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ABSTRACT

The health sector is filled with institutions and decision-making circumstances that create friction in markets and cognitive errors by decision makers. This paper examines the potential contributions to health economics of the ideas of behavioral economics. The discussion presented here focuses on the economics of doctor-patient interactions and some aspects of quality of care. It also touches on issues related to insurance and the demand for health care. The paper argues that long standing research impasses may be aided by applying concepts from behavioral economics.

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Behavioral Economics and Health Economics

I. Introduction and Background

If one examines the salient economic institutions of the health sector, one might expect that sector to be a breeding ground for applied behavioral economics. Consider a set of economic activities where addictions figure prominently; where consumers have limited information that they must use to make choices in the context of fear, urgency and trust in an expert; and where the services used are often credence goods (Emons, 1997, Sloan 2001) whose applications are frequently governed by professional norms and habit. In such an economic environment the methods of behavioral economics might be expected to be prevalent in modifying traditional models to take account of these features that appear to conflict with simple notions of rationality in economic behavior. Yet the application of behavioral economics to issues in health economics have been largely confined to understanding addictive behavior around cigarettes, drugs and alcohol (see for example Becker and Murphy, 1988; Gruber and Koszegi, 2001; Lowenstein, 2001; O'Donoghue and Rabin, 1999; and Schoenbaum, 1997).

A. Research Traditions in Health Economics

The line of research on addictions has its origins in research on household production and the demand for health (Becker, 1964 and Grossman, 1972). Decisions about substance abuse involve a set of harmful health choices that appear to represent extreme trade-offs between today's pleasures and tomorrow's health and well-being. A substantial amount of progress has been made in both theoretical analysis and empirical testing of models in this area and a lively program of research that encompasses behavioral economic concepts is underway.

In this paper I will draw on a different research tradition that emanates from the seminal paper by Arrow (1963). The efficiency of health insurance markets, doctor-patient relationships and the role of non-market institutions in promoting efficiency

were raised by Arrow and continue to be central questions in the health economics research program. This side of health economics has received far less attention from scholars armed with the tools of behavioral economics. I will focus on decision making about treatment of illness, rationing of health services and markets for health insurance.

I will argue that behavioral economics may be particularly important for modifying neo-classical approaches because as in many areas of the economy, people appear to make choices about health care that are situation or context specific that result in cognitive errors and failures to optimize. The health sector is also characterized by institutions and decision making circumstances that, in addition to making cognitive errors more likely, create friction that impedes market adjustments that might lead to correction of errors over time (Glaeser, 2003 Mallainathan and Thaler, 2001). These include the stress of decision making about one's health, professionalism, and a lack of information about medical care. The paper is organized into four sections. In this introductory section we set the intellectual context for the review. The second section focuses on physician behavior, which represents a large class of problems in the health sector, where I believe behavioral economics has much to contribute. The third section addresses some puzzles in health economics related to demand behavior and the behavior of health insurance markets. The fourth and final section offers some concluding observations and comments on normative issues in health economics.

B. Arrow and the Health Care Challenge for Behavioral Economics

Arrow's (1963) paper seeks to explain the health sector's institutions as a response to the special features of health care and health insurance. Among the special characteristics are information asymmetry and the significance of medical care in human affairs. The research program that descended from Arrow has produced great understanding of health care delivery. Among the issues at the heart of the research program have been: market failure in health insurance due to moral hazard and adverse selection; the significance of

the non-profit organizational form in health care and the role of institutions such as professional norms, trust and morality in medical markets.

Applying traditional economic models that rely on rational utility maximizing consumers and physicians and efficient market equilibriums has been highly productive both theoretically and empirically and has contributed to the design of public policy in health care (Culyer and Newhouse, 2000). For example, research on hospital payment methods has advanced notably and has been very influential in public policy debates (Newhouse, 2003). Yet, the application of traditional models has also repeatedly faced puzzles that have served as intellectual impasses. It is in attending to such puzzles that the ideas of behavioral economics may be particularly useful in advancing the analysis of health care markets and institutions. In the next section I will focus on markets for physician services and some puzzles found in those markets. I believe that these issues are representative of broader issues in the economics of the health sector.

II. Models of Physician Behavior

Early in his essay Arrow remarked, “It is clear from everyday observation that the behavior of sellers of medical care is different from that of businessmen in general” (p. 949). No area in health economics relies on a vocabulary that is more closely linked to the work of behavioral economics than research on physician behavior. As Pauly (2001) notes, Arrow used words such as trust and morals to discuss physician behavior. These are words that tend to make economists uncomfortable.

Some of the first econometric studies of health care markets took aim at the market for physicians’ services (Feldstein, 1970; Newhouse, 1970; Fuchs and Kramer, 1972). These studies took as their point of departure the competitive model. Each obtained results showing a positive partial correlation between the physician stock in a market and physician prices, a finding inconsistent with the competitive model. These papers set off a line of research on models of physician behavior that continues to this day. The first reactions to the surprising results were to suspect monopoly in the physicians’ market (Newhouse, 1970 and Frech and Ginsburg, 1972). Further analysis found the evidence to

be inconsistent with both monopoly and competitive models. Health economists rapidly developed a set of ad hoc explanations grounded in motivations of physicians that departed from profit maximization. Yet as McGuire (2000) notes, “there is no agreeable alternative” model to that of profit maximization.

Feldstein (1970) sought to explain the apparent departure from simple profit maximization. He argued that physician markets experience persistent excess demand. He proposed that the reason for this is that physicians deliberately set prices below market clearing levels to enable them to choose the most “interesting cases” from among the patient pool. This explanation was not grounded in any evidence about physician motives or the details of medical practice. A second explanation attempted to import an early behavioral economics idea namely the satisficing model (Simon, 1958). Newhouse (1970) and Evans (1973) suggested that physicians might set prices so as to achieve a “target income” in part because maximizing behavior may be seen as socially undesirable. Arrow (1963) first raised this point by observing approvingly that sociologists had argued for a “collectivity orientation” of physicians that would lead them away from profit maximizing behavior. Evans (1974) proposed that the target income level was set relative to the local income distribution.

Careful analysis of the target income model reveals a variety of shortcomings (McGuire, 2000). The basis for establishing the “target” was quite fuzzy. In addition, the “target” is merely an objective. There are numerous ways of hitting the target; the theory does not explain which approach will be taken. A complete model also requires a rule of choice for pursuing the objective. The target income model is typically specified in the context of a monopolistically competitive market structure where physicians choose a price that will achieve a target income and meets demand. This model set up yields multiple equilibria that are unstable, resulting in dramatic swings in prices in response to small changes in physician supply. In sum the target income model might be viewed as a “false start” in linking behavioral economics and health economics.

A different modeling approach introduced the notion of “physician induced demand” in the context of a model of utility maximization. Evans (1974) posited that physicians

create demand for their own services by exploiting their role as an agent for the incompletely informed patient. That is, physicians are imperfect agents in that they will recommend treatment beyond the “patient’s optimum level” in order to gain income. Medical uncertainty and asymmetric information all serve to reinforce this conception of physician behavior. This model treats demand inducement in a manner akin to how advertising is introduced into market models. That is, demand inducement is a shifter in the demand function facing the doctor. The ability to induce demand is also specified as an argument in the physicians’ objective function, so that exploiting the agency relation for self-interest reduces physician utility.¹ This device serves to constrain an otherwise unbounded ability to shift demand.

While intuitively appealing given the importance of the agency relation between physician and patient, little research has been done to understand the forces underlying the ability to induce demand as proposed in these models (McGuire, 2000, Reinhardt, 1978, Fuchs, 1978). Most discussions of demand inducement appeal intuitively to notions of medical ethics and trust between doctors and patients; poor information, fear and anxiety on the part of patients; and uncertainty in medical choices. The behavioral economics literature has explored how some of these circumstances and others affect decision-making and economic behavior (Rabin, 1998). Demand inducement might well result from a number of psychological features of doctors and patients operating in health care markets. There are a number of additional constructs in behavioral economics such as self-serving behavior, wishful thinking and the impact of the desire by patients to avoid regret that might contribute to what appears as demand inducement (Rabin, 1998 and Thaler, 1980). The application of these concepts leads one to consider in greater detail the nature of physician-patient interactions in the context of models of physician decision-making.

A. The Economics of Physician Decision Making

¹ Some modeling efforts also assign a pecuniary cost to demand inducement in the context of a profit maximizing model of physician behavior (Stano, 1987).

Physicians are highly educated and skilled professionals that are motivated to serve their patients to improve their health and well-being. They are also frequently in positions where they face great clinical uncertainty and must persuade patients to pursue one clinical course over others. Physicians have been shown to be creatures of habit in making medical choices, and are slow to adopt new practices and technologies that would improve the quality of care and in turn their patients' health (Institute of Medicine 2001). Specifically, a series of studies have shown that in treating conditions like Otitis Media, Diabetes, Depression, and Asthma physicians regularly depart from evidence based practice (Institute of Medicine, 2001; Appendix A). This runs counter to what one might expect from market models that assume either profit maximization or maximization of a physician objective function that might include patient health benefits and income as arguments.

For example, physicians in the United States do not gain financially based on the specific drugs they choose to prescribe for their patients. Therefore one might expect physicians to choose the most cost effective drugs on behalf of their patients thereby serving as a "perfect agent". Yet physicians have been observed to be habitual in their choice of pharmaceutical agents, relying on drugs they became familiar with in medical training or learned about through pharmaceutical promotions (Scherer, 1993). This has meant a reluctance to use more effective new drugs or lower cost versions of older drugs (generics) (Hellerstein, 1998). Also, physicians have been slow to use drugs that have been widely shown to improve health outcomes such as beta-blockers for patients following a heart attack (Institute of Medicine, 2001).

Health economists attempting to address such puzzles have frequently appealed to the costs of learning about new drugs and procedures. Empirical research on the simplest substitution choices in prescription drugs, that between branded and generic versions of the same drug, show great heterogeneity in willingness to substitute that is unexplained by factors clearly associated with experience or learning costs (Hellerstein, 1998). Thus, simple extensions of the profit or utility maximizing models have not produced satisfactory explanations of basic clinical choices.

B. Models of Maximization, Uncertainty and Information Asymmetry

A hallmark of medical decision-making is choice under uncertainty. Arrow's (1963) paper begins with this premise. Microeconomic models of physician decision making that follow in the tradition of Arrow recognize that there is uncertainty about the effectiveness of any medical technology and there is heterogeneity in patient responses to treatment and preferences about care and how the process of care will unfold. In this section a simple model of physician behavior is set out that will enable us to examine some potential contributions of behavioral economics to modifying the model. I adopt the model of physician behavior and notation of McGuire (2000) in his review of *Physician Agency*.

A patient is assumed to benefit from the receipt of medical care (m) according to the function $B=B(m)$ where $B'>0$ and $B''<0$. The negative second derivative occurs because of diminishing marginal utility of health status and because the health production function $H=H(m)$ has a negative second derivative. We can therefore restate the benefit function to capture both of these effects as $B(m)=V(H(m))$. Generally, it is assumed that $V''<0$ which implies risk aversion.² McGuire (2000) introduces uncertainty as a simple additive term to the health production function $H(m)$. In an uncertain medical decision making context, a patient's benefits from medical care are viewed as expected benefits:

$$(1) E[B(m, u)] = E[V(H(m)) + u]$$

where u is a random error with mean 0 and variance σ_u ³. One implication pointed to by McGuire (2000) is that if the degree of absolute risk aversion is decreasing in income the expected benefits of using medical care, m , rises with the level of uncertainty (σ_u). The implication of this observation is that patients will appear to demand "too much" medical care when judged in terms of ex post marginal contributions to health outcomes. The

² The application of prospect theory and the use of reference health levels is relevant here. However, an extensive discussion of this point here would distract from the main point which concerns the physician-patient interaction.

³ The additive specification of m is a simplification that aides tractability of the model. H is more likely that u and m co-vary.

excess use of medical care can be seen as an attempt by uncertain patients to protect themselves against uncertain medical care.

Markets for medical care are not only characterized by uncertainty but also by asymmetric information between physician and patient. Most approaches to paying doctors in medical markets implicitly assume that outcomes are “non-contractible”, that is it is impractical to pay doctors on outcome (Dranove and White, 1987).⁴ Thus most health care markets make use of payment arrangements where doctors are rewarded for performance through retention of patients or by attracting new patients. The vast majority of physician services are paid for either via capitation contracts (per person per year payment) or under fee for service arrangements. In either case, the physician is rewarded for having a higher volume of patients seeking his or her services (Kaiser Family Foundation, 2003). Thus if patients choose doctors or decide to stay with doctors based on performance then physicians will have an incentive to undertake unobserved actions to improve quality and performance.

Because the health production function is affected by service delivery, physician effort and other factors, an individual patient’s observation of performance does not allow them to easily identify the level of effort supplied by a physician. This agency problem has been a long-standing concern of health economists. Asymmetric information is captured in McGuire’s (2000) formulation by restating the benefit function to include physician effort, $B=B(m, e, u)$ where e represents physician effort. It is assumed that e is not observable and therefore non-contractible. So the patient is assumed to know the relationships in $B()$ and to observe m and the outcome of treatment, B_o . A patient is assumed to make Bayesian decisions⁵. Suppose we consider a situation where a physician’s effort can be characterized as a simple dichotomous act. For example, a physician can read the literature on treatment for a condition presented by the patient.

⁴ It may also be inefficient because paying on outcomes may heighten already existing selection incentives. Nevertheless there is a growing interest in examining pay for performance schemes.

⁵ This is an “as if” assumption that allows this problem to be modeled as a principal agent problem with Bayesian decision makers. As will be discussed below this characterization is a focal point for potential contributions or behavioral economics.

The Bayesian patient can make an inference about e based on observing m and B_0 ⁶. The inference can be viewed as a likelihood that a high level of effort was taken, $L_1(B_0, m)$. The likelihood that the proper effort was not taken is $L_0 = 1 - L_1$. The physician's profit maximization problem with asymmetric information can be described as follows:

$$(2) \pi = n(L_1)\{R + (p-c)m\},$$

where n is the number of patients seen by the physician and the term in the second set of brackets is a general statement about revenue and costs that encompasses the continuum of payment arrangements commonly used to pay doctors. These range from a capitation payment where $R > 0$ and $p = 0$ to fee for service payments where $R = 0$ and $p > 0$. If the patient infers that effort $e = 1$ and believes that the physician will typically undertake the desired effort then observing outcome will provide useful information. In this model incentives for quality care (high level of effort) are created by the demand response $n(\partial n / \partial e)$. It is also important that the payment systems are set up so that physician earnings are affected by the demand response to inferences about effort levels taken by the physician.

The degree of demand response is central to determining the efficiency of health care markets. The model summarized above, for example offers an underpinning to the demand inducement model discussed earlier (Dranove, 1988). That is, the doctor might misrepresent information to a patient leading them to believe the marginal product H' of a particular course of treatment is higher than it is in reality. The result is a higher level of demand for m , than is efficient. This approach is similar to that taken in the optimal fraud literature and presumes a manipulative physician acting in a calculated self interested manner even at a possible health cost to the patient. McGuire (2000) and others note that medical treatments frequently involve a sequence of interactions between doctor and patient that may allow a patient to learn about outcomes during the course of treatment. This may permit a patient to respond to physician actions in a manner that rewards effort.

⁶ The model focuses on effort in this initial formulation. As we discuss below this model is easily extended to deal with a larger set of issues such as quality and choice or technology.

A different modeling tack assumes that quality is an attribute of the physician that is not a matter of choice during a patient encounter. That is, e is a fixed attribute. This type of model has been used as an alternative to models of physician induced demand (Pauly and Satterthwaite, 1981). The implication of this view is that doctors are an experience good that can only be judged by sampling by a consumer or a trusted source of information (friend or family). Thus in markets where there is a higher concentration of physicians, less may be known about any one physician which may result in establishing market power for a doctor that is known to a patient. The implication is that an individual physician's demand curve is steeper in markets with more doctors allowing them to charge higher prices. Such a model is used to explain why prices for physician's services are higher in markets with more physicians without resorting to demand inducement. Why adding a physician to the choice set would necessarily dilute information except in an average sense is unclear. For example, why would I know less about my doctor because other doctors moved into town? The approach illustrates how health economists have gone to considerable lengths to adapt the standard model to stylized facts in the health care market place.

C. Behavioral Economics and Models of Physician Behavior: Possible Directions

Behavioral economics has frequently raised questions that go to the heart of the model set out in equation (2) above: $\max \pi = n(L_1)\{R + (p-c)m\}$. Patient demand response is key to the transmission of incentives. The model posits that patients will choose a physician based on Bayesian inferences about effort made by the doctor. This requires that patients form a prior about a doctor's willingness to exert effort (an initial impression prior to contact), engage in an updating process (following an initial contact) that assumes separation between previous judgments about the likelihood that high effort is undertaken and the evaluation of new evidence from, say, a new episode of care (Camerer and Lowenstein, 2003). The health sector offers a unique institutional environment within which to view these decisions. When the institutional arrangements are combined with key concepts from behavioral economics a new view of market outcomes in the health sector begins to emerge.

C.1. Formation of Priors

Consider how people make choices about physicians and the sources of information used to make judgments about the quality of a physician. How patients obtain information about doctors prior to an initial contact and how referrals are obtained play central roles in the formation of priors about doctor quality and willingness to exert effort. Most patients are close to fully insured; carrying cost sharing of 20% or less for physician services. The health sector in recent years has been characterized by expanded public availability of information on provider performance. State governments have published performance data on surgeons and hospitals. Local magazines and newspapers regularly report lists of top ranking physicians. The Internet has increased the availability of information on hospitals, physicians and their practices. This expansion of information is part of a deliberate strategy to boost consumerism, improve market efficiency and presumably quality in health care (Shaller et al, 2003). Yet recent surveys of consumers show that 70% of people have not seen any information on the quality of providers (Kaiser Family Foundation, 2000). These same surveys reveal that 70% of people report that they rely on family and friends and 65% on their usual physician as their most reliable sources of information on other providers of health care and their quality. In addition, patients report that they prefer providers with whom they are familiar. For example, 76% of survey respondents say they would choose a surgeon that they are familiar with over one that was more highly rated by experts such as state government or accrediting organizations.

The implications of these data are that the basis upon which priors about quality and performance are formed is the recounted experience of friends and relatives and to a lesser extent a regular doctor. Patients also put great weight on familiarity with a physician, presumably based on a relatively small number of positive interactions. In the case of choosing a primary care physician the reliance on friends and family is likely to be more important since the choice suggests that there may be no regular doctor or that the relationship with the regular physician may not be satisfactory. This decision making context is ripe for the types of situational influences on economic choices that are the focus of behavioral economics.

Tversky and Kahneman (1973) refer to an *availability heuristic* to describe the reliance on more vivid or memorable evidence to construct a prior about the probability that a physician is high quality or will exert adequate effort. Akerlof (1991) calls the phenomenon salience. Given the data cited above it is likely that personal reports will be relied upon over examination of systematic information collected on health care qualifications or performance. Personal testimonials on the multidimensional service provided by physicians will be far more available than any systematic data reporting system. Reliance on reports from family and friends may create distortions in perceived quality because of what is most memorable in personal reports. Consumers of health care have been shown to be good reporters of certain attributes of care and weakly aware of others. For example, patients have been shown to accurately report information on whether a physician was respectful, attentive, clear in explaining clinical issues and operated a clean and efficient office. These same patients were found to be inaccurate in reporting of the technical quality of care. That is, they were not accurate in judging whether a physician supplied appropriate evidence based treatment (Edgman-Levitan and Cleary, 1996). It has also been shown that the dimensions of care that consumers understand and can accurately report are not highly correlated with so-called technical aspects of quality care (Cleary and Edgman-Levitan, 1997). The implication here is that patients will commonly develop a prior about a primary care physician by relying on reports from family and friends that will be based on observations about some dimensions of medical care and perhaps not on the dimensions that most directly affect their health outcomes. Applying notions of an availability heuristic that focuses on one dimension of physician performance in the formulation of priors on quality expands the conception of demand and demand response in markets for physician services. This offers one promising avenue for better linking market models to the observed behavior in health care.

The decision-making environment in health care also offers a context where the formation of priors about providers of medical care may be subject to the “law of small numbers” bias (Rabin, 1998; Rabin 2002). Rabin (2002) explains that when economic agents believe in the “law of small numbers” they over interpret the extent to which

information from observing a small number of events reflects the experience of the “population” from which those events are drawn. In the case of medical markets, priors about a physician may be formed based on reports from friends, family and physicians. The reports from friends and family will typically be based on a relatively small number of encounters with a medical professional. Referrals from a physician may also be based on a relatively small number of experiences.⁷ In fact, health care consumers regularly report that they have greater confidence in sources of care that are likely to rely on small numbers than they do sources that rely on large representative samples such as accreditation agencies and health plan sponsors. National survey data also suggests a high degree of confidence by consumers that they have sufficient information to make the “right” choices about medical procedures and providers. Eighty-one percent of consumers stated they had enough information to make the right choice about a treatment option and 79% said they had enough information to make the right choice of doctor (Kaiser Family Foundation, 2000).⁸ A key implication of a model that views consumers as believing in the law of small numbers is that priors will reflect too much confidence in an opinion formed about the quality or performance of a health care provider (Rabin, 2002).

C.2. Updating Priors

The Bayesian consumer is assumed to assess new evidence on the performance of a health care provider independently of the established priors on the quality of a provider. This feature of the model applies to physician encounters that are repeated such as those with a primary care physician or a specialist treating a chronic illness. The contrasting case is a specialty surgery, where the physician choice would not involve an updating process. Health care markets are characterized by a set of institutions and circumstances that might lead consumers to filter information so as to conflict with the Bayesian

⁷ Physicians are generally not well trained in statistics and may not be well equipped to make use of the data that might be available to them. For a lively description of physician training and cases of clinical decision making see Gawande (2002).

⁸ It is worth noting that these data are based on telephone surveys and the questions are general in nature. Patients tend to give somewhat different answers when asked about specific procedures and cases. Nevertheless, evidence from multiple sources suggests the people have confidence in the advice and information they can get on medical matters.

updating assumption. Arrow (1963) notes that *trust* is a central feature of the physician-patient relationship. Giving trust this important role stems from the uncertainty and vulnerability of the patient. Trust is offered up as a non-market institution that increases efficiency by reducing the disutility and inefficiency from the uncertainty and the anxiety of illness, as well as the agency problems associated with the asymmetry of information between doctor and patient.⁹ The health sector is replete with complementary institutions that aim to increase trust between medical providers and patients. These include a code of medical ethics, medical education, professionalism, licensure, and in the case of hospitals, non-profit status. Trust is also recognized as an ingredient of treatment affecting the well-being of a patient.

Studies of the prevalence of trust show that patient trust in their doctors remains very high across income, demographic and health related social strata (Hall, 2001). Some psychological research on the doctor-patient relationship shows a willingness to interpret data showing poor outcomes of treatment as unavoidable events beyond the physician's control (Ben Sira, 1980). This raises the question of how patients will use new information to make inferences about the physician effort parameter in the benefit function $B=B(m, e, u)$. Recall that in the model of physician-patient interaction set out above the Bayesian patient estimates the likelihood that appropriate effort will be taken, $L_1(B_0, m)$. Thus we consider how this likelihood will be formed? The filtering function of the trust relationship is related to what Rabin and Schrag (1999) refer to as *confirmation bias*. For example, does the confidence in a physician generated by a referral from a trusted friend relative or physician (the prior) serve as a filter for interpreting new information about a physician? Applying a quasi-Bayesian updating process (i.e. efficiently applying Bayes rule to biased information) like that proposed by Rabin and Schrag would result in patients misinterpreting certain outcomes as not being a reflection of physician quality or the level of effort exerted. The misinterpretation of physician effort or quality would most likely stem from erroneous interpretation of treatment outcomes or misperception of the nature of the production function for health. Extant literature in health psychology points to patients' perceptions about the production

⁹ One recent paper by Koszegi (2003) shows how patient anxiety can interfere with a patient obtaining relevant medical information and ultimately result in inefficiently low levels of treatment.

function as being potentially key in confirmatory bias in drawing inferences from poor outcomes by a trusted physician.

Core concepts in behavioral economics seem to fit well with institutions that govern the flow of information and evidence on the manner in which patients use information to make choices. The psychology of forming priors and Bayesian updating, discussed above, points to hypotheses about the nature of demand response to quality signals in markets for medical care. One hypothesis that emerges from applying behavioral concepts to the formation of priors is that the quality signal based on extant market information or even improved public reporting of quality may not yield strong demand response to quality signals as has generally been assumed. The normative implication is that improved information may not result in an efficient quality equilibrium in the market unless some other institution is introduced that overrides the type of patient decision making we have described (e.g. employers guiding provider choice based on systematic data). Integrating behavioral economics into models of physician behavior would result in different specifications of econometric models of physician services. For example, the degree of demand response might be expected to depend on how patients reach a physician. Those who were referred by family or a physician would be expected to respond differently to quality signals than those referred by a health plan or the local medical society.

D. Behavioral Economics and Supply Response in Treatment

“Medicine is, I have found, a strange and in many ways disturbing business. The thing that still startles me is how fundamentally human an endeavor it is.” Gawande (2002)

Embedded in the model of physician behavior set out above is a process by which a physician chooses among a complex set of possibilities to treat a particular patient or type of patient. A physician’s choices (assuming profit maximization) depend on her view of the production function, which also has been characterized as a Bayesian learning process (Phelps and Mooney, 1993). These models recognize the institutions through which physician learn after completion of their training. Key sources of learning are from peers

with whom a physician practices (partners, fellow employees, peers on a hospital staff), continuing medical education courses, pharmaceutical promotion personnel, and medical journals. Application of traditional Bayesian updating models has emphasized local sources of information because they are asserted to be low cost sources of learning (Phelps, 2000). These models have been used to explain the persistent variation across geographic areas in the use of medical procedures that cannot be explained by patient illness characteristics, demographics or indicators of preferences.

For example, 1999 Medicare spending was \$9,941 per enrollee in Miami, Florida and \$4,886 in Minneapolis, Minnesota. The difference cannot be accounted for by health or demographic factors such as age, gender and race or differences in medical care prices. Instead the spending variation is mostly due to more frequent physician visits, diagnostic tests, and hospitalizations and procedures (Wennberg Cooper et al 1999). Consistent with this Phelps (2000) reports coefficients of variation in hospitalization rates across New York State. He shows that coefficients of variation for conditions such as pediatric otitis media, depressive neurosis, and chronic obstructive lung disease were 0.49, 0.42 and 0.35 respectively. These contrast with services where little discretion can be exercised such as heart attacks where the coefficient of variation was 0.12.

In the Bayesian updating model of physician choice of treatment technology, the prior about the appropriate use of a particular procedure to treat a specific illness (e.g. C-Section for deliveries) is formed in medical training (medical school and residency) according to the observed share of total cases of a given illness treated with the procedure. The physician is then assumed to combine new local observations with prior information, giving each case equal weight to form the posterior distribution. The result is a weighted average of accumulated observations from medical training and subsequent practice. This model can be used to explain how a “local style” of medical practice can persist and why adoption of new treatments may be slow.

In this model it is assumed that the Bayesian physician over weights information from local sources or that data from medical Journals or medical conferences get ignored or are given little weight when assessing the use of medical technologies. Phelps and Mooney

(1993) argue that low cost local sources of information are emphasized. They also note the importance of personal advice from colleagues about how to apply specific medical techniques. This latter point is consistent with the *availability heuristic*, where people tend to over emphasize more vivid personal descriptions of successes and failures than perhaps more representative reports of data from the literature.

Another behavioral construct that is potentially relevant for understanding why local opinions should receive such high weight is the notion of *regret* (Thaler, 1980). Physicians commonly must choose from among many competing approaches to treating a particular condition and trusting patients rely centrally on the recommendations of the physician. This makes the physician largely responsible for the consequences of the complex choice. Moreover, these choices are commonly made under considerable time pressure. The typical physician visit is about 15 minutes. Thus the potential for regret is high and the physician has incentives to attempt to lower the *responsibility costs* of medical decision-making. One institution that has long been recognized as an important influence on physician behavior is the professional norm (Arrow, 1963). In this case the norm might be viewed as the local approach to treatment that a physician can point to as guiding her choices. In the event of a poor outcome the physician that practices according to local norms can note that they followed standard operating practices whereas they could more easily be individually tied to a choice if they departed from local practice (Thaler, 1980). Giving great weight to local data therefore reduces responsibility costs and might therefore help explain the particular way that Bayesian updating works in medical decision-making. These behavioral influences on decision-making are reinforced by local health plan attempts to affect practice patterns through local profiling of physicians.¹⁰

This Bayesian physician decision model has been coupled with ideas about how innovations take hold to also explain the establishment and persistence of geographic differences in patterns of treatment. The existence of this variation that is unexplained by

¹⁰ In recent years American health plans have begun to use a limited number of national indicators to set performance norms for profiling. The majority of practice patterns profiled remain based on local practice norms (averages).

patient characteristics or outcome implies substantial differences in economic welfare across markets that are not competed away. While not formally acknowledged, ideas from behavioral economics are at least casually invoked in some of this literature. In one example, Phelps (2000) speculates about why different markets might differentially perceive the value of a new medical technique. He proposes that a physician innovator might be exposed to a new technique through the medical literature or by attending a conference. She tries out the new technique on 20 cases and then makes a judgment about whether the new technique is “better” than existing treatment methods. Phelps (2000) notes in passing that the physician may not be entirely unbiased because they are invested in the new method. This scenario highlights the potential relevance of the law of small numbers in creating very different views of a particular medical procedure across geographic areas based on a tendency to over interpret the results from a small trial. It also suggests the potential role for confirmatory bias or filtering of data among physician innovators and adherents of older methods. These ideas can be applied to a Bayesian model of decision making to help explain the high degree of variation in patterns of treatment across geographic areas and the slow adoption of many new and effective treatment technologies.

The empirical implications of this line of thinking leads to the view that data reflecting a physician’s own experiences and those of the immediate community would be important to include in econometric analyses of physician treatment patterns. These factors may also be important in understanding diffusion of new technologies and reduced use of dominated technologies (sometimes referred to as exnovation). Such measures have typically not been included in econometric models of physician behavior.

E. An Application

A recent natural experiment highlights the potential contribution of the ideas set out above. In 1989 the New York State Department of Health initiated a program that would use market forces to improve the quality of care for Coronary Artery Bypass Graft (CABG) surgery. The idea was that by improving the standardization, reliability and availability of information on physician and hospital specific outcomes, consumers who

are largely insured would be better equipped to make choices based on performance. That is, demand response to outcome signals would discipline low performing providers of care and would improve quality of care. The State Department of Health developed a very detailed approach to “risk adjustment” of mortality outcomes for both physicians and hospitals so that outcomes would be standardized for systematic patient mortality risk.¹¹ Beginning in November 1992, mortality data were released publicly on surgeons performing 200 or more operations per year at one hospital. The Department of Health took great pains to inform the media on issues of quality improvement and interpretation of risk adjusted mortality rates. The surgeon specific mortality rates were published in major newspapers including the New York Times and Newsday.

Two initial observations were made that pose a puzzle for health economists. The first is that risk adjusted mortality rates associated with CABG declined from 4.17% in 1989 to 2.45% in 1992 (Chassin, Hannan and DeBuono, 1996). The second is that no demand response was observed. There were no significant shifts in patient volume from surgeons and hospitals with relatively high mortality rates to those with low rates (Schneider and Epstein, 1998). Initially this was thought to be a result of the low awareness of the mortality reports among the public. Subsequent analyses that reexamined patient volume changes at later points in time when public awareness of the mortality data was higher show no evidence of significant demand response to the new information.

Little attention from health economists has been accorded the demand response result that represents a challenge to basic models of quality competition in health like the one set out above and that of Dranove and Satterthwaite (1992). Some facts about doctor-patient roles in decision-making suggest some direction for applying behavioral economics ideas. Data reported above and elsewhere suggests that patients place the greatest weight on recommendations of friends, family and primary care doctors. The patient appears to become even more reliant on the known professional when making choices about treatments for severe medical conditions. Research on the division of labor

¹¹ Risk adjustment refers to the statistical standardization of mortality rates so as to account for the severity of illness and the ability of patients to recover from surgery. Details of the risk adjustors used on New York appear in Chassin, Hannan and DeBuono (1996).

in medical decision making shows that for medical conditions such as breast cancer and colorectal cancer, the majority of patients prefer the physician to make the treatment decision (78% for colorectal cancer and 52% for breast cancer). In addition, only 20% of the breast cancer patients wanted to be actively involved as opposed to sharing decision-making (Beaver et al, 1999). This research also shows that when faced with major procedures such as surgery, patients often prefer to be informed but want the physician to make key treatment decisions. In fact a substantial number of patients report being pushed into more active roles in decision making than preferred. Such evidence is consistent with the importance of trust in forming priors and the idea of *regret* as a limiting factor in people playing an active “consumer” role. Patients frequently appear not to want to carry the consequences of having made a choice if outcomes are poor.

Economics research has instead focused on selection incentives on the supply side and how the reduction in mortality observed should be interpreted (Dranove, Kessler, McClellan and Satterthwaite, 2002). The arguments advanced have been that physicians are risk adverse, presumably to a loss of reputation, and as a result will avoid more risky patients. This is possible because of imperfections in the risk adjustment mechanism. As a result physicians are less willing to perform surgery on the most severely ill patients. The result is a misleading inference that mortality declined due to improved quality based on the simple morality trends.

The empirical analysis performed by Dranove and colleagues offers evidence consistent with the hypothesized selection behavior. Controlling for selection they show a reduction in patient severity of illness accompanied by a spending increase. (It is worth noting that other analyses of the New York experience show that nearly 1 in 5 doctors with low performance ratings (bottom quartile) left the practice of cardiac surgery in New York State, which implies an alternative explanation of the observed data (Jha and Epstein, 2004)). Dranove et al (2002) interpret the evidence as pointing to a loss in welfare. To make this interpretation they presume that prior to the reporting initiative the sickest patients were being appropriately treated. An assumption not clearly supported by evidence. The analysis therefore asserts a type of reputation maximizing behavior that dominates concerns about the well being of the sickest patients. Another interpretation

might be that the public reporting of data led physicians to re-weight how they use information that comes from sources other than their own or the immediate local experience. This could well generate observations consistent with selection and the observed compression of variance but might have a less depressing normative conclusion. This might be the case if at baseline physicians were offering CABG to “too many” very sick patients.

F. Additional Directions: Medical Decision Making

One prominent theme in health policy that has only begun to get careful attention from economists is the issue of disparities in treatment and health care utilization according to race and ethnicity (Institute of Medicine, 2002). Balsa and McGuire (2003) suggest a behavioral approach to modification of the type of model of physician-patient interactions discussed above. They propose a central role for a *stereotyping heuristic* that is used by physicians that face important time constraints and must quickly make assessments of complex clinical circumstances. Such a heuristic can offer an efficient method of making uncertain judgments with limited information. It can also result in important errors. Because personal attributes and health habits are typically important for deciding upon a course of treatment the use of stereotypes might be particularly distorting of clinical choices. For example, physicians have been shown to hold beliefs that African-Americans patients are more likely to abuse drugs and less likely to comply with recommended treatments than are otherwise similar (with respect to socio-economic characteristics) white patients (van Ryn and Burke, 2000). The fact that physicians hold such beliefs potentially affects the nature of the efforts that physicians take in administering a particular treatment because judgments about patient compliance, for example, influences expected outcomes.

A second area of application involves the complexity of the medical practice. American doctors practice in an environment where they treat patients associated with a wide range of insurance arrangements, meaning that the patients face different out of pocket prices for differing services and doctors are compensated in a variety of ways. For example, a physician will typically encounter 15 or more different formulary

arrangements that define which prescription drugs are paid for and how.¹² In addition they will face similar numbers of compensation schemes, bonus arrangements, quality reporting methods and patient cost sharing rules. A recent analysis by Glied and Zivin (2002) shows that physician behavior is not consistent with simple maximization models. They examine physician choices about intensity of treatment as measured by duration of visits, tests orders and medications prescribed. Their results show that physicians respond to incentives but not necessarily to the incentives of the marginal patient. Glied and Zivin report that the intensity of treatment received by a given patient has as much to do with the payment incentives associated with other patients in the practice as their own.

Doctors appear to alter their “practice styles” as the composition of payment incentives shift. One behavioral phenomenon not yet discussed concerns the role of fairness. Physicians may put considerable value on treating all their patients according to the same criteria.¹³ Similar patients should get similar treatment.¹⁴ If physicians have a collectivity orientation (possibly reinforced by professional norms) as proposed by Arrow, then treating patients similarly may have intrinsic value and may constrain how a physician can respond to heterogeneous incentives in payments. Kahneman, Knetsch and Thaler (1986) explore how notions of fairness constrain profit-maximizing choices. The notion that there are established standards or entitlements that are internalized by physicians and these influence the supply responses to heterogeneous incentive

¹² A formulary is a list of drugs and a set of rules regarding their use and how a health plan will cover and pay for dispensing of specific drugs.

¹³ This idea is intertwined with the ideas of trust noted above. The essential role of trust by patients in their health care providers and professional norms are seen as efficient non-market responses to information asymmetry and contractibility limitations in health care markets. The importance of establishing a “trust” relationship creates incentives for the provider to not appear to pursue an obvious optimizing behavior for either doctor or patient. Arrow observes the following.

“To justify this delegation the physician finds himself somewhat limited, just as any agent would in similar circumstances. The safest course to take to avoid not being a true agent is to give the socially prescribed “best” treatment of the day. Compromise in quality, even for the purpose of saving the patient money, is to risk imputation of failure to live up to the social bond”(Arrow, 1963, p.966).

¹⁴ This model at first blush conflicts with the discussion of disparities. However, one could assume that rationing would occur based on perceived clinical need and disparities arise from the application of stereotypes and the perception of different needs by racial group.

arrangements constitutes an extension to the ideas of how fairness constrains profit seeking.¹⁵

Another tack that may complement the idea of incorporating fairness into models of physician behavior is that of applying a heuristic in the face of a complex environment where it is costly to optimize. Fairness in this manner would contribute to the choice of *rules of thumb* in responding to the daunting array of payment arrangements commonly faced by medical practices (Conlisk, 1996).

III. Health Care Demand and Insurance

This paper has focused primarily on markets for physician services, in part because they serve as an excellent model for a large class of health sectors issues related to the supply and demand for treatment under conditions of asymmetric information and uncertainty that are prevalent in the health sector. There are also other issues in health economics where traditional models of economic behavior have not resolved some important puzzles and may productively lend themselves to the application of behavioral economics. I raise several puzzles that relate to demand and health insurance to illustrate the possibilities.

A. Demand for Medical Care

In the discussion of physician behavior considerable attention was devoted to consumer demand for individual physician services. Here we briefly identify several other issues in the demand for health care where behavioral economics may have a constructive role in aiding to explain persistent puzzles. It is commonly observed by health policy analysts concerned with efficiency and quality that there is persistent overuse, under-use and inappropriate use of care (IOM, 2001). The discussion of physician behavior offered some explanations for what has been termed overuse and inappropriate use of services. The demand side sources of “under use” that are commonly used in the health sector rely primarily on factors such as externalities as is the case with

¹⁵ It should be noted that these observations relate to an older literature concerning the so-called norms hypothesis in medical decision-making.

the demand for vaccines or lack of insurance. The existence of external effects results in inefficiently low levels of demand even when vaccines are made available at a price of zero. The policy response is to install some coercive measures such as requiring childhood immunizations to be documented as a condition of entry into school. Another major source of under use is the existence of financial obstacles. However, under use exists in insured populations. In the absence of externalities understanding the demand side of under-use in the context of a nearly fully insured population is more difficult.

Existing literature on demand for health care offers several directions for studying the issue of under use of medical care. One line of research incorporates ideas of stigma into the preference function in a fashion that gives stigma the role of a “price”. Research on the demand for mental health services and treatment for HIV related disorders are cases in point (McGuire, 1981; Frank and McGuire, 2000). In these models getting treatment serves to reveal a stigmatizing condition thereby imposing an additional cost on the patient if they get care. Stigma has been used to explain the low rates of treatment among people with mental disorders (e.g. 27% for people with depression and about 50% of people with schizophrenia).

A new approach to understanding demand behavior draws upon research in behavioral economics by Caplin and Leahy (2001). Koszegi (2003) makes use of Caplin and Leahy’s psychological expected utility model where mental states that affect utility are influenced by both beliefs and observed outcomes.¹⁶ Information affects beliefs and in turn the mental states that are related to utility. Koszegi uses this framework to show how anxiety might affect the demand for specific information, tests and treatment. He identifies a trade-off between seeking treatment and obtaining information. Information, for some patients, can create lost utility from anxiety if the news is bad but having more complete information enables a patient and their doctor to more optimally choose a treatment strategy. Depending on the net contribution of the information to utility a patient will demand contact with providers and information about their condition. Not having all available information can cause anxiety in other patients. Applying models of

¹⁶ Another recent application of this approach takes on a normative issue related to the under use of diagnostic tests related to HIV disease. See the recent paper by Caplin and Eliaz (2003).

consumer behavior that incorporate anticipatory feelings into quasi-Bayesian updating models about how medical information and associated physician contacts are used and in turn affect demand for services has the potential to address a range of “under use” problems such as non-compliance with treatment regimens (Lowenstein, 1987).

A third direction for studying demand is suggested by observations made by decision scientists that have attempted to study health utility states. They have noted a rather dramatic ability of people to adapt to changing health states. That is, people who develop significant chronic conditions (e.g. diabetes, strokes, limited mobility) tend to rate their well being at levels similar to that of the general population. The usual specifications of preferences propose inter-temporal and an inter-state stability in preferences.¹⁷ These observations suggest a somewhat different process than that studied in hyperbolic discounting (Thaler, 1981). Modeling adjustment to health states may contribute to explaining behavior with respect to hospice care, end of life care and the use of advance medical directives.

Unrelated to issues of “under treatment” is a demand side puzzle that has come to light in recent studies of demand response to different drug formulary designs (see for example Huskamp et al, 2004). Those studies estimated demand response to changes in the relative prices, created by implementation of a formulary design change, for different drugs within a therapeutic class (e.g. Proton Pump Inhibitors). Several therapeutic classes were studied. Some classes contained drugs that were found in clinical studies to be highly substitutable in production (they produce comparable clinical benefits and have similar side effect profiles), while others are considered more heterogeneous and less substitutable. Estimated demand responses across classes were generally quite modest and of similar magnitude across therapeutic classes. In particular, the demand response for Proton Pump Inhibitors (a treatment for gastritis) was small; even though studies of the clinical properties of those drugs indicate that they are highly substitutable in production (Wolfe, 2003). Moreover, physicians appear to view these drugs as clinically similar. The implication is that consumers are reluctant to change drugs. Why should

¹⁷ Kahneman (2003) notes some key limits on the ability to interpret self reported well being. Nevertheless, a variety of approaches to measuring quality of life and well being show the same result of adaptation.

consumers be unresponsive to substantial relative demand price differences (100%) given the evidence on the high degree of substitution in production?

The parallels between the observations made in the preceding paragraphs and the theoretical and experimental research on reference levels and status quo bias is striking (Knetsch, 1989; and Samuelson and Zeckhauser, 1988). It appears that the initial choice of products affects preferences even in the context of low transaction costs and high degrees of similarity in product attributes. This may explain why pharmaceutical promotion relies so heavily on providing free samples that are commonly used by physicians to start a patient on a new drug regimen. Models of demand for prescription drugs might therefore profitably incorporate information on the history of individual product use. Such considerations have been allowed for when empirical studies of demand response examine new prescriptions separately from refills. The normative implications are potentially significant in that evidence of such preference structures would potentially constitute a rationale for the design of formularies that override consumer preferences. Closed formularies, which will only pay for drugs on the list of preferred products, represent one mechanism that would override consumer preferences and cause a shift to a new reference or status quo product.¹⁸

B. Insurance Design

One puzzle from the health insurance markets that has received some treatment from behavioral economics is that of why insurance plans with close to first dollar coverage dominate health insurance markets. Economists have long been concerned with the nature of the trade-off between moral hazard and risk spreading (Zeckhauser, 1970). The fact that health insurance markets persistently have equilibrium policies with levels of cost sharing that approximate first dollar coverage is puzzling in that there appears to be a surprisingly high willingness to pay for the least valuable forms of insurance protection.

¹⁸ It is interesting to note that most U.S. private health insurance limits choice to a significant extent and about 30% to 40% of people have no choice of health plan.

Thaler (1980) addressed this issue by appealing to the idea of *regret*. He argued that insurance features such as deductibles that force consumers to trade-off medical care use for money impose important psychic costs because of the potential for regret. In order to avoid making trade-offs that they might later regret consumers are posited to demand health insurance designs that allow them to remove themselves from making such choices. The result is an increased willingness of people to pay premiums to obtain first dollar coverage.

Finally, a question related to the use of markets to purchase health insurance. A long standing debate in health policy and health economics involves the trade-off between the efficiency gains from competitive insurance markets and the losses that stem from adverse selection (Cutler and Zeckhauser, 2000). The empirical health economics literature offers evidence of both substantial price reductions when competition is intense and large losses from adverse selection (Cutler and Reber, 1998). There is a presumption in much of health economics that more choice is better. In fact the *de facto* model of health care delivery in the U.S. and other nations is that of “managed competition” (Enthoven, 1988). The assumption is that consumers find the right health plans and that overall the net gains of wider choice are positive.

At the same time consumers appear to know little about health plans in their choice sets. Recent consumer surveys suggest that only about 36% of consumers believe they understand differences between health plans offered to them (Kaiser Family Foundation, 2000). For example, less than 50% of surveyed consumers knew that HMOs were plans that place greater emphasis on preventive care. In addition employers that organize markets for health insurance frequently limit the range of consumer choice of health insurance. Nevertheless, U.S. public policy has in recent years encouraged the broadest choices possible in the design of health insurance schemes such as Medicare and the Federal Employees Health Benefit program. Little research has been conducted on the effectiveness of consumer choice in health insurance markets.

General lessons from the behavioral economics literature may lead one to conclude that the analysis of the trade-off from expanding choice among competing

health plans may be quite incomplete. Research in behavioral economics shows that as the number of choices among complicated products expands, consumers appear to consider an decreasing number of the available options or they attempt to avoid choices altogether by putting off decisions or reverting to a default option (Johnson, Hershey, Meszaros and Krunreuther, 1993). It has also been shown that as decisions become more complex people adopt increasingly simple rules of thumb to make their choices (Payne, Bettman and Johnson, 1993). Lowenstein (2000) applies these ideas to the problem of Social Security reform. He argues that in that case the costs of more choice may exceed the benefits. The health insurance market is filled with natural experiments in complex; seemingly high stakes choices where the choice set varies dramatically. Empirical analysis motivated by the behavioral economics concepts noted here may offer valuable information for better understanding the net benefits of expanding choice in health insurance.¹⁹

For example, the U.S. Medicare program offers a rich laboratory for such investigations. There is a great heterogeneity in the number of managed care plan options available to Medicare beneficiaries across the U.S. Yet in all markets there is a common default plan, the traditional fee for service Medicare plan. Policy makers and researchers have been repeatedly surprised by the low rates of enrollment in Medicare managed care plans given the richer assortment of insurance coverage they frequently offer (e.g. prescription drugs at no additional premium cost). Understanding how the structure of the choice set affects the willingness to depart from the default option would be important for understanding trade-offs in program design choices. Specifically, are Medicare beneficiaries that face larger numbers of choices more likely to choose traditional Medicare over managed care plans? This would be important information for a Congress that has shown such strong interest in encouraging enrollment in managed care arrangements for Medicare beneficiaries.²⁰

¹⁹ It should be noted that these issues also apply to choices of specialists, hospitals and prescription drugs as well as the assessment of policies such as “any willing provider” statutes.

²⁰ Obtaining consistent empirical estimates of the impact of greater choice on use of the default option involves dealing with the issue of endogenous entry by health plans.

IV. Final Observations

The health sector has long offered a challenging venue for applied economists. Arrow recognized this in the early 1960s. Following the tradition of Arrow I have focused the discussion here on markets for health services and health insurance. Health economists have become habituated to dealing with institutions and facts that raise questions about the usefulness of applying the neoclassical model to health care markets. The nature of the physician-patient interaction in the presence of insurance is at the heart of many of the most challenging problems in health policy and health economics. The first empirical studies in health economics came face to face with the issue of characterizing the doctor-patient interaction and it remains a central problem in health economics. The application of standard principal-agent models has produced an increasingly sophisticated ability to describe doctor-patient interactions and to develop refutable hypotheses about parameters that affect price, quantity and quality outcomes. Nevertheless, observed demand and supply response in markets for physician services are incompletely understood. The case of public reporting of physician performance in CABG surgery offers a vivid example of the limited ability of the standard model to explain market behavior.

Behavioral economics offers some concepts and analytical tools that fit well with the institutions of the health sector. The doctor-patient decision-making context of limited information, a noisy health production function, fear, anxiety, insurance coverage and trust is well suited to the concerns of behavioral economics. I have attempted to highlight how relatively simple models of the physician-patient interactions can be extended using ideas from behavioral economics to enrich the ability to understand and develop empirical models of health care markets. The issues identified go to the core concerns of health economics. These include: how information affects equilibrium quality in health care markets, how physician competition might affect prices and quantities, what produces persistent variations in treatment patterns across markets and the associated welfare losses, and what explains racial and ethnic disparities in health care use? I have emphasized the role of behavioral economics in extending positive models of health care markets. Behavioral economics offers direction for addressing long standing impasses in positive health economics.

There are also important normative implications. Clearly, if doctors and patients make the types of context specific choices and cognitive errors described here demand functions can no longer be given the normative interpretations that are common even in health economics (Rice, 1998). Critics of the use of standard demand models in health care have clearly and persuasively raised the limits to the use of normative models. They have also failed to offer new approaches to understanding such behavior

One direction pointed to by Thaler and Sunstein (2003) is to use cost benefit analysis of alternate policies that aim to account for the type of cognitive errors described here. Cost effectiveness is widely applied in health care to make efficiency judgments about competing medical practices and policies. There are however a variety of difficulties in applying these tools in the context of trying to account for consumer preferences for making welfare judgments (Garber, 2000).

Another interesting approach is known as case based decision theory (Gilboa and Schmeidler 2004). In this case the normative analysis is conducted by assessing whether a policy action results in a reduction in the type of decision making “errors” that serve to undermine the types of expected utility models frequently used in health economics. Thus policies that reduce distortions in decision making would be viewed as “welfare improving”. These are new ideas and to date there is no clear path toward a new normative approach that might be applied in fields such as health economics.

The policy implications stemming from the application of behavioral economics in analyzing health care markets are potentially profound. Two cornerstones of recent U.S. health policy are: 1) the presumption that increasing the availability of information to consumers will result in improved quality of care, and 2) that more choice of health plans and providers will inevitably make consumers better off. Examining the basic laboratory and psychological research used in behavioral economics immediately raises challenges to these policy fundamentals. I have attempted to identify some specific areas where these ideas might have particular import for on-going policy debates. I expect that a sustained program of research involving the ideas of behavioral economics applied to

health care markets will likely result in at least some intelligent modification of these articles of faith.

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