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*Reflexions*

**Demography in a new key:  
A theory of population theory**

**Thomas K. Burch**

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*Reflexions*

## **Demography in a new key: A theory of population theory**

**Thomas K. Burch<sup>1</sup>**

### **Abstract**

The widespread opinion that demography is lacking in theory is based in part on a particular view of the nature of scientific theory, generally known as logical empiricism [or positivism]. A newer school of philosophy of science, the *model-based* view, provides a different perspective on demography, one that enhances its status as a scientific discipline. From this perspective, much of formal demography can be seen as a collection of substantive models of population dynamics [how populations and cohorts behave], in short, theoretical knowledge. And many theories in behavioural demography – often discarded as too old or too simplistic – can be seen as perfectly good scientific theory, useful for many purposes, although often in need of more rigorous statement.

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## 1. Introduction

The status of theory in demography has been problematic for as long as I can remember. It has been over fifty years since Rupert Vance asked ‘Is theory for demographers?’ (1952). There is ample evidence that not a few demographers – then and now -- would answer ‘Of course, but it’s not a high priority.’ But if demography is a true science – as opposed to a body of techniques or a branch of applied statistics (Note 1) – it must have theory, recognise that it has theory, codify its theory, and seriously teach theory to its students.

In his Presidential Address to the Population Association of America, Nathan Keyfitz (1971) adopted what he termed a ‘liberal view of models.’ In this paper, I would like to sketch a ‘liberal’ view of scientific theory, and to discuss some of its implications for the way we think about demography and the way we present it to others.

This view of theory is known in philosophy of science circles as the ‘semantic’ view, or more recently and descriptively, the ‘model-based’ view of science. In describing this approach, I shall draw heavily on the work of Ronald Giere, an American philosopher of science (1988, 1999), but also on some methodological writings of our own Nathan Keyfitz (1971, 1975). Keyfitz introduced many of these ideas to demography over 30 years ago, although they never became mainstream (Note 2).

In the model-based view models, not empirical laws, are the central element of scientific knowledge. A model is any abstract representation of some portion of the real world. A model may contain basic principles generally regarded as ‘laws.’ In this case, the laws ‘function as true statements, but not as statements about the world. They are then truths only of an abstract model. In this context, such statements are true in the way that explicit definitions are true’ (Giere, 1999, p.6). A model contains generalisations, but they are formal generalisations, not empirical ones. Empirical assessment of theory, therefore, relates not to whether a theoretical model is empirically true or false – strictly speaking all theories and models are false because they are incomplete and simplified representations of reality -- but ‘how well the resulting model fits the intended aspects of the real world’ (Giere, 1999, p.6). This view stands opposed to many of the familiar teachings of logical empiricism, by which theory is based on empirical laws, and judged true or false by its agreement with data. The model-based view is equally concerned with empirical data, but these are used to judge whether a model fits some portion of the world closely enough for a given purpose, not whether the model is true or false in any absolute sense. Two general implications of the model-based approach for our view of demography:

a) Much of formal demography (techniques, methods) can be viewed also as theory, that is, as a collection of substantive models about how populations and cohorts behave;

b) Many ideas from behavioural demography that have been rejected as empirically false or too simplistic can be viewed as perfectly good theory, especially if they were to be stated more rigorously.

Indeed, at the theoretical level, the classic distinction between formal and behavioural demography loses much of its force. In both sub-areas of demography, theoretical models have essentially the same epistemological standing, even if they may differ on other dimensions such as scope and complexity, and even if different kinds of day-to-day work may be involved in their development and use.

I recognise that the word *theory* is ambiguous in the non-pejorative sense of ‘having two or more meanings.’ It means different things to different people, both in everyday speech and in scientific discourse. In such circumstances, it is futile to try to establish the ‘correct’ definition or the ‘true meaning’ of theory. But it is possible and useful to suggest a new – though certainly not entirely new -- approach to theory that might prove more fruitful than the older ideas to which many of us are accustomed. In the next section, I summarise the main elements of the model-based view, noting some ways in which it differs from, but also agrees with, logical empiricism. A key part of this exposition is a partial re-definition of such terms as *model* and *theory*. But terminology is not crucial, and some may want to define these words differently, and to preserve a sharp distinction between *theory* and *model*. The central ideas I wish to convey are an emphasis on formal demography as substantive knowledge, and a plea that empirical exceptions to otherwise useful behavioural theories should not lead to their discard.

In the logical empiricist view of science, theory comes from data through a process of induction and generalisation. Theoretical knowledge and empirical knowledge are seen as occupying different but parallel planes, layered upward into ever more general and abstract propositions. In the model-based view, theory and empirical studies are seen as occupying non-parallel planes. The planes must intersect, of course, since we are discussing empirical science. But the origin and character of the two kinds of knowledge are qualitatively different.

## 2. A model-based view of science

In the model-based view of science, as the name suggests, models, not laws, are the central element. The prototype of scientific knowledge is not the empirical or theoretical law, but a model plus a list of real-world systems to which it applies.

In this picture of science, the primary representational relationship is between individual models and particular real systems, e.g., between a Newtonian model of a two-body gravitational system and the Earth-Moon system.... Here we have not a universal law, but the restricted generalization that various pairs of objects in the solar system may be represented by a Newtonian two-body gravitational model of a specified type (Giere, 1999, p.93).

A model is any abstract representation of some portion of the real world, constructed for the purpose of understanding, explanation, prediction, or control. Giere distinguishes three types of models:

- 1) physical models (for example, an automobile in a wind tunnel, or a physical model of the hydrogen atom);
- 2) visual models (for example, maps showing plate tectonics, or a diagram of the demographic transition);
- 3) theoretical models (for example, Newton's 'law' of falling bodies, or the theory of evolution).

Physical models have little relevance to demography and other social sciences. Visual models have great potential, but are not as widely used as they might be, with the bulk of graphics in demography limited to the representation of data frequency distributions, time series, and age-structures rather than processes or systems.

Theoretical models can be expressed in ordinary language, formal logical systems, mathematics, or computer code (Note 3).

In the model-based view, no sharp distinction is made between models and theory. A collection of small models relating to a particular realm can be called *theory* (for example, the theory of harmonic oscillators, or the theory of population aging). These models typically are small in the sense that they contain a small number of variables, and are constructed to represent very limited portions of the real world. Or, *theory* can refer to a system of very general ideas (for example, the theory of relativity, or transition theory) attempting to represent larger, more complex real world systems. The difference is not qualitative, but relates to differences in scope, complexity, and other

quantitative dimensions (Note 4). There may be advantages to preserving fine distinctions among the words *theory*, *model*, and *theoretical model* in some contexts. In this paper, they can be used more or less interchangeably.

Giere draws a useful analogy between scientific models and maps, viewed as simplified representations of our physical surroundings [1999, pp.25-26; 81-82; 214-215]. Like theoretical models, maps typically vary in scope. We have maps giving a broad overview of nations or of whole states or provinces, and more detailed maps, often as insets, of smaller areas such as cities or metropolitan areas. Some maps are extremely simple. An example is the straight-line map found on metro trains or subways, which show only the stops and transfer points for a particular line, which is all the rider needs to know. Maps differ in scope and detail, but all are abstract representations of reality.

A theory or theoretical model is a formal system: a set of propositions involving objects, variables, and relations among them. It must be clear and logically consistent. A model is constructed in an attempt to represent or explain some empirical reality. But it need not be derived from empirical generalisations. And it does not have to be – indeed it cannot be – empirically true. In Giere's words, models are true 'in the way explicit definitions are true' (1999, p.6). They can never be absolutely and literally true because they are always partial and approximate representations of an infinitely complex real world. Scientific theories, he notes elsewhere (1988, p.xvi) can be viewed 'not as empirical statements but as definitions of models variously related to the real world.' And so, 'Science does not deliver to us universal truths underlying all natural phenomena; but it does provide models of reality possessing various degrees of scope and accuracy' (1999, p.6). One can have, says Giere, *realism without truth*.

Keyfitz, discussing models of the demographic effects of eliminating deaths from heart diseases, comments similarly that his conclusions '...are conditional statements, and as such they are true beyond debate, given their assumptions that death rates by age from all other causes and birth rates by age of mother will remain as they are' (1971, p.574). Conclusions drawn from a model follow inexorably from assumptions and model structure. Later, he contrasts the firmness of these conclusions with those established by 'direct observation, which tend to provide enigmatic and inconsistent reports' (1975, p.267).

How then does one evaluate a model or theory? A model is a good model – Giere would not say a 'valid' or 'true' model – if it fits some portion of the real world 1) closely enough, 2) in certain respects, 3) for a specific purpose. All models are approximations. The question is whether the approximation is 'good enough.' All models have a limited number of variables; none can mirror the numberless qualities of the real world. And finally, any model is to be evaluated with reference to the purpose for which it was designed or constructed.

The map analogy cited earlier helps clarify the last point. A highway map and a topographic map can both represent a particular area. But the highway map is relatively useless for back-country hiking. It is not an incorrect or false representation, just the wrong one for the purpose of hiking. Similarly, a metro map correctly tells a rider where to get on and off the train, but is practically useless when one emerges above ground. A map of city streets is needed.

Over time in any science, some models receive widespread and more or less permanent acceptance because they seem to embody central principles, or because they are widely applicable. In physics, classical mechanics provides an example. And these models are taught systematically in every introductory physics course. It is well understood that such models do not work so well at the sub-atomic level, or on the scale of the universe. But they are not therefore abandoned. In fact they are widely used in space exploration.

The ‘fit’ of a model to some part of the real world is a matter for empirical examination. It is this empirical research that links model and data. But the conclusion that a model does not fit a particular case – perhaps not even closely – is only a conclusion that the model does not fit, not that the model is inherently false or invalid. It may well fit other cases. Decisions about whether or how well models fit the real world are based on scientific judgement, not on purely logical criteria. Giere again: ‘judging the fit of a model to the world is matter of decision, not logical inference’ (1999, p.7).

The model-based view of theory has developed in conscious opposition to logical empiricism, the dominant philosophy of empirical social science during the second half of the 20<sup>th</sup> century. It differs from logical positivism in that the elements of a model do not have to be or be derived from or be logically consistent with broad – some would say universal – empirical generalisations or ‘laws.’ Such generalisations as exist may be incorporated into a model, but they are not essential. Many proponents of the model-based approach conclude that the logical empiricist program has been self-defeating precisely because empirical generalisations in social science are relatively rare (Note 5).

The model-based view agrees with logical empiricism in its emphasis on the importance of empirical observation. It is the real world, insofar as it can be observed, that one is trying to understand and explain, not some imaginary world, a pure construct. The imagination is at play in theorising and model building. But it begins with some empirical observation to be accounted for, and it returns to empirical observation to see if the account is a good or useful one. Otherwise, there is endless speculation.

The model-based view differs from a common view of economic theory, in which theory is derived from a limited set of axioms such as ‘impersonal markets,’

‘maximising behaviour,’ ‘well-ordered preferences,’ etc. In the model-based view, the canonical axioms of economics may be incorporated into a model, but they need not be. In the model-based view, model construction is less constrained than in logical empiricism or mainstream economics. It is a creative leap from some empirical phenomenon that needs to be understood or explained to the construction of a model that seems to do the job. Whether or how well it does so, as already noted, is a matter for empirical examination and scientific judgement.

The model-based view agrees with economics in an emphasis on the need for rigor in the statement of theories. The empirical assessment or use of models depends on their capacity to yield definite implications or predictions, and to support truly logical explanations.

In the model-based view, however, theory is not deductive in the sense of being inferred from a limited set of axioms. But explanation using a model is deductive, in the sense that the event or outcome to be explained must follow logically from the model, must be deducible from it. Nor is theory inductive in the sense of being derived from an examination of many cases to arrive at broad empirical generalisations. It is inductive in the broader sense that it starts with empirical observation and arrives at an abstract, and therefore general, model (Franck, 2002). But the process involves a creative leap of the imagination, not just generalisation of the facts.

A model or theory need not deal with general classes of phenomena. Otherwise, there could be no theory of the evolution of the human race or of the origins of the universe, both unique events. It is one of the strengths of the model-based view of science that it directs us to use abstract models to study unique events, unlike logical empiricism which requires empirical generalisations about classes of events. In the latter system, to the extent an event is truly unique, it cannot be subsumed under a class or a class-based generalisation, and therefore cannot be explained. The model-based approach to unique events enables us to pursue theoretical explanations, rather than falling back on the pure descriptions of ethnography or narrative history.

In this liberal view of theory, there are many different kinds. There are simple theories or theoretical models, and very complex ones. There are theories which apply to large categories or classes of phenomena (for example, fluid dynamics), and those which apply to unique events (for example, the origins of the universe, or human evolution). Clearly the latter kind of theory cannot be based on empirical generalisations based on the study of many cases; there is only one case. The generality lies in the model itself, not in data. In Meehan’s words, ‘...timeless or general propositions are assumed to belong to the logical rather than the empirical world’ (1968, p.32).

In order to apply to a particular phenomenon, of course, a theoretical model must be given greater specification. But even with such specification, it remains a theoretical

model. The term *theoretical model*, for Giere, refers ‘either to a general model or to one of its specific versions obtained by specifying unique values for all parameters and initial conditions’ (1999, p.177).

In physics, a distinction is sometimes made between *phenomenological* and *fundamental* theories (see Cartwright, 1983). The former is essentially a description of what happens and how, without too much concern for why. A classic example is Newton’s principle of gravity, which tells us that bodies released from a height will fall, and approximately how fast they will accelerate, but does not tell us what gravity is (Ekeland, 1988). Fundamental theory delves more deeply into causes and mechanisms.

Meehan (1968) makes a similar distinction between models which can only predict that something will happen, and those that can also explain why it will happen, by explicating processes or mechanisms. He views the latter as more difficult to construct, but also as more powerful, insofar as they make it possible to control events – at least in principle – not just adjust to them.

Other things equal, fundamental or explanatory models are of greater scientific value, because they involve deeper knowledge and understanding, and have more varied applications. But model assessment is related to purpose. And for some purposes, a phenomenological model may be just as effective and, often as not, easier to use.

### 3. Some demographic models revisited

The model-based approach to science leads to a new perspective on demography; demographic knowledge, old and new, is seen from a different angle. Or, to use a musical metaphor, the same old demographic songs can be sung in a new key and re-harmonised. This approach, I believe, greatly enhances demography’s status as a science, notably its status as an autonomous discipline with its own large body of good theory.

A few examples will illustrate the point.

*The exponential growth model:* No one would question the meaning or validity or ‘truth’ of the expression  $P(t) = P(0) e^{rt}$ . It is a function that is defined, and is true by definition. In demography, the empirical question cannot be whether it is true, but only whether it fits a particular case at hand. And this depends on purpose. It is a good theoretical model to describe the basic character of the growth of the human and many other biological species, namely, that it tends to be proportional to population size. It is a good model to calculate an annual average rate of growth over some historical period,

although like many averages the resulting figure may be misleading. The exponential model, however, does not work at all well to describe the actual growth trajectory of many, perhaps most, real-world populations – consider the many examples of supra-exponential growth during the last three centuries. But we do not therefore say that the exponential model has been ‘falsified,’ only that it doesn’t fit the case.

Is the exponential model demographic theory? Perhaps one would prefer to call it a theoretical model or just a model. But when it is taken together with several others – the logistic, a supra-exponential model, the stable model, the projection model (see below), one can legitimately speak of the resulting collection as a ‘theory of population growth.’

*The life table:* The life table usually is presented as a complex measurement device, primarily a measure of ‘current’ mortality. But more fundamentally, it can be viewed as a theoretical model of cohort survival. The algorithm for calculating a life table from assumed death rates or probabilities is ‘true,’ depending as it does on the straightforward application of basic arithmetical operations. And, a life-table based on observed rates is a true summary of those rates. Again, the relevant question is not whether a particular life table is true or false, but whether it fits some real-world situation closely enough for the purpose at hand. To summarise current age-specific death rates and re-work the information they contain into a more useful form (for example, for calculating survival ratios), the life table works quite well. Whether the input rates somehow misrepresent some true, underlying mortality level is another issue, as is the question of whether a current life table can be used to forecast future mortality. The very best life table for contemporary humans would do a poor job of characterising the survival patterns of early humanoids or of other species, say insects (Note 6). But we can only say that it does not apply in these cases, not that it is invalid or false. Incidentally, I would describe the life table and other objects from ‘formal’ demography as being *behavioural*, in the sense they characterise the survival behaviour of a cohort – aggregate behaviour to be sure, but behaviour nonetheless.

*The Coale-McNeil marriage model:* The Coale-McNeil model of first marriage (Coale and McNeil, 1972; Coale, 1977) began life as an exercise in mathematical curve fitting. Only later was it interpreted in terms of waiting times for entry into various stages of the marriage process. I once criticised the model in comparison with that of Hernes (see Burch, 1993) because it was lacking in behavioural theory; I characterised the waiting-times interpretation as ‘semi-behavioural.’ This earlier assessment reflected my logical empiricist training and heritage, and my acceptance of the conventional sharp distinction between formal and behavioural demography. I would now say that to find a parametric model that closely fits a large collection of age patterns of first

marriage is a considerable theoretical achievement – in the category of phenomenological theory. It is behavioural in the sense mentioned above -- it captures important features of cohort behaviour. It is not, of course, the only good model of marriage. There are several others, some of which may be better for certain purposes. And there is both need and opportunity to develop rigorous models of marriage that are much more complex and more richly behavioural. Some recent agent-based models of marriage (Todd and Billari, 2003; Billari, Prskawetz, and Fürnkranz, 2003) represent one promising direction for these efforts.

Coale and Trussell's later (1995) discussion of the character of parametric models is instructive:

The models are descriptive and were never intended to be anything else. No deep theory, or even shallow theory, underlies the search for empirical regularities (p.483).

The quality of a model, in their view, 'depends on how usefully it can be exploited for empirical research' (p.469). Three uses are highlighted: testing data; building blocks for estimates; forecasting. The value of models is closely tied to working with 'inaccurate and incomplete data' (p.484).

Later they lament 'the virtual absence of the development and steep decline in the use of demographic models during the past decade,' related in part to increasing availability of good survey data (p.484). But if the value of demographic models is tied primarily to the absence of good data, then there is some logic in a decline in their use as data improve. If they are viewed instead as substantive models of demographic behaviour, then they have permanent value and application. This is recognised implicitly when they note that models 'can be used to make broad inferences about behaviour...' But the emphasis is elsewhere, since they continue: '...or, more commonly, to build techniques for estimating basic demographic indices for populations with limited or defective data' (p.484).

*Two kinds of transition theory:* One of the problems with the theory of demographic transition is that we have never quite agreed on precisely what it is (McNicoll, 1992). In keeping with what has gone before, I would suggest that there are two kinds of transition theory. The phenomenological version simply states that a large, sustained decline in mortality will be followed after some time lag by a large, sustained decline in fertility, resulting in an intervening period of rapid population growth. A more fundamental version would include the determinants of mortality and fertility decline – modernisation, economic growth, secularisation/individualisation, technological developments in medicine and fertility control, and so forth.

Either version of transition theory can be stated as an abstract model. In the former case, the model would assume a population in dynamic equilibrium, with constant mortality and fertility (and no migration). An assumed pattern of mortality decline is followed, after a delay, by fertility decline. There is rapid growth in the intervening period, and slower growth when a new equilibrium is established. Such a model is true by construction, ‘true in the way that a definition is true.’ Empirically it can be used to characterise the modern demographic history of many – though certainly not all – human populations. For others, for example France or Hungary, a different model is needed (Note 7).

A more ‘behavioural’ version of transition theory can also be stated as an abstract model. Mortality decline is defined as a function of development, with subsequent fertility decline a function both of mortality decline and of development. The approach would be similar to population biologists’ definition of the logistic model, in which mortality and fertility are functions of population density. The key difference is that in a transition model, mortality declines with development and population growth, whereas in the logistic model it rises [in both, fertility declines]. The link between mortality decline and fertility decline might be explicated in terms of pressure at the individual, family, or community level, as a result of larger numbers of surviving children. Again, such a transition model would provide an approximate but accurate description of the demographic history of many nations, along with a behavioural explanation for that history. With closer specification and real data inputs, it could provide a better approximation of the history of a particular nation. Probably no one specification could provide a close fit to the history of all nations, since this history did not occur ‘in a vacuum,’ as it were, or in controlled experimental conditions. It was this historical fact that led Coale to conclude that the only generalisation to emerge from the vast historical studies of European fertility decline was that fertility would decline when a population was, to borrow Lesthaeghe’s paraphrase, ‘ready, willing, and able’ (Lesthaeghe and Vanderhoeft, 1997). The postulated mechanism linking mortality and fertility decline, of course, does not flow from an empirical generalisation, which is precisely why it is a theoretical explanation.

It would be easy to multiply examples, drawn from the demographic literature both old and new. But these suffice to show that, whether in the realm of formal demography or of behavioural demography – as traditionally conceived – we can view our models as formal models, models that are true in the way that definitions are true. In either sub-field, our models are abstract representations of the real world, inspired by empirical observation; epistemologically, they are of one piece. The models of formal demography are not just measurement techniques. They have a theoretical character (Note 8). The models of behavioural demography need not be rejected because they do not fit all the facts, so long as they fit some relevant cases well enough to be useful for

one or another purpose. When all is said and done, demography has much more good theory than commonly thought.

#### **4. Demography reconsidered**

The model-based view of demography has many further implications for the way we think of the field, and the way we present it to others, notably our students. I highlight five, some of them recapitulated from above.

1) We need to become more comfortable with the idea of several different models for the same phenomenon. Logical empiricism pushed toward the view that in empirical tests, one model would emerge as a winner, with the others being falsified and rejected. I have always suspected that this idea is a reflection of a deep, even sub-conscious, monotheistic belief in our culture. Early scientific thinking often was explicitly theological (note recent publicity about Newton's theological speculations). God created the universe, implanting in it certain laws. Science's job was to find them. And since there is only one God, laws of nature will be unique. This led to what Teller (2001) has called 'the perfect model model' of science.

The model-based view prefers to think of a pantheon, or to change the metaphor, a toolkit of related models with different characteristics and serving different purposes. With respect to population growth, for example, one can point to: the exponential model; the logistic model; transition theory; the stable model; the projection model – to mention a few of the most obvious. Which is the true model of population growth? The question makes no sense. With respect to fertility, similarly, one can point to: Becker's microeconomic model; the Easterlin-Crimmins model; Friedman, Hechter and Kanmazawa's uncertainty model (1994); the social capillarity model; Davis's multiphasic model; Coale's model of the three preconditions; transition theory; Lesthaeghe on secular individualism; the newer models on 'social influence' and diffusion, etc. Which is the true model of fertility? If we retain the notion of truth at all, then surely the most that can be said is that each model incorporates some element of truth. None is complete nonsense, such as the idea that fertility decline has been imposed on us by Martians to prevent our depletion of the world's resources before they can get to them.

This 'toolkit' approach to scientific theories does not imply that all models are of absolutely equal value. Some models may turn out to be better approximations of a wider variety of cases, or useful for a wider variety of purposes. Such models will naturally tend to be used more often. But the lesser models also will be used on occasion. It is not prudent to discard them.

2) As noted earlier, at the theoretical level the sharp traditional distinction between formal and behavioural demography is discarded. All theories or theoretical models become formal in the sense outlined above. In Lotka's phrase, all theory is 'analytic theory' (1939). The body of work we generally regard as demographic 'techniques' or 'method' can still be thought of as techniques. But much of it also can be thought of as theoretical models of population dynamics – substantive models of how populations or cohorts behave, often under idealised conditions. Past practice in this regard is inconsistent. The stable model is commonly referred to as 'stable theory.' But the cohort-component projection model is classified as a 'technique,' and many demographers would object to its classification as theory. Yet both models represent the development of population size and structure in the face of assumed inputs. It is hard to see why one is theory and one is not – unless one can argue for a valid distinction based on the level of mathematics involved.

Reinterpreted models from formal demography are behavioural in a limited sense of dealing with the behaviour of aggregates, without explicit reference to motivation, values, norms, and decision making (see McNicoll's (1992) reference to 'the limitless depths' of human behaviour). But they are behavioural nonetheless, in the same sense that Newton's law speaks to the behaviour of falling bodies.

But surely, it may be objected, the classic distinction between necessary and contingent relationships (see Lotka's distinction between 'analytic' and 'statistical' demography) is valid. I reply with a distinction. There is contingency in our empirical observations. But we construct theoretical models in a way that contingency is left behind. The statement natural increase equals births minus deaths states a necessary relationship; the empirical statement high rates of female labour-force participation are associated with very low fertility is contingent, and not universally true. But the assumption that it is true can be incorporated in a constructed model. It is then true by construction, true 'in the way that a definition is true.' This is essentially the message of Keyfitz's 1975 paper on 'How do we know the facts of demography?'

In the teaching of demography, I have come to see the formal-behavioural distinction as arbitrary. Consider a lecture on the determinants of population growth, based on a series of models. Successively we show that growth depends on numbers of births, deaths, and migrants (in and out). We then show that numbers of births depends on some rate or set of rates interacting with population size and age-structure. A student asks: 'But what determines the rates?' The conventional answer might be: 'This course only deals with formal demography and techniques. To consider that question you have to take another course.' (Note 9) A model-based approach would simply move on to the next set of theoretical models, those dealing with the determinants of fertility, for example, Easterlin-Crimmins or Coale. I have never

encountered a physics or chemistry text that made such a sharp distinction between formal and behavioural physics or chemistry, or between substance and method.

3) Many computer simulations in demography may be viewed as theory or as tools for theoretical analysis. For many social and behavioural theorists, manipulation of a numerical model with a computer is ‘number crunching,’ not theory. For many empiricists, it is theory in the bad sense of armchair speculation, yielding numbers that are made up. The model-based view would say rather that a simulation is an abstract model of a real demographic system, and can be manipulated to yield insight into how that system works, or applied to real world systems to explain or predict. There is no inherent difference between this use of a simulation model and the classic uses of stable population theory to clarify dynamic interrelations among fertility, mortality, population growth, and age structure. An interesting question is why demographers have generally been more receptive to stable analyses than to many computer simulations.

This view of simulation is not unknown in demography. It has been expounded and illustrated over the years by researchers such as Hammel and Wachter, to give but one example. In fact, a computer model is just another kind of model, written in a new kind of language. And the model-based view of science does not differ greatly from the mainstream tradition of mathematical modelling, in which a model is constructed for a specific purpose and its performance judged explicitly with reference to that purpose. Mathematical modellers have generally not viewed their work as *theory*, however, although in many contexts, it can be so viewed.

In his ‘liberal view of models,’ Keyfitz noted, ‘...they may be algebraic, arithmetical, computer simulation, or verbal’ (1971, p.575). His example of a verbal model is ‘demographic transition’ theory. And as his later paper (1975) strongly suggests, there is no essential difference between a model and a theory.

4) In order to qualify as theoretical models of the kind I am urging, many if not most of our ‘behavioural’ models will have to be stated more clearly and more rigorously (Burch, 1996). This is necessary if we are successfully to deduce implications of the models. It will not do to work with highly discursive models which ‘give us a feel for what’s going on.’ Such models, as is well known, can be used to explain or predict almost anything, and therefore explain or predict nothing.

The need to derive definite implications, incidentally, is why the ‘probabilistic finesse’ – the reliance on probable generalisations rather than universal ones – is not able to save the logical empiricist approach to theory. A chain or other combination of several probabilistic empirical statements yields implications of at best low probability (by the multiplicative rule). In the model-based approach, within the model itself the

inferences are certain, allowing only for some stochastic elements. Uncertainty comes when the inferences are applied to the real world, since the fit is never perfect. But this is a matter of scientific judgement, not just logic. To quote Giere, ‘It is enough that the premises confer some appropriate degree of “probability” or “rational warrant” to the conclusion’ (1988, p.11).

5) The model-based view is comfortable in dealing with particular cases. In the logical empiricist model of science, theory is based on generalisation across many cases of a phenomenon considered as a class, e.g., national fertility transitions. Explanation of a particular case is achieved by ‘subsuming’ it under some general theoretical propositions about the class.

There are at least two problems with this approach. First, there may be no class. Some phenomena are unique in the literal sense of the word – there is only one case. The origin of the universe and the evolution of the human species are examples. Secondly, even if there appears to be a class, often it will have been defined for extra-scientific purposes (e.g., national and provincial political boundaries). Theoretical considerations do not enter into the definition. But in this case, there is no reason to assume that the classes are homogeneous with respect to characteristics of interest. To try to find a general model of such a class may involve trying to represent systems that differ in ways that are centrally important.

The model-based view of science, by contrast, has no problem with constructing models to deal with unique events. It offers an alternative to giving up on theory in the face of the tremendous variability of real-world phenomena, which seems – perhaps rightly – to defy generalisation. To some, especially historians and anthropologists, this variability means that one can only resort to detailed or ‘thick’ description of particular cases. But as has been seen above, we can have theory without generalisation. And in some cases (for example, the modern demographic history of Italy), we may be well advised to do so.

## **5. Conclusion**

But what difference does it make? Why should we take the trouble to change our way of looking at our discipline, and the way we present it to students, policy makers, and the general public. Why bother to revamp our textbooks and our courses, as might be necessary were the model-based view to be taken seriously?

My first answer is that the model-based view should be taken seriously because it makes more sense than the views to which we are accustomed. It accords with an emerging mainstream in philosophy of science, and with what scientists in some of the

most successful fields think about their work and teach their students. Without inconsistency I cannot argue that this is the *true* approach to science, only that it is a liberating and fruitful one.

A second answer is that this liberal view of theory and of models enhances the stature of demography as a science, an autonomous, well-balanced scientific discipline, with a large body of good theory, as well as of techniques, data, and empirical findings.

Thirdly, other than some mental effort, there is little downside risk in doing demography in a new key. There need be no wholesale abandonment of what we currently think and do. We can still think of the life table as a measurement tool, while beginning to think of it also as a theoretical model of cohort survival. We still will spend a great deal of time and effort on the statistical analysis of census and survey data, and on descriptive studies of demographic trends, using census and vital statistics data. Techniques will be refined, and descriptive studies will continue apace, both detailed descriptions of individual cases and attempts to generalise across cases where that is possible.

Collectively, more time and effort will be spent on the construction of new models and on the rigorous statement and systematisation of those we already have (theoretical synthesis). Not everyone is likely to become a theorist or model builder. But, one hopes, empirical research will be better informed by explicitly and rigorously crafted models, used to design the research, not just heuristically in the introductory sections of papers, or for ad hoc interpretation in the concluding sections.

The danger of an uncontrolled profusion of models seems unlikely in a discipline so closely wedded to empirical data. But the model-based approach itself guards against this danger, with its great emphasis on purpose: every model is built for some clear purpose, and is judged accordingly. One doesn't model for the sake of modelling. If a model doesn't yield insights into basic principles or fit some important empirical case – some of the data – then it will be abandoned.

What is at issue is a balance between empirical observation and theory, in a complete science. Demography has been exceptionally strong at empirical observation, and has one of the largest bodies of reliable data of any of the human sciences. But what does it mean? How can it be organised and presented to others? That is the role of theory and theoretical models.

Nancy Cartwright writes of theory: 'Explanations (at least the high level explanations of theoretical science...) organize, briefly and efficiently, the unwieldy, and perhaps unlearnable, mass of highly detailed knowledge that we have of phenomena' (1983, p.87). A large dose of the right kind of theoretical thinking could help us all digest the vast body of demographic information. Teller (2001) speaks of 'humanly accessible understanding.'

Cartwright continues in the above quote: ‘But organizing power has nothing to do with the truth.’ Bedrock truth lies in our facts (The largest national population in the world is that of China), and in our empirical generalisations such as they are (Low fertility tends to be associated with high levels of socio-economic development).

With a better appreciation of demography’s large fund of theoretical models, we can have the best of both worlds: truth in our empirical observations, and, in Giere’s words, ‘realism without truth’ in our models. But models don’t have to be true to be useful. Sufficient realism to the purpose at hand supports understanding, explanation, prediction, and policy guidance. And, to give Keyfitz the last word – ‘no models, no understanding’ (1975, p.275).

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## Notes

1. See the cover of current issues of *Demography* (vols.39 & 40), which defines demography as ‘the statistical study of human populations.’
2. I also have benefited greatly from the following: Meehan (1968); Newton (1997); Cartwright (1983; 1999). For a current summary and assessment of the semantic school, see Teller (2001).
3. The idea that theory consists of purely verbal statements seems peculiar to social science. Physical scientists tend to think of their mathematical models as theory. See, for example, Baylis [1994]. His book on *Theoretical Methods in the Physical Sciences* is an introduction to the use of a computer mathematics program, Maple V, to solve problems in elementary physics.
4. Some authors distinguish *theory* and *model*, assigning the latter a role as intermediary between theory and empirical data. See for example, Gould and Tobochnik (1996); Skvoretz (1998). Their distinction is on a general/specific axis and is not fundamental.
5. Critics of social science often take this rarity of universal generalisations as evidence that the social sciences are not really science. See, for example, *The Economist* (8 May, 1999, p.84): ‘...unlike physics, economics yields no natural laws or universal constants. That is what makes decisive falsification in economics so difficult. And that is why...economics is not and never can be a proper science.’
6. The consideration of survival curves for other species or of unrealistic curves for humans (e.g., calculating a life table with a typical age pattern of  $q$ 's reversed) helps put human survival in better perspective. See Carey (2002).
7. The literature contains a few examples of formalisation of transition theory (see, for example, Keyfitz, 1985, pp.23ff). But none has become standard or widely used or cited.
8. The idea that some demographic measurement techniques are models is not novel. Newell (1988) for example has a chapter entitled ‘Introduction to Demographic Models.’ He distinguishes *normative* and *descriptive* models, and mentions the total fertility rate and the life table as examples of the former. He comments: ‘These normative models so dominate formal demography that it is not often they are actually thought of as models; yet it should always be remembered that a move from ASFR’s to a TFR, or from ASDR’s to a life table, is a move from reality to a model’ [p.118]. Newell does not take the further step, advocated here, of viewing such a model or a collection of related models as *theory*.

9. The other side of this distinction is seen in the common practice in textbooks on ‘population problems’ of relegating most ‘technical’ demography to appendices.

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