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Population, Population Density, and Technological Change

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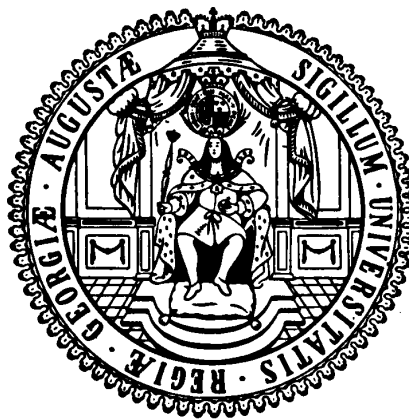
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**Population, Population Density,
and Technological Change**

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October 2004

Population, Population Density, and Technological Change

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Abstract

In a model on population and endogenous technological change, Kremer combines a short-run Malthusian scenario where income determines the population that can be sustained, with the Boserupian insight that greater population spurs technological change and can therefore lift a country out of its Malthusian trap. We show that a more realistic version of the model, which combines population and population density, allows deeper insights into these processes. The incorporation of population density also allows a superior interpretation of the empirical regularities between the level of population, population density, population growth, and economic development, both at aggregated and disaggregated levels.

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1. Introduction

Economic views on the impact of population have been dominated by two paradigms. In the Malthusian paradigm, population growth that exceeds technological change ensures that societies are never able to escape subsistence levels of income. In the Boserupian paradigm which is also found in some versions of endogenous growth models, the level of population determines the pace of technological change and thus can help countries escape the Malthusian trap.

In a well-known article published in 1993, Michael Kremer combines these two paradigms to analyse the relationship between global population and population growth over the past one million years. In particular, he combines a Malthusian equation where a given income level determines the population that can be sustained, with a technological change equation which posits that the level of population positively influences technological change, can thus lift the income constraint, and consequently allow population growth to take place. This model predicts a linear relationship between the growth rate of population and its absolute level, and he shows that this highly stylised model can describe the empirical relationship between these two variables from earliest times up to about 1960 surprisingly well.

In various extensions to the model, Kremer addresses some of the unrealistic features of this basic formulation. These extensions allow for some populous countries having rather low technological levels, for roughly constant technological change, for falling global population growth rates after 1960, and for rising per capita incomes, all of which are features of the contemporary world.

In Kremer's framework, technological change is dependent on the absolute level of population and, in the extensions, additionally on the level of income and technology. We argue that it is more plausible to assume that technological change depends additionally on population *density*, as population density facilitates communication and exchange, increases the size of markets and the scope for specialisation, and creates the required demand for innovation, all of which should spur the creation and diffusion of new technologies (see also Becker et al. 1999).

Within the general framework of Kremer's model, we then extend the model by including population density as an additional factor influencing technological change. This extension not only is able to still explain all of the empirical regularities noted by Kremer, but does so more plausibly and generates additional insights into the interactions between population and technological change. It also provides a better explanation of differences in technological

levels between geographically separated regions and has more plausible policy implications. Lastly, data at a more a more disaggregated country or regional level show a clear correlation between population density and subsequent levels of per capita GDP, which cannot be easily accommodated in Kremer's original model but is consistent with our extension that includes population density.

The paper is structured as follows. First, the simple version and the most important extension of the Kremer model is presented. Then we incorporate our extension, the additional consideration of population density in a generalised version of the model. New insights will be highlighted and interpreted and implications for current research in development economics emphasised.

2. The basic model

Kremer's simple version of the model is based on two fundamental assumptions: The first stems from the idea that technology is a public good because it has the property of non-rivalry, and, as Romer (1990) points out, blueprints are –at least as an input for further research activities- non-excludable. In this simple version, Kremer also assumes that each person's research productivity is independent of population size. As a result, there are more inventors in larger populations. Combined with the public good character of technology, larger populations therefore exhibit higher growth rates of technology.

The second assumption is related to Thomas Malthus' famous 1798 essay on population. He observed that population grows geometrically whereas food production increases only arithmetically. Through a process of alternating subsistence crises, where famine kills a large share of the population, and subsequent phases of expanding population, population and food production are held in balance. The growth rate of population is thus limited by the state of food production, i.e. technological progress¹.

Combining the hypothesis that high population spurs technological change with the Malthusian view that technology determines population leads to the prediction that the growth rate of population is proportional to the size of population. Kremer finds empirical evidence for this prediction over most of human history.

¹ According to Galor and Weil (1999), most of human history was characterised by this "Malthusian Regime". Only in the last 200 years, humans were able to leave the subsistence level and to create and accumulate wealth.

Formally, output (Y) is generated in a Cobb-Douglas type production process. Land (T) and population (P) are used as inputs. The output level also depends on the current state of technology (A).²

$$(1) \quad Y = A * P^\alpha * T^{(1-\alpha)}, \quad \alpha > 0$$

After normalising T to one and dividing both sides by P, we obtain output per capita (y) as:

$$(1a) \quad y = A * P^{(\alpha-1)}$$

According to Malthus (1798), income per capita cannot exceed the subsistence level. In the case of good economic conditions, mortality would fall and more children would be born. An increase in output would therefore not lead to a rise in output per capita but to an increase in the size of the population. In this version of the model, Kremer assumes that this process of population adjusting to economic conditions occurs instantaneously. Per capita income can therefore be assumed as constant, implied by \bar{y} .

Equation (1a) can be solved for the equilibrium level of the population size P.

$$(2) \quad P = \left(\frac{\bar{y}}{A} \right)^{(1/\alpha-1)}$$

The following research equation (3) shows, that the chance to invent something new is dependent of population size, with each person having the same research productivity. The larger the level of population, the higher will thus be the growth rate of technology.

$$(3) \quad \frac{\dot{A}}{A} = P * g$$

with \dot{A}/A representing the growth rate of technology and g standing for research productivity per person.

In the next step we determine the growth rate of population. By assumption, the level of per capita income is constant, so its growth rate is equal to zero ($d \ln y(t) / dt = 0$). Taking logarithms in (2) leads to

$$(2a) \quad \ln(P) = \frac{1}{1-\alpha} (\ln(y) - \ln(A))$$

The growth rates are obtained by differentiating this term with respect to time. This leads to equation (4).

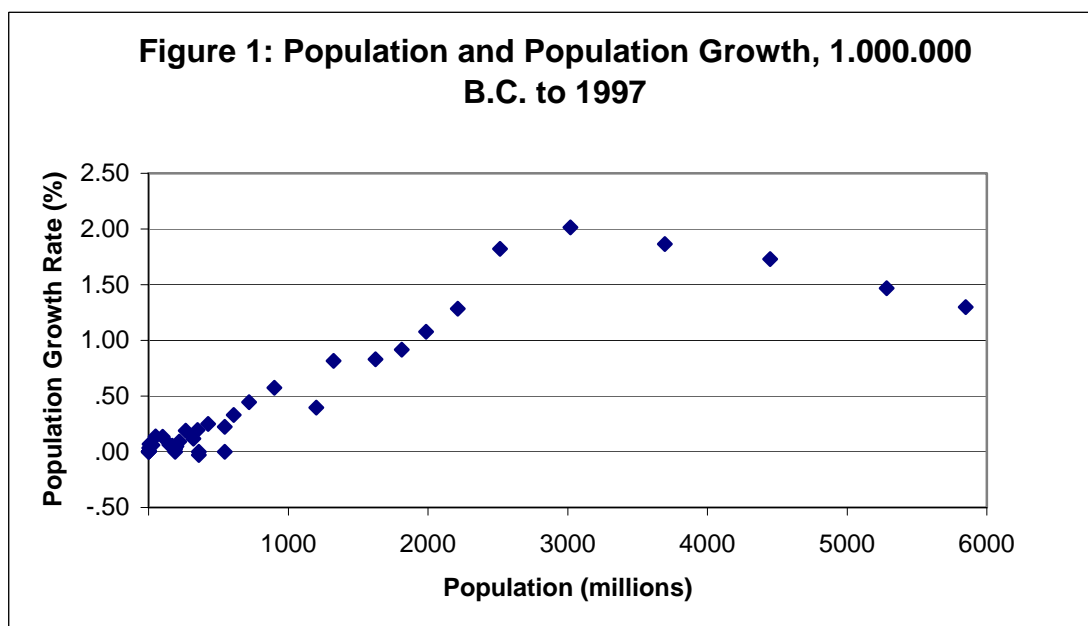
² Introducing capital in the production does not lead to further insights. For details, see Kremer (1993).

$$(4) \quad \frac{\dot{P}}{P} = \frac{1}{1-\alpha} * \frac{\dot{A}}{A}$$

Substituting \dot{A}/A from equation (3) in (4) shows the relationship between the growth rate of population and its size in (5).

$$(5) \quad \frac{\dot{P}}{P} = \frac{g}{1-\alpha} * P$$

This relationship between the growth rate of population and its size is shown in Figure 1. On the horizontal axis we plot the size of the world population for 1,000,000 B.C. until 1997. The vertical axis shows the corresponding average annual growth rate of the world's population in percent. Until about 1960 (when world population was about 3 billion), there appears to be a linear relationship between the two variables.³ After 1960 when world population had reached about 3 billion people, population growth stabilised and then fell.⁴



Source: Kremer (1993) and UN (1998).

This version of the model is based on very restrictive assumptions. Therefore, Kremer (1993) relaxes some of them in more generalised versions of the model. First, he takes into

³ There are a few outliers in the middle ages where population growth rates were in three instances lower than one would have expected. They are associated with the demographic impact of the Mongol invasions in the 13th century, the black death in the 14th century, and the 30-years war and the fall of the Ming Dynasty in the 17th century.

⁴ Kremer accommodates this period in one of his extensions of the model (see below).

account that research productivity (g) may depend on income, i.e. be a function of income. In particular, higher incomes may increase the research productivity per person. With this extension, it is possible to explain why some populous countries like China or India have comparatively low technological levels. Secondly, he takes the view of Jones (1992, 1995) that it is arbitrary to assume a linear relationship between the growth rate of technology and its level. Assuming an exponent of less than one for the technological level (A) in equation (3) is in line with a constant or declining total factor productivity in the post-war period. Thirdly, he relaxes the assumption that research productivity is independent of the size of the population. He formulates a research equation (3) which also contains an exponent attached to P , the population level. This is due to the fact that research productivity may increase with population as suggested by Kuznets (1960), Grossman and Helpman (1991) or Aghion and Howitt (1992). Alternatively, at some level, research productivity may also decrease with population size because of redundant research activities.

Thus the more general technological change equation becomes⁵:

$$(3a) \frac{\dot{A}}{A} = g * P^\psi * A^{\phi-1}$$

and the population growth equation becomes:

$$(5a) \frac{\dot{P}}{P} = \frac{g}{1-\alpha} P^{\psi+(1-\alpha)(\phi-1)} y^{-\phi-1}$$

For the empirical regularities observed in Figure 1 to be consistent with this equation, the exponent on P must be roughly equal to 1. Given that ϕ , the exponent of A , is smaller or equal to one, with α being approximately $2/3$, ψ must be greater than 1, thus suggesting that the increases in research activity afforded by higher population outweigh the duplication effects.

While Kremer motivates this extension as effects of higher population on research activities, his description of these effects, better intellectual contact and specialization and the development of cities, are really effects of population *density*, not primarily related to absolute population size. Also, the arguments of Kuznets(1960), Agion and Howitt (1992), and Grossman and Helpman (1991) as well as Becker et al. (1999) relate primarily to the effects of population *density* on technological change through its effect on more intensive

⁵ This is a very general formulation that would accommodate a variety of views on technological change including Barro and Sala-i-Martin (1992), Jones (1992, 1995), Aghion and Howitt (1991), among others.

intellectual contact, urbanization, exchange, and specialization, and through its effect on market size.

Consequently, the next section introduces population density into this extended version of the model. It is intended to present a more plausible version, showing that not only population size, but also population density matters for technological progress. This extension does add to the complexity of the model, but generates interesting new insights into the process of technological change and better explains the data.

3. Population density and technological change

The process of endogenous technological change, until now represented by equation (3a), may also be influenced by population density. For instance, a country with a large population may not possess a higher growth rate of technology than a country with a medium sized population, because the population density in the second country is higher. This may be true because the need to invent new technologies from a Boserupian (1981) point of view will be higher in the second country, compensating for(?) the disadvantage of having less inventors in absolute terms. The speed of communication, the diffusion of knowledge, and division of labor could also be higher in the second country, which could lead to a faster pace of technological progress than in the more populous country, following the insights from Kuznets (1960), Becker et al. (1999) and Gallup and Sachs (1998)⁶; or higher population density increases the effective market size and thus raises the returns to innovation. This is not only theoretically plausible but supported empirically by cross-country growth research (e.g. Gallup and Sachs, 1998; Bloom et al. 1999; Nestmann, 2000). To see this formally, this idea will now be incorporated in the framework of Kremer's generalized model.

In this version, the land variable T will not be normalized to one in the production function.

The production function from (1) is reproduced below.

$$(1) \quad Y = A * P^\alpha T^{1-\alpha}$$

After dividing (1) by P and rearranging terms, we can identify the per capita production function (1b), which depends on population density (P/T).

$$(1b) \quad y = A * \left(\frac{P}{T} \right)^{\alpha-1}$$

This function can be interpreted as follows: The more people (P) work on a fixed land area (T), the lower will be the marginal productivity per head; conversely, the larger the land area

(T), the higher is a persons' marginal product. . As in Kremer's model, it is also assumed here that population adjusts instantaneously to economic conditions. Thus the equilibrium population density can be expressed as:

$$(2b) \frac{P}{T} = \left(\frac{\bar{y}}{A} \right)^{\alpha-1}$$

In this new version of the model, the growth rate of technology (\dot{A}/A) depends on research productivity per person, population size, the level of technology, and on population density. The research productivity per person (g) is multiplied by P to compute total research output in the economy. The level of technology (A) affects the growth rate non-linearly, as Jones (1992,1995) proposed. The variable d stands for population density, defined as population (P) divided by land area (T).

$$(3b) \frac{\dot{A}}{A} = g * P * d^{\beta} * A^{\phi-1}$$

The functional form of equation (3b) captures that not only population size but also population density influences the growth rate of technology.⁷ The magnitude of the exponent β will be determined with help of equation (5b).

In the next step we compute the population growth rate. The growth rate of the land area T is equal to zero, as land area is fixed over time.⁸ From the last section we know how to compute the growth rate of population out of (2) or (2b), respectively. Equation (4b) is therefore equal to equation (4) from Kremer's simple version.

$$(4b) \frac{\dot{P}}{P} = \frac{1}{1-\alpha} \frac{\dot{A}}{A}$$

Multiplying (4b) by T/T and substituting for \dot{A}/A leads to the final equation (5b):

⁶ Gallup and Sachs (1998) differentiate between the effects of population density in the hinterland and in coastal regions. The beneficial effects of population density only are supposed to appear in coastal regions.

⁷ In our model we only consider technological progress and do not make allowances for technological regress due to either 'depreciation' of technical knowledge and/or falling populations. Aiyar and Dalgaard (2001) provide a model, in which imperfect knowledge transfers from one generation to the next may result in technological regress. In particular, the model describes how technological levels might decrease due to a fall in population density which might explain technological regress in some historical and geographic circumstances. These insights supplement our own analysis here, which we believe is more relevant at the global level examined here. For a related discussion, see Kremer (1993)

⁸ The global land area has indeed not changed drastically over the past 1 million years and in this simple formulation of a global relationship, this assumption may be reasonable. See also discussion below about population and technological change in geographically separate regions which examines this issue at a more disaggregated level.

$$(5b) \quad \frac{\dot{P}}{P} = \left(\frac{Tg\bar{y}^{\phi-1}}{(1-\alpha)} \right) \left(\frac{P}{T} \right)^{1+\beta+(1-\alpha)(\phi-1)}$$

Kremer assumes that the share of labor (α) in the production process is roughly two thirds; he also follows Jones (1995) in assuming that $\phi < 1$. Over most of human history, the growth rate of population was proportional to its size. Because of this observation, the exponent of P/T is supposed to be roughly equal or slightly less than one.⁹ If it is true that:

$$1 + \beta + (1 - \alpha)(\phi - 1) \leq 1$$

then, substituting the values for α and ϕ leads to the prediction that β is between zero and one. This can be interpreted as follows: The influence of population density on technological change is positive but decreasing over time. The transfer of knowledge is faster, the higher population density becomes, but note that the speed of this transfer is not unlimited. Although the absolute value still increases over time, the marginal increase of the growth rate in technological diffusion declines. For a single country, its own level of technology may, at lower levels of population density, also be more influenced by population density than at higher levels.

But population density does not only represent the diffusion of technology but also the need and the ability to use a new technology. Assuming that a certain population density is necessary to generate the demand for technological change and generate the requisite local market, this population density spurs technological change particularly for countries with low levels of technology. Similarly, higher density increases returns to investments in public goods such as power or other infrastructure (see Simon, 1977; Frederiksen, 1981), and these investments in turn could also work as catalysts for the rate of technological change. Once the infrastructure has been built, the influence of population density is concentrated only on the diffusion process and less on the demand factors and the basic infrastructure necessary for efficient technological spillovers, which could account for the falling marginal returns from population density. Moreover, if population density becomes too high, the costs of selecting the right information increases and this could lower the benefits of a faster knowledge transfer. The inference from the empirical evidence, which lead to a positive but declining influence of population density on the growth rate of technology is consistent with these arguments.

⁹ If it were slightly less than one, it may also account for the fall in population growth after 1960 in Figure 1. But see also below.

This version of the model can then be extended, as was Kremer's, to no longer assume instantaneous adjustment of population to income levels. If now population adjusts only slowly to rising incomes, it is possible for per capita incomes to increase, and these rising per capita incomes in turn reduce population growth (e.g. Becker 1981, Willis, 1973) and thus may generate the turning point observed in Figure 1. In this version with population density, per capita income growth would be faster than in the Kremer version and also in line with observed income growth over the past century.

Thus the inclusion of population density more plausibly explains the empirical findings on population and population growth through the above argument on the positive, but declining impact of population density on technological change. This explanation appears more plausible than Kremer's original version which only turns on population levels and not on its density.

4. Empirical Tests and their Interpretation

Since global population density has changed, one for one, with global population (as the global land area has been roughly fixed over the past few millenia), the empirical tests of Kremer's hypothesis apply to this formulation of the model as well and need not be replicated here but will only be briefly summarized.¹⁰ Kremer shows that the linear relationship between population levels and its growth rate shows up econometrically and is robust to corrections for heteroscedasticity, different data sources for world population, and changes in time periods under investigation. It not only holds for the entire world, but also when specific regions between which there was only limited exchange of technologies (e.g. Europe, China, and India) are considered separately. In our interpretation, it was the rising population *and* the rising population density which ensured the acceleration of technological progress in the world, and the three regions, which then in turn relaxed the Malthusian constraint and allowed population levels to grow further.¹¹

For the second part of Kremer's empirical tests, however, our model has a different interpretation. In that part, Kremer examines population and population density of five technologically separate regions around 1500 to test whether those regions with the lowest

¹⁰ For the aggregate analysis undertaken here, the assumption of a fixed land area appears reasonable. If one were to examine technological change at a more disaggregated level, settlement patterns that shift the inhabited land areas as well as alter local population densities would be important to account for actual trends in technological change over space and time. See also analysis of geographically separate regions below.

¹¹ For details, see Kremer (1993) which also includes a careful discussion of the data sources and potential biases.

population indeed had the lowest population growth. He shows that there appears to be a close correlation between population and technological levels in those five regions which separated around 10000 B.C. The regions with the lowest population density, Tasmania and Flinder’s Island (where population appears to have died out about 6000 B.C), also had the lowest technological levels, while the much more populous Old World was the place with the highest level of technologies in 1500. He also claims that the regions with the lowest population in 1500 must have had the lowest population growth up until 1500 since their population density in 1500 was lowest. Table VII from his paper has been complemented with data on population and population density for AD1 and AD1000 and is shown below as Table 1. His second claim hinges on the assumption that all five regions started out at the time of their separation (around 10,000 BC) with roughly the same population density. Only with this assumption can the population density in 1500 say anything about population growth prior to that.

Table 1: Population and Population Density in Technologically Separated Regions

	Population			Area	Population Density		
	AD1	1000	1500		AD1	1000	1500
Old World	162.5	254	407	83.98	1.94	3.04	4.85
Americas	4.5	9	14	38.43	0.11	0.23	0.36
Australia	0.2	0.2	0.2	7.69	0.03	0.03	0.026
Tasmania			0.0012-0.005	0.068			0.018-0.074
Flinders Island			0	0.0068			0

Sub-Saharan Africa is included in the old world (which is otherwise comprised of Eurasia), since there was some contact across the Sahara. There are a wide range of population estimates for the Americas and Australia at the time of European arrival, and McEvedy and Jones’s are at the low end. However, higher estimates would not affect the rank ordering. Estimates for Tasmania are based on the Encyclopaedia Britannica. There are no reliable population estimates for Tasmania prior to 1500.

Source: Kremer (1993), McEvedy and Jones (1978).

Adding further data from McEvedy and Jones, which were used by Kremer in Table 1, question the empirical validity of this assumption. Instead it appears that the Old World in 1 AD, and also in 1000 AD had considerably higher population densities than the Americas and Australia. While we do not know whether this was true already at the time of separation, the differences are so large that it is more than likely to have been the case.¹²

¹² Using alternative data from Clark (1968) or from Durand (1977) supports the contention of vastly different population densities between the Old World and the Americas and Australia up until the earliest times. This conclusion would be strengthened if one excluded Africa South of the Sahara from the Old World. Clark’s and Durand’s data have considerably higher numbers for the old world at AD1 and consequently lower population growth after that.

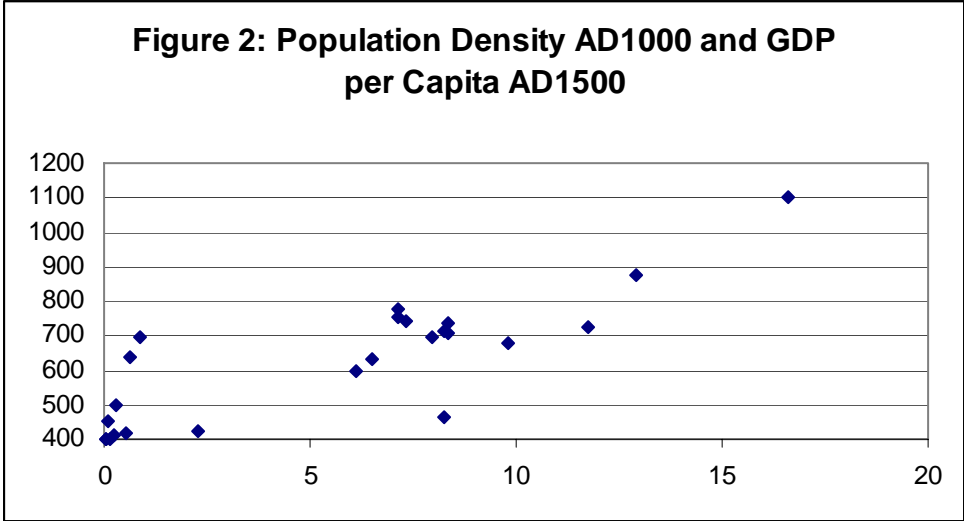
Using our model with population density, one can reinterpret the findings from Table 1 more convincingly. In particular, we no longer need to assume equal population densities at the time of separation but can replace that with the more realistic assumption that population density of these separate regions differed already at the time of separation, with the Old World already having the highest population density, and the Americas, Australia, Tasmania, and Flinder's Island each having smaller population densities. As a result, it was the low initial population density (in addition to low population) that ensured that the latter regions remained technologically backward, while the more densely settled Old World developed progressively better technologies. The considerable differences in population growth between AD1 and AD1000 and AD1500 between the regions would support this conjecture. Moreover, our model would clearly predict that the combination of higher population *and* higher population density in the Old World ensured that most technological progress the world has seen since 1500 originated in that region (see also Boserup, 1981).

Our model can be further supported by looking at more disaggregated data on population, population density and GDP (as a proxy for the level of technological development). Appendix Table 1 presents data on population and population density for several Western European countries separately and aggregated data for several regions such as Eastern Europe, the former USSR, Western Offshoots, Latin America and Africa, both in AD0 and AD1000. The Table also shows data on PPP-adjusted real per capita GDP in AD1500 from Maddison (2001). These new data confirm that the regions where technological progress took off around 1500, especially Italy and central Europe had significantly higher population densities than e.g. the United States, the former USSR or Africa, all being regions that can be considered technologically backward at that time. India and China have relatively high population densities and were countries with recurrent episodes of high technological progress, although both were not particularly wealthy in 1500.

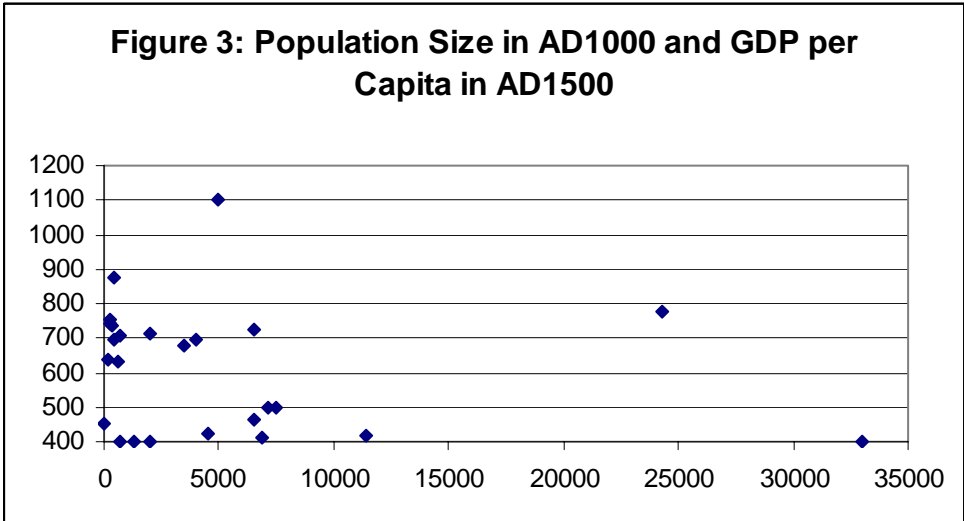
In fact, Figure 2 and the regressions in Table 2 demonstrate a close correspondence between population density in AD0 (or in AD1000) and per capita GDP in 1500, suggesting that more densely populated regions experienced greater technological progress after 1000, when (according to Maddison (2001)?) the divergence in per capita incomes between countries began to emerge. The strong and highly significant influence of population density on subsequent technological change is robust to whether we use density in AD0 or AD1000, and whether we include or exclude some outliers.¹³

¹³ When we remove outliers (Italy and India in AD0 and India and Japan in AD1000), the influence of population density becomes much stronger and explains a surprisingly large share of the variation in per capita

At the same time, we observe from Figure 3 that the correlation between population size in AD0 (or AD1000) and per capita GDP in AD1500 is close to zero. This supports our contention that population size alone was not primarily responsible for technological change, while population density clearly played an important role; in fact, the data seem to suggest it played a more important role than population size.



Source: McEvedy and Jones (1978), Maddison (2001), and World Bank (2002). Note that two outliers (India and Japan) are excluded. As shown in the Table 2, they affect the correlation only marginally.



Source: McEvedy and Jones (1978); Maddison (2001), and World Bank (2002). Note that two outliers (India and China) are excluded. As shown in the Table 2, they affect the correlation only marginally.

incomes in 1500. Arguably it is useful to remove at least Italy and India from the regressions as they were experiencing a high point of a particular imperial period in AD0 (Italy and India) and Ad 1000 (India), leading to unusually high population concentrations.

Table 2: Population, Population Density, and Per Capita GDP in 1500

	(1)	(1)#	(2)	(2)#	(3)	(4)
Constant	512.6*** (36.1)	473.8*** (14.2)	511.4*** (12.0)	443.3*** (14.9)	610.3*** (16.0)	619.0*** (15.8)
Pop. Dens. AD0	17.8*** (4.0)	29.8*** (4.6)				
Pop. Dens. 1000			14.7** (3.1)	32.0*** (7.6)		
Pop. AD0					-0.0004 (0.2)	
Pop. AD1000						-0.001 (0.6)
Adj. R-Sq.	0.36	0.46	0.25	0.70	-0.04	-0.02
N	27	25	27	25	27	27

Note: Dependent variable is PPP adjusted per capita GDP for 1500. Regressions with # exclude outliers. Dropping outliers from regressions 3 and 4 did not change the results. Absolute t-statistics in parentheses. ***refers to 99.9%, **to 99%, and * to 95% significance.

Source: Observations based on Maddison (2001).

5. Conclusion

This note incorporates population density as an additional determinant of technological change within the framework of Kremer's (1993) model. While population increases the number of potential suppliers of new technology, population density generates the linkages, the infrastructure, the demand, and the effective market size for technological innovations. The model and the available data suggest a concave relationship between population density and technological change. This model is able to better explain the empirical relationship between population, population density, and population growth, and can provide a better account of the differences in technological levels between geographically separate regions than the account provided by Kremer (1993).

The revised model not only explains the historical record in a more plausible fashion, but also has interesting implications for understanding differences in growth and development among different parts of the developing world. For example, a conclusion of this model is that Africa's development challenge is particularly difficult given its combination of relatively low population levels at the beginning of modern economic growth combined with a very low population density both of which hamper technological change and diffusion. The rapid population growth Africa is currently experiencing might in time reduce this burden and ease technological change and diffusion, but only at high current costs that such high population growth entails.¹⁴ Conversely, economic development in Asia was greatly aided by

¹⁴ For a related discussion, see Gallup and Sachs (1998). Low population density might have other negative effects such as greater ethnic divisions which has also been found to reduce economic growth (Easterly and Levine, 1997). At the same time, it is not clear whether high population densities are still as essential as they

high populations and large population densities that facilitated technological change and diffusion. Regarding policy implications, our findings suggest that effort should be directed at overcoming the limits and constraints imposed by low population density. Policies aimed at improving the physical and technological infrastructure would clearly be important in this regard.

used to be given that modern transport and communication technologies offer, if available, greater technological diffusion even without high population densities. But also here, Africa seriously lags behind.

Appendix: Table 1

Country	Surface Area (1000 km ²)	Population (Tsd.) in AD0	Population (Tsd.) in AD1000	Population density in AD0	Population density in AD1000	GDP per capita in AD1500
Austria	84	500	700	5.95	8.33	707
Belgium	31	300	400	9.68	12.90	875
Denmark	43	180	360	4.19	8.37	738
Finland	338	20	40	0.06	0.11	453
France	552	5000	6500	9.06	11.77	727
Germany	357	3000	3500	8.40	9.80	676
Italy	301	7000	5000	23.26	16.61	1100
Netherlands	42	200	300	4.76	7.14	754
Norway	324	100	200	0.31	0.61	640
Sweden	450	200	400	0.44	0.88	695
Switzerland	41	300	300	7.32	7.31	742
United Kingdom	243	800	2000	3.29	8.23	714
Portugal	92	500	600	5.43	6.52	632
Spain	506	4500	4000	8.89	7.95	698
Western Europe*	3404	22600	24300	6.64	7.14	774
Eastern Europe **	786	4750	6500	6.04	8.27	462
Former USSR***	24971	3900	7100	0.16	0.28	500
United States	9629	680	1300	0.07	0.13	400
Other Western Offshoots ****	17983	490	660	0.03	0.03	400
Total Western Offshoots	27612	1170	1960	0.04	0.07	400
Mexico	1958	2200	4500	1.12	2.29	425
Other Latin America *****	18501	3400	6900	0.18	0.25	410
Total Latin America	20459	5600	11400	0.27	0.55	416
Japan	378	3000	7500	7.94	19.84	500
China	9598	59600	59000	6.21	6.14	600
India	3287	75000	75000	22.82	22.81	550
Africa	28821	16500	33000	0.57	1.14	400
World	110200	230820	268273	2.09	2.43	565

Notes:*Austria, Belgium, Denmark, Finland, France, Germany, Italy, Netherlands, Norway, Sweden, Switzerland, United Kingdom, Portugal, and Spain. **Comprising of Albania, Bulgaria, Czechoslovakia, Hungary, Poland, Romania, and former Yugoslavia. *** Armenia, Azerbaijan, Belarus, Estonia, Georgia, Kazakhstan, Kyrgyzstan, Latvia, Lithuania, Moldova, Russian Federation, Tajikistan, Turkmenistan, Ukraine, Uzbekistan. **** Australia, New Zealand, Canada. ***** Argentina, Brazil, Chile, Colombia, Peru, Uruguay, Venezuela, Bolivia, Costa Rica, Cuba, Dominican Republic, Ecuador, El Salvador, Guatemala, Haiti, Honduras, Jamaica, Nicaragua, Panama, Paraguay, Puerto Rico, Trinidad & Tobago.

Sources: Surface Area was taken from the World Development Indicators 2002. Population figures as well as GDP data was taken from Maddison (2001). Population density was calculated by dividing total population by surface area.

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