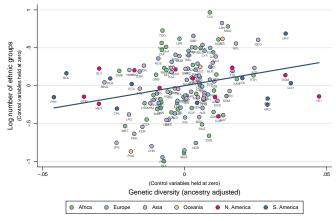
#### Predicted Genetic Diversity - 1331 Ethnic Groups



Source: Ashraf-Galor-Klemp (2015)

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#### Cost of Diversity: Genetic Diversity & Cultural Fragmentation

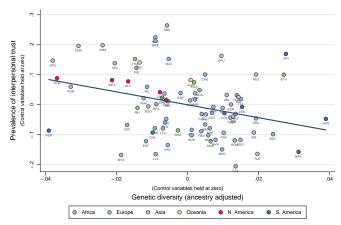


Relationship conditional on historical and geographical controls, as well as continent fixed effects Slope coefficient = 6.397; (robust) standard error = 1.973; t-statistic = 3.242; partial R-squared = 0.059; observations = 144

Source: Ashraf and Galor (2013b)

Source: Ashraf-Galor (AER, May 2013)

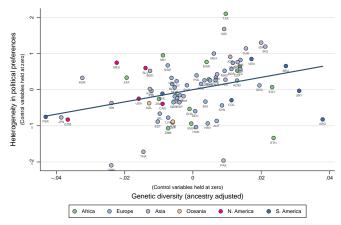
#### Cost of Diversity: Genetic Diversity & Trust



Relationship conditional on geographical controls and region fixed effects Slope coefficient = -2.151; (robust) standard error = 0.756; t-statistic = -2.845; partial R-squared = 0.105; observations = 84

Slope coefficient = -2.151; (robust) standard error = 0.756; 1-statistic = -2.846; partial R-squared = 0.105; observations = 6

# Cost of Diversity: Genetic Diversity & Heterogeneity in Preferences

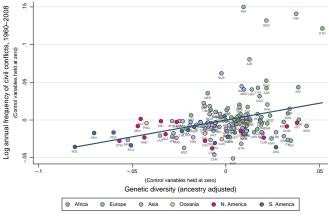


Relationship conditional on geographical controls and region fixed effects

Slope coefficient = 16.963; (robust) standard error = 5.954; t-statistic = 2.849; partial R-squared = 0.111; observations = 81

Source: Arbatli, Ashraf, and Galor (2015)

## Cost of Diversity: Genetic Diversity & Ethnic Civil Conflict



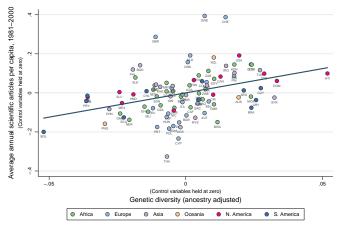
Relationship conditional on geographical cont

Slope coefficient = 0.445; (robust) standard error = 0.117; t-statistic = 3.790; partial R-squared = 0.112; observations = 151

Source: Arbatli, Ashraf, and Galor (2015)

Source: Arbatli-Ashraf-Galor-Klemp (2016)

#### Benefits of Diversity - Genetic Diversity & Scientific Research



Relationship conditional on historical, geographical, and institutional controls, as well as continent fixed effects Sloce coefficient = 2.484: (robust) standard error = 0.511: 1-statistic = 4.884: partial R-squared = 0.131: observations = 93

Slope coefficient = 2.484; (robust) standard error = 0.511; t-statistic = 4.864; partial R-squared = 0.131; observations = Source: Ashraf and Galor (2013a)

- The distribution of genetic diversity across the globe
- Comparative economic development
  - Accounts for 16% of the variation in the income per capita across countries
- Variation in the onset of the Neolithic Revolution
  - Affected comprative developmemt till around 1500
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- Diversity adversely affects the cohesiveness of society, increasing the incidence of:
  - Mistrust (Ashraf-Galor, AER 2013)
  - Civil conflicts (Arbatli-Ashraf-Galor, 2015)
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## Education policy

- In overly-diverse societies:
  - Education geared towards: social cohesiveness & tolerance
     Mitigating the cost of diversity
- In overly-homogeneous societies:
  - cultivation of cultural diversity
  - $\implies$  substitute for low genetic diversity
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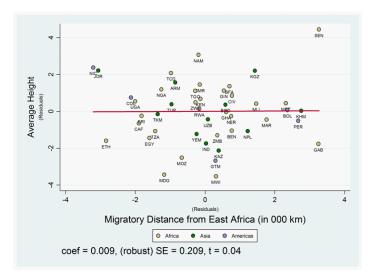
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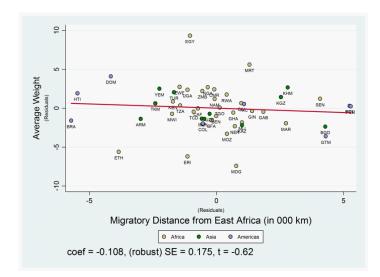
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#### Migratory Distance from East Africa and Height



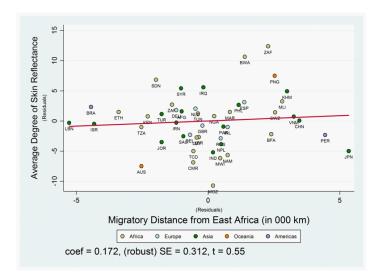
Accounting for distance from the equator.

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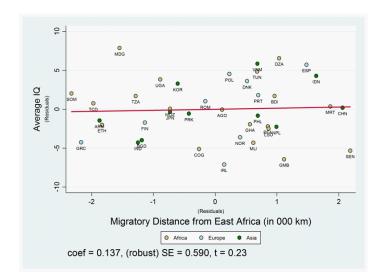
Accounting for distance from the equator.

#### Migratory Distance from East Africa and Skin Reflectance



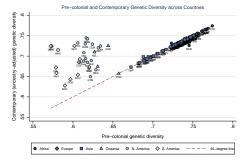
Accounting for distance from the equator.

# Migratory Distance from East Africa and IQ



Accounting for distance from the equator.

#### The Impact of Post-1500 Migrations on Genetic Diversity



Correlation in the global sample = 0.750; correlation in the Old-World sample = 0.993

# Theoretical Foundations of the Hump-Shaped Effect of Diversity

$$y = (1 - \alpha \omega) A(z, \omega) f(x) \equiv y(\omega); \qquad \alpha \in (0, 1)$$

# • $y \equiv$ output per capita

- $A(z, \omega) \equiv$  technological level
- $\omega \in [0,1] \equiv$  degree of diversity
- $z \equiv$  institutional, geographical, and human capital factors
- $f(x) \equiv$  production function
- $x \equiv$  inputs per capita

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• Diversity and TFP growth

$$egin{aligned} & A(z,\omega) > 0, \ A_{\omega}(z,\omega) > 0, \ A_{\omega\omega}(z,\omega) < 0 \ & \lim_{\omega \longrightarrow 0} A_{\omega}(z,\omega) = \infty; \ \lim_{\omega \longrightarrow 1} A_{\omega}(z,\omega) = 0 \end{aligned}$$

• For instance:

$$A(z,\omega) = z \int_0^\omega \omega_i^\theta di \qquad \theta \in (0,1)$$

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• Properties of  $y(\omega)$ 

$$y'(\omega) = [(1 - \alpha\omega)A_{\omega}(z, \omega) - \alpha A(z, \omega)]f(x)$$
$$y''(\omega) = [(1 - \alpha\omega)A_{\omega\omega}(z, \omega) - 2\alpha A_{\omega}(z, \omega)]f(x) < 0$$
$$\lim_{\omega \longrightarrow 0} y'(\omega) > 0; \quad \lim_{\omega \longrightarrow 1} y'(\omega) < 0$$