# Search, Moral Hazard, and Equilibrium Price Dispersion* 

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#### Abstract

We characterize optimal contracts for insurance coverage of a service whose price may vary across service providers. Households must engage in costly search to learn the price of a particular service firm, and the presence of insurance reduces incentive to search. We construct a general equilibrium model where the interaction of the insurer, consumers, and service firms endogenously determine the distribution of service prices and the intensity of search. We find that when the insurance firm is a monopolist, the equilibrium contract results in full insurance and no price dispersion among service firms. A perfectly contestable insurance market results in a contract with partial insurance coverage at a competitive premium and significant price dispersion; moreover, the contract maximizes household ex-ante utility. Reductions in search effort not only directly decrease the likelihood of the household finding a low price, but indirectly weaken price competition among service firms. We find that the indirect effect is far more important than the direct effect, responsible for at least $89 \%$ of the cost of moral hazard in search.


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[^0]
## 1 Introduction

In most markets where insurance plays a prominent role (such as medical services or auto repairs), the price of a particular service varies significantly from one firm to another. ${ }^{1}$ In a typical market, consumers respond to price dispersion by obtaining price quotes from a number of firms and selecting the lowest price. However, when an insurance company ultimately pays for most of the service, the consumer's incentive to search is dramatically reduced - most of the price reduction obtained through search effort is passed on to the insurance company. With fewer searches, sales prices (and thus the expected insurance payout) are higher. This paper studies the optimal insurance contract in an environment with moral hazard due to search.

An insurance contract (or policy) consists of the premium charged to households as well as a coinsurance rate, defined as the percentage of an insurance claim that the household pays out-of-pocket. In offering a particular policy, an insurer must consider the incentives it creates for both households and service-providing firms. We depict this in a general equilibrium model in which the interactions between these agents endogenously determine the insurance policy, the distribution of service prices, and the search intensity of households. We find that when the insurance firm is a monopolist, the equilibrium contract results in full insurance and no price dispersion among service firms. However, when the insurance market is perfectly contestable, the threat of competition results in a contract with a competitive premium and only partial insurance coverage. More interestingly, this contract is also the one that maximizes household expected utility.

Furthermore, we examine the magnitude of moral hazard in search, measured as the change in the expected total cost ${ }^{2}$ of the event due to the presence of insurance. We decompose two effects which contribute to this rise in expected cost. First, a direct effect occurs when consumers request fewer quotes from the same distribution. Second, an indirect effect occurs because requesting fewer quotes results in less price competition among the firms, shifting the distribution toward higher prices. Indeed, we find that the latter effect is at least 8.6 times bigger than the former (for all

[^1]parameter values), or in other words, is responsible for at least $89 \%$ of the total cost of moral hazard. Thus, the general equilibrium feedback is in fact the much larger concern in the incentive problem. To our knowledge, we are the first to distinguish this effect within the optimal contract literature.

In our model, there is a continuum of ex-ante identical households and service firms, and an insurance firm. Households face a random event (such as an auto accident or health problem) with some fixed probability. If the event occurs, the household hires a service firm to fully repair the damage. ${ }^{3}$ This service is homogenous across the service firms, but each firm may charge a different price. Households know the distribution of offered prices, but can only learn the price charged by a particular firm by requesting a quote at a constant cost.

Households can insure against this event by purchasing a policy offered by the insurance firm, which specifies a premium as well as a coinsurance rate. If the event occurs, the policy reimburses a fraction of the actual price paid. We initially analyze household and service firm choices while taking the insurance contract as given. We then augment the model by endogenizing the choice of contract offered by the insurance firm, which anticipates the subgame equilibrium behavior from the preceeding analysis.

We consider the insurance firm under two different market structures. In the first, they act as a pure monopolist. In the second, they are the only insurer but the market is perfectly contestable; that is, there are no barriers to entry or sunk costs. ${ }^{4}$ All service firms are within the insurer's approved network, meaning they have agreed not to charge more than an exogenously-set maximum allowable price.

In the endogenous contract model, decisions occur in the following order: First, the insurance firm chooses which policy to offer. Households then accept or reject this policy. Next, service firms simultaneously set their prices. Finally, the event is realized for some of the households, who then must decide how many quotes to request and select the lowest price among them. Search is simultaneous, as in Burdett and Judd (1983); that is, a household receives all quotes at the same time. Unlike sequential search, a simultaneous search environment can generate equilibrium price

[^2]dispersion even though firms and households are homogeneous. Also, this environment approximates a situation in which the repair or surgery must take place within a short timeframe; Manning and Morgan (1982) and Morgan and Manning (1985) offer this and several other scenarios in which simultaneous search dominates sequential search.

Our model abstracts from some of the institutional details of insurance. For instance, all firms are assumed to be in the insurer's preferred provider network; that is, households never consider firms outside of their network. Since out-of-network prices are typically higher and their insurance reimbursement is less generous, this is probably an accurate depiction of most household choices. The exceptions are when emergency service is needed while traveling outside of the network area, or when significant quality differences exist among firms - both of which are beyond the scope of this model. Also, we do not model the negotiation process by which the maximum allowable price is set, nor can insurers engage in search on behalf of households.

Whenever the presence of insurance distorts incentives for the insured, causing an increase in expected payout, a moral hazard problem occurs. Two other forms of moral hazard are well known. First, the insured person may exercise less precaution (such as defensive driving), increasing the probability of loss. Second, the insured person may increase his consumption of the covered service (such as medical appointments), increasing the size of loss. These have been extensively studied, beginning with the work of Arrow (1963), Pauly (1968), Smith (1968), Zeuckhauser (1970), and Ehrlich and Becker (1972).

However, moral hazard in search has received much less attention, with the only formal analyses in Dionne (1981, 1984). ${ }^{5}$ In a model where the coinsurance rate is taken as exogenous and the distribution of prices is fixed regardless of the number of quotes requested by households, Dionne identifies the negative incentive effect of insurance on search behavior and hence on expected service prices. However, he neglects a crucial (and, as we show, larger) component of the story: the endogenous response of firms to household search.

There is substantial evidence of a positive relationship between insurance coverage

[^3]and service firm prices. Using a product-level panel dataset of various drug purchases in Germany, Pavcnik (2002) shows that prices decreased significantly after a change in insurance coverage that made households responsible for a larger portion of their prescription purchases. Feldstein $(1970,1971)$ find that physicians and non-profit hospitals raise their prices as insurance coverage becomes more extensive. In fact, Feldstein (1973) estimates that raising the coinsurance rate for hospital stays from 33 to 50 percent would reduce prices sufficiently to increase welfare between 11 and 25 percent (net of the welfare cost of increased exposure to risk).

This paper relates to the optimal insurance literature, such as Crew (1969), Smith (1968), Pauly (1968), and Gaynor, Haas-Wilson, and Vogt (2000). In particular, Ma and McGuire (1997) shares the same spirit as our paper, though they examine a different aspect of moral hazard. In their model, health insurance contracts are incomplete because the quantity and quality of health care is not contractible; household or physician effort are hidden to some degree. This is a variation of moral hazard in consumption - households use more services, and physicians provide lower quality care. Our model follows a similar timing of insurance, service firm, and household decisions; but instead, the non-contractible elements are firm pricing and household quote requests, leading to moral hazard in search.

Nell, Richter, and Schiller (2008) also model the interaction between coinsurance and service prices. In their environment, product differentiation among service firms gives them spatial market power; thus, even though households are perfectly informed, they may choose to fill their prescription from a more expensive pharmacy, for instance. In this sense, moral hazard arises because insurance is non-contractible on the location of purchase. However, there is no price dispersion in their analysis: they concentrate on symmetric equilibrium where all firms charge the same price.

The paper proceeds as follows: Section 2 presents the model in which the insurance contract is exogenous, and characterizes the equilibrium behavior of service firms and households. Insurance contracts are endogenized in Section 3, and the optimal contract is characterized. Section 4 applies the model to prescription drug insurance, developing a numerical example which illustrates equilibrium behavior. Section 5 provides a measure of moral hazard in search and decomposes this into the direct and indirect effect. Finally, we offer conclusions in Section 6.

## 2 Exogenous Insurance Contract

### 2.1 Environment

Three types of agents interact in this economy: households, service firms, and an insurance firm. We assume a continuum (of measure one) of both households and service firms. Within each type, agents are identical ex-ante.

Households face a random event (such as an auto accident or health problem) with probability $\rho$. When the event occurs, the household hires a service firm to fully repair the damage. This service is homogenous across the service firms, but each firm may charge a different price. Households know the distribution of offered prices, $F(p)$, but can only learn the price $p$ charged by a particular firm by requesting a quote at a $\operatorname{cost} c>0$.

Households insure against this event by purchasing a policy offered by the insurance firm, which specifies a premium $\theta$ as well as a coinsurance rate $\gamma$. We initially consider this insurance contract as exogenously given and assume that all households insure; in Section 3, both the insurance policy and the decision to purchase it are endogenously determined. If the event occurs, the policy reimburses a fraction $1-\gamma$ of the actual price paid. All service firms are within the insurer's approved network, meaning they have agreed not to charge more than an exogenously-set maximum allowable price $M$.

Note that demand for the service is perfectly inelastic; fraction $\rho$ of the population will always purchase one unit of service from some firm. The only question is what price they will pay for it. This assumed demand is needed to isolate the effect of moral hazard in search. If consumers had any elasticity in their demand, then the presence of insurance would encourage them to consume more units of service, which is moral hazard in consumption.

Decisions occur in the following order: Service firms simultaneously set their prices. Then the event is realized for some of the households, who must decide how many quotes to request and select the lowest price among them.

### 2.2 Household Quote Requests

In the last stage of the game, only those unlucky households who experience the event have a choice to make: the number $n$ of quotes to request. At that point, the
distribution of service prices is fixed. The quotes are all received simultaneously, after which the household will choose the lowest among them. ${ }^{6}$

Household utility, $u(w)$, is a Bernoulli utility function for money. To create a role for insurance, we assume that households are risk averse - in particular, $u^{\prime}>0$ and $u^{\prime \prime}<0$ for all $w$. The choice of $n$ is made so as to maximize expected utility:

$$
\begin{equation*}
E U(\theta, \gamma, F(\cdot)) \equiv \max _{n \in \mathbf{Z}} \int_{\underline{p}}^{M} u(w-\theta-c n-\gamma p) n(1-F(p))^{n-1} d F(p) \tag{1}
\end{equation*}
$$

The analysis of this model is far more tractable if the objective function in Equation 1 is a strictly concave function of $n$. Since $n$ is restricted to integer values, strict concavity ensures that there will either be a unique solution $n^{*}$ or households will be indifferent between requesting either $n^{*}$ or $n^{*}+1$ quotes. If $u(\cdot)$ were linear utility, concavity would be a simple property of order statistics; obtaining the same with risk averse households requires further restrictions on utility (which are imposed throughout the paper). ${ }^{7}$

Proposition 1. Given increasing and concave $u(\cdot)$ with decreasing absolute risk aversion, expected utility is strictly concave with respect to $n$.

Proof. First, expected utility can be transformed via integration by parts to become:

$$
u(w-\theta-c n-\gamma \underline{p})-\gamma \int_{\underline{p}}^{M} u^{\prime}(w-\theta-c n-\gamma p)(1-F(p))^{n} d p
$$

The second derivative (w.r.t. $n$ ) of this expression of expected utility is:

$$
\begin{aligned}
& c^{2} u^{\prime \prime}(w-\theta-c n-\gamma \underline{p})- \\
& \gamma \int_{\underline{p}}^{M}(1-F(p))^{n}\left([\ln (1-F(p))]^{2} u^{\prime}(\cdot)-2 c \ln (1-F(p)) u^{\prime \prime}(\cdot)+c^{2} u^{\prime \prime \prime}(\cdot)\right) d p
\end{aligned}
$$

Since absolute risk aversion is measured by $a(w)=-\frac{u^{\prime \prime}(w)}{u^{\prime}(w)}$, then decreasing absolute risk aversion, $a^{\prime}(w)<0$, implies $\left(u^{\prime \prime}\right)^{2}<u^{\prime} u^{\prime \prime \prime}$. Since $u^{\prime}>0, u^{\prime \prime \prime}>0$ as well.

[^4]Because $u^{\prime \prime}<0$, we have $\left|u^{\prime \prime}\right|<\sqrt{u^{\prime} u^{\prime \prime \prime}} \Longrightarrow u^{\prime \prime}>-\sqrt{u^{\prime} u^{\prime \prime \prime}}$ for any $w$.
Note that $\ln (1-F(p))<0$. Thus, for all $p$,

$$
\begin{aligned}
& (1-F(p))^{n}\left([\ln (1-F(p))]^{2} u^{\prime}(\cdot)-2 c \ln (1-F(p)) u^{\prime \prime}(\cdot)+c^{2} u^{\prime \prime \prime}(\cdot)\right) \\
& >(1-F(p))^{n}\left([\ln (1-F(p))]^{2} u^{\prime}(\cdot)+2 c \ln (1-F(p)) \sqrt{u^{\prime}(\cdot) u^{\prime \prime \prime}(\cdot)}+c^{2} u^{\prime \prime \prime}(\cdot)\right) \\
& =(1-F(p))^{n}\left(\ln (1-F(p)) \sqrt{u^{\prime}(\cdot)}+c \sqrt{u^{\prime \prime \prime}(\cdot)}\right)^{2}>0 .
\end{aligned}
$$

Hence, in the expression of the second derivative, the integrand is always a positive number, making the second term negative. The first term is also negative because $u^{\prime \prime}<0$.

Thus, it is possible for ex-ante identical households to choose different numbers of quote requests, but with the concavity of $E U$, this only occurs over two consecutive numbers and the households must be indifferent between them. Among all households who incur losses, the fraction who request $n$ quotes is expressed as $q_{n}$.

### 2.3 Service Firms

The individual service firms are able to repair a household's loss at constant marginal cost $r$. We assume $r<M$. Each firm sets a price $p$, taking as given the distribution of prices among other firms and the search behavior of consumers, represented by $F(\cdot)$ and $q_{n} .{ }^{8}$ Only $\rho$ percent of the population will be in the market for their service, and among those customers, a firm will only make the sale if its quoted price is lower than all other quotes requested by that customer. Thus, a firm considers not only the profit per sale, $p-r$, but also the probability of making the sale, as depicted in the firm's expected profit:

$$
\max _{p} \Pi_{S}(p) \equiv \begin{cases}\rho(p-r) \sum_{n=1}^{\infty} q_{n} n(1-F(p))^{n-1} & \text { if } p \leq M  \tag{2}\\ 0 & \text { if } p>M\end{cases}
$$

A Service Firm Equilibrium is a price distribution $F(\cdot)$ and service firm profit $\Pi_{S}$ such that, given the aggregate distribution of quote requests $\left\{q_{n}\right\}_{n=1}^{\infty}$,

[^5]1. $\Pi_{S}=\Pi_{S}(p)$ for all $p$ in the support of $F(\cdot)$
2. $\Pi_{S} \geq \Pi_{S}(p)$ for all $p$.

In a service firm equilibrium, each firm is indifferent among all prices in the support. Thus, the price distribution may be interpreted in one of two ways. Each firm could select a particular price in the support with certainty, with an aggregate distribution $F(\cdot)$ of those prices. Alternatively, one could see $F(\cdot)$ as the mixed strategy employed by every firm in a symmetric equilibrium.

For any particular insurance policy $(\theta, \gamma)$, the interaction of service firms and households will determine the number of quote requests and the price distribution. An Insured Search Equilibrium for $(\theta, \gamma)$ is a price distribution $F(\cdot)$, service firm profits $\Pi_{S}$, and a distribution of household quote requests $\left\{q_{n}\right\}_{n=1}^{\infty}$ such that:

1. $F(\cdot)$ and $\Pi_{S}$ constitute a service firm equilibrium given $\left\{q_{n}\right\}_{n=1}^{\infty}$
2. $q_{n}>0$ only if $n$ solves the household's problem (Eq. 1)
3. $\sum_{n=1}^{\infty} q_{n}=1$.

If the equilibrium $F(\cdot)$ is a non-degenerate distribution, we refer to it as a dispersed price equilibrium.

### 2.4 Search and Price Dispersion

Before combining the interaction of household search and firm pricing, we note that the behavior of service firms in this model replicates that of firms in Burdett and Judd (1983). Thus all of their results (summarized in this subsection) concerning firms directly apply. In particular:

- If $q_{1}=1$, the unique service firm equilibrium has $F(M)=1$ and $F(p)=0$ for $p<M$. In that case, $\Pi_{S}=\rho(M-r)$. That is, if everyone requests a single quote, there is no reason to compete on price, so everyone charges the maximum allowed.
- If $q_{1}=0$, the unique service firm equilibrium has $F(r)=1$ and $F(p)=0$ for $p<r$. In that case, $\Pi_{S}=0$. If everyone requests more than one quote, price competition will drive all firms to charge marginal cost.
- If $q_{1} \in(0,1)$, the unique service firm equilibrium has continuous $F(\cdot)$, with support $[\underline{p}, M]$, for some $\underline{p}>r$. A dispersed price distribution can only arise if some fraction of the population requests only one bid. If so, some firms will offer high prices (including $M$ ), hoping to capture those who only ask for one quote; others will offer lower prices in pursuit of those who request multiple quotes.

By combining these results with household search behavior, we can further narrow the possible insured search equilibria. For instance, no equilibrium exists in which $q_{1}=0$. In that case, a service firm equilibrium would require a degenerate price distribution, concentrated at $r$. But if all firms choose the same price $r$, there would be no reason for households to request more than one quote, requiring that $q_{1}=1$.

On the other hand, an insured search equilibrium always exists in which $q_{1}=1$ and all firms charge price $M$. These choices are mutually consistent, since no firm will be undercut if no one searches twice, and no household should search multiple times if all prices are identical. This sort of result is common to all search models. Having eliminated the other possibility for a degenerate price distribution, we may appropriately refer to this as the degenerate equilibrium.

In order to have a dispersed price equilibrium, we need $0<q_{1}<1$. Because of the concavity of the utility function with respect to $n$, this means that $q_{2}=1-q_{1}$; if households were indifferent between 1 and $n$, then the quantities from 2 to $n-1$ would all produce strictly more utility. For notational ease, we set $q=q_{1}$. The existence of such an equilibrium depends on the parameters. For instance, when the cost of search is sufficiently high, no one can be enticed to search twice.

For a dispersed price equilibrium, the service firm's profit can be written as: $\Pi_{S}(p)=\rho(p-r)(q+2(1-q)(1-F(p)))$. As stated earlier, $F(p)$ must be continuous when $q \in(0,1)$. We can determine the precise distribution associated with a given $q$ based on the requirement that all prices in the support be equally profitable. Thus $(M-r) q=(p-r)(q+2(1-q)(1-F(p)))$, which yields:

$$
\begin{equation*}
F(p)=1-\frac{(M-p) q}{2(p-r)(1-q)} \text { for } p \in[\underline{p}, M] \tag{3}
\end{equation*}
$$

The lower bound, $\underline{p} \equiv r+\frac{(M-r) q}{2-q}$, is derived such that $F(\underline{p})=0$. Also, $d F(p)=$ $\frac{(M-r) q}{2(1-q)(p-r)^{2}}$. Each service firm has an ex-ante expected profit of $\Pi_{S}=\rho q(M-r)$. Thus, firm behavior and the resulting price distribution are entirely determined by
$q$, the fraction of people who request only one quote. Furthermore, a larger $q$ results in prices more concentrated on the right tail of the distribution, as established in the following lemma.

Lemma 1. If $q^{\prime}<q^{\prime \prime}$ then $F\left(p ; q^{\prime}\right)>F\left(p ; q^{\prime \prime}\right)$ for each $p \in[\underline{p}, M]$.
Proof. Since $q^{\prime}<q^{\prime \prime}, \frac{q^{\prime}}{1-q^{\prime}}<\frac{q^{\prime \prime}}{1-q^{\prime \prime}}$. Hence $F\left(p ; q^{\prime}\right)=1-\frac{(M-p) q^{\prime}}{2(p-r)\left(1-q^{\prime}\right)}>1-\frac{(M-p) q^{\prime \prime}}{2(p-r)\left(1-q^{\prime \prime}\right)}=$ $F\left(p ; q^{\prime \prime}\right)$.

In other words, when fewer people request multiple quotes, firms have less probability of being undercut; as a consequence, they can charge higher prices. In particular, the new distribution will first-order stochastically dominate the original distribution.

### 2.5 Insured Search Equilibrium Characterization

For a given insurance policy $(\theta, \gamma)$, the insured search equilibrium can be fully described by $q$. The preceding subsection derived the price distribution and service firm profits as particular functions of $q$. In addition, the quote requests $q$ must be consistent with households maximizing expected utility, which is examined in this subsection.

In the case of the degenerate equilibrium (which exists for any insurance policy), this is easy. It is optimal for all households to request a single quote since all firms charge the same price. To have a dispersed price equilibrium, however, households must be indifferent between requesting one or two quotes. Therefore, we solve for the $q$ which equates the expected utility of one request to the expected utility of two requests:

$$
\begin{aligned}
& (1-\rho) u(w-\theta)+\rho \int_{\underline{p}}^{M} u(w-\theta-c-\gamma p) \frac{q(M-r)}{2(1-q)(p-r)^{2}} d p= \\
& \quad(1-\rho) u(w-\theta)+\rho \int_{\underline{p}}^{M} u(w-\theta-2 c-\gamma p) \frac{q^{2}(M-p)(M-r)}{2(1-q)^{2}(p-r)^{3}} d p
\end{aligned}
$$

which simplifies to:

$$
\begin{equation*}
(1-q) \int_{r+\frac{(M-r) q}{2-q}}^{M} \frac{u(w-\theta-c-\gamma p)}{(p-r)^{2}} d p=q \int_{r+\frac{(M-r) q}{2-q}}^{M} \frac{u(w-\theta-2 c-\gamma p)(M-p)}{(p-r)^{3}} d p . \tag{4}
\end{equation*}
$$

For any particular $(\theta, \gamma)$, Equation 4 may have zero, one, or many solutions. With linear utility, it is straightforward to show that there are at most two dispersed price equilibria. ${ }^{9}$ We conjecture that this result is also true with risk-averse preferences. ${ }^{10}$ However, the remainder of our analysis does not crucially depend on the number of dispersed price equilibria.

Note that $\Delta(q) \equiv(1-q) \int_{r+\frac{(M-r) q}{2-q}}^{M} \frac{u(w-\theta-c-\gamma p)}{(p-r)^{2}} d p-q \int_{r+\frac{(M-r) q}{2-q}}^{M} \frac{u(w-\theta-2 c-\gamma p)(M-p)}{(p-r)^{3}} d p$ is a continuously differentiable function with respect to $\theta, \gamma$, and $q$. Thus, if $Q(\theta, \gamma) \equiv$ $\{q \in[0,1]: \Delta(q)=0\}$ (i.e. the correspondence of dispersed price insured search equilibria), $q(\theta, \gamma)$ is a closed, upper hemi-continuous correspondence. ${ }^{11} Q(\theta, \gamma)$ may be empty, however (such as when $\gamma$ is at or near zero).

Dispersed price equilibria must be solved for numerically - analytic solutions are not possible even in the case of linear utility, and risk aversion only increases the complexity of Equation 4. To illustrate the equilibrium behavior of the model, a calibration and numerical solution is provided in Section 4.

## 3 Endogenous Insurance Contract

We next consider the decisions of the insurer in setting the terms of the insurance policy. The model proceeds as follows: the insurance firm selects a policy $(\theta, \gamma)$ to offer. Households then accept or reject this policy. Beyond that, service firms and households behave as depicted in the insured search equilibrium. We will consider two market structures for the insurance firm: monopoly and perfect contestability.

If the insurance firm is a pure monopolist, its only constraint is that households must be willing to participate in the insurance. If the insurance firm is in a perfectly contestable market, its selected policy must also prevent potential entrants from profitably luring away households. These constraints are formalized in subsections 3.2 and 3.4.

[^6]
### 3.1 Household Insurance Purchase

Households consider a take-it-or-leave-it offer from the insurance firm, with an outside option to remain uninsured. This decision is based on ex-ante expected utility:

$$
\begin{equation*}
V(\theta, \gamma, q)=(1-\rho) u(w-\theta)+\rho E U(\theta, \gamma, F(\cdot ; q)) \tag{5}
\end{equation*}
$$

One should remember that within the $E U(\cdot)$ function, the household considers how many quote requests a particular insurance plan will induce him to make. In the absence of insurance households would typically choose to request more quotes.

The insurance plan is purchased if $V(\theta, \gamma, q) \geq V(0,1, q)$. Note that $q$ is held the same, regardless of the individual hosehold's choice of insurance. The household considers this as an individual deviation, holding the choices of others constant. As a practical consequence, when considering the consequences of being uninsured, the household expects to face the same distribution of service firm prices as when insured.

### 3.2 Monopolist Insurance Firm

The insurance firm is risk neutral and seeks to maximize expected profit. The insurer understands that household search behavior can be affected by the policy terms, and that this influences the service firms' price distribution. In other words, they recognize that $q$ depend on $\theta$ and $\gamma$. For a given $(\theta, \gamma)$, expected profit is given by:

$$
\begin{equation*}
\Pi_{I} \equiv \theta-\rho(1-\gamma) \sum_{n=1}^{\infty} q_{n}(\theta, \gamma)\left(\underline{p}+\int_{\underline{p}}^{M}(1-F(p ; \theta, \gamma))^{n} d p\right) \tag{6}
\end{equation*}
$$

The term in parenthesis is the expected lowest price when $n$ quotes are requested (simplified using integration by parts). This simplifies greatly after the results on service firm equilibria are applied, as shown in the following lemma.

Lemma 2. Given that fraction $q$ of those with losses only request one quote, the insurance profits will be: $\Pi_{I}(\theta, \gamma, q)=\theta-\rho(1-\gamma)(r+q(M-r))$.

The proof is a straightforward computation and appears in Appendix B. Through similar computation, the expected out-of-pocket costs for households is $\rho(\gamma(r+q(M-$ $r))+c(2-q))$. Note that this includes both the non-reimbursed portion of the service price, $\rho(\gamma(r+q(M-r))$, and the expected search cost, $\rho(c q+2 c(1-q))$.

Recall that an insured search equilibrium for a given $(\theta, \gamma)$ can be entirely described by the associated $q$, so long as the price distribution is constructed from $q$ according to Equation 3 and $q$ satisfies the household indifference condition in Equation 4. We then define a Monopoly-insured Search Equilibrium as a policy $\left(\theta^{*}, \gamma^{*}\right)$ and quote requests $q^{*}$ such that:

$$
\left(\theta^{*}, \gamma^{*}, q^{*}\right) \in \underset{\substack{\theta \in[0, M], \gamma \in[0,1] \\ q \in Q(\theta, \gamma) \cap\{1\}}}{\arg \max } \theta-\rho(1-\gamma)(r+q(M-r)) \text { s.t. } V(\theta, \gamma, q) \geq V(0,1, q) .
$$

This definition fits the principal-agent framework, where the insurer (principal) must choose a contract that is both incentive compatible and individually rational for the household (agent). The latter is represented in the participation constraint. The former is embodied in the domain for $q$, requiring that it be an insured search equilibrium given $\theta$ and $\gamma$. By imposing this requirement, the principal is forced to anticipate not only the direct effect of the contract on search behavior $(q)$ but also its indirect impact on the price distribution $(F)$.

### 3.3 Monopolist Equilibrium Behavior

The remarkable consequence of monopolization is that the insurer prefers a degenerate price distribution. The insurance firm always offers full insurance, even knowing that this results in the highest possible service firm prices. The intuition for this result is that the monopolist's profit is precisely the risk premium he can extract from the household. By discouraging search, the insurer increases the size of loss from the negative event and hence the variance in the household's wealth. Thus, households are willing to pay a larger risk premium (in addition to the insurer's expected payout). The claim is formalized in the following proposition.

Proposition 2. A pure monopolist insurer will maximize profits by setting $\gamma^{*}=0$ and $\theta^{*}$ such that $V\left(\theta^{*}, \gamma^{*}, 1\right)=V(0,1,1)$.

Proof. First, note that the only insured search equilibrium that can occur when $\gamma=0$ will have $q=1$. This is because the household gets $u(w-\theta-c)$ from requesting one quote and $u(w-\theta-2 c)$ from requesting two; so extra search increases cost but provides no benefit to the household. Indeed, this also holds true in some neighborhood of $\gamma=0$.

Next, we obtain an approximation for the risk premium that the household is willing to pay; that is, for a given insurance policy, how much the household is willing to pay for the insurance above and beyond the insurer's expected payout. Compare a household's expected utility under a particular policy $(\theta, \gamma)$ to its expected utility if uninsured, holding constant the fraction $q$ of shoppers who request a single bid. A monopolist extracts the most profit by setting $\theta$ so that the household is indifferent about insuring:

$$
E[u(w-\theta-s(a c+\gamma p)]=E[u(w-s(a c+p)]
$$

where expectations are over $s \in\{0,1\}$ (whether the event occurs), $a \in\{1,2\}$ (how many quotes the household requests), and $p$ (the accepted service price). Using a Taylor expansion, this is approximated to:

$$
\begin{array}{r}
E\left[u(w)-(\theta+s(a c+\gamma p)) u^{\prime}(w)\right]=E\left[u(w)-s(a c+p) u^{\prime}(w)+s(a c+p)^{2} \frac{u^{\prime \prime}(w)}{2}\right] \\
u(w)-E[(\theta+s(a c+\gamma p))] u^{\prime}(w)=u(w)-E[s(a c+p)] u^{\prime}(w)+E\left[s(a c+p)^{2}\right] \frac{u^{\prime \prime}(w)}{2} \\
\theta-E[s(1-\gamma) p]=-E\left[s(a c+p)^{2}\right] \frac{u^{\prime \prime}(w)}{2 u^{\prime}(w)} \\
\theta-\rho(1-\gamma)(r+q(M-r))=-\kappa \frac{u^{\prime \prime}(w)}{2 u^{\prime}(w)}
\end{array}
$$

where $\kappa=\frac{2(1-q)\left(c^{2}(4-3 q)+c(4 M q+4 r-6 q r)+r(2(M-r) q+r)\right)+q^{2}(M-r)(M-r-2 c) \ln \left(\frac{2-q}{q}\right)}{2(1-q)}$.
Note that the left-hand side of the final equation is precisely the firm's profit (or equivalently, the risk premium they can charge beyond the actuarially-fair premium). Recalling that $u^{\prime}>0$ and $u^{\prime \prime}<0$, the right-hand side indicates that profit is proportional to $\kappa$, which we now show is strictly increasing in $q$.

First observe that $\lim _{q \rightarrow 0} \frac{\partial \kappa}{\partial q}=(2 c+r \gamma)^{2}>0$. Furthermore, if we assume that $M-r>2 c$, then the second derivative

$$
\frac{\partial^{2} \kappa}{\partial q^{2}}=-\frac{(M-r)(M-r-2 c)\left(6-10 q+4 q^{2}+(-2+q)^{2} \log \left[\frac{q}{2-q}\right]\right)}{(2-q)^{2}(1-q)^{3}}
$$

is positive, since $\left(6-10 q+4 q^{2}+(-2+q)^{2} \log \left[\frac{q}{2-q}\right]\right)$ is negative for $q \in[0,1)$. If
instead $M-r \leq 2 c$, then it is impossible to have a dispersed price equilibrium, since the cost of two quote requests exceeds the maximum potential price reduction. Thus, $\kappa$ and hence profits are increasing in $q$ for its entire range; or in other words, for a given $\gamma$, the monopolist insurer strictly prefers an equilibrium where $q=1$.

Furthermore, the comparison of degenerate equilibria for various $\gamma$ is even more straightforward. All service firms charge $M$ in all such equilibria; thus, at competitive insurance prices, household welfare would strictly increase as coinsurance decreases. Therefore the monopolist insurer can extract this surplus in the form of a higher risk premium, which is maximized when $\gamma=0$.

In the computations above, we neglected the fact that an uninsured agent would potentially request more quotes relative to when he is insured. Incorporating additional search only strengthens the result, though; it would raise the reservation utility $V(0,1, q)$ for dispersed price equilibria, and hence decrease the amount of surplus the monopolist can extract. Yet when faced with a degenerate price distribution, all households request a single quote regardless of being insured or not, so the reservation utility $V(0,1,1)$ stays the same. Thus the risk premium will be just as large as computed above, and full insurance is still profit maximizing.

### 3.4 Perfectly Contestable Insurance Firm

Although we model only one insurance firm, it will be forced to charge a competitive premium if the market is assumed to be perfectly contestable (that is, there are no barriers to entry or sunk costs). ${ }^{12}$

In this setting an insurer faces two limitations in offering a contract. First, households must be willing to purchase the plan, as with the pure monopolist. Second, the firm must not leave any profitable opportunities for a challenger to exploit. In particular, if a competitor could offer an alternate plan that provides greater utility to households and still earn a positive profit, it will displace the incumbent insurance firm. In such a case, it is assumed that all households would switch to this alternate plan. ${ }^{13}$ In equilibrium, the insurer must offer a contract that forestalls any such

[^7]competition.
The insurance firm's profit is unchanged from what is depicted in Lemma 2. We then define a Contestably-insured Search Equilibrium as a policy $\left(\theta^{*}, \gamma^{*}\right)$ and quote requests $q^{*}$ such that:

1. $q^{*} \in Q\left(\theta^{*}, \gamma^{*}\right) \cap\{1\}$
2. $V\left(\theta^{*}, \gamma^{*}, q^{*}\right) \geq V\left(0,1, q^{*}\right)$
3. There is no other $(\hat{\theta}, \hat{\gamma}, \hat{q})$ such that $\hat{q} \in Q(\hat{\theta}, \hat{\gamma}) \cap\{1\}, \hat{\Pi}_{I}>0, V(\hat{\theta}, \hat{\gamma}, \hat{q})>$ $V\left(\theta^{*}, \gamma^{*}, q^{*}\right)$, and $V(\hat{\theta}, \hat{\gamma}, \hat{q}) \geq V(0,1, \hat{q})$.

The first two conditions play the same role as in the monopolist's problem, ensuring incentive compatibility and individual rationality. The third depicts our notion of a perfectly contestable market described above.

### 3.5 Perfectly Contestable Equilibrium Behavior

In offering a particular policy, the insurer selects among the many insured search equilibria. Choosing one is essentially a process of elimination. Some policies would be unprofitable; others would be rejected by the household; and others would leave the insurer vulnerable to a competitor.

It is readily apparent that only $\Pi_{I}^{*}=0$ is consistent with the equilibrium definition. If $\theta^{*}>\rho\left(1-\gamma^{*}\right)\left(r+q^{*}(M-r)\right)$ and thus produces positive profits, then a competitor could offer a plan with the same $\hat{\gamma}=\gamma^{*}$ and a slightly lower $\hat{\theta}=\theta-\epsilon$. While this will necessitate some change in $q$, the upper-hemi-continuity of $Q(\hat{\theta}, \hat{\gamma})$ ensures that $\hat{q}$ will be be near $q^{*}$. Thus, households would be strictly happier under the alternate plan, which also produces positive profits.

Thus, given a particular $\gamma$ and $q$, premiums must be $\theta(\gamma, q) \equiv \rho(1-\gamma)(r+q(M-$ $r)$ ). Let $q(\gamma) \equiv Q(\theta(\gamma, q), \gamma)$, i.e. the correspondence of dispersed price equilibria with competitive premiums. Like $Q(\theta, \gamma)$, this too is a closed, upper hemi-continuous correspondence.

Even when the insurance firm earns zero expected profit, the participation constraint may still bind for some policies. In most situations, competitively-priced partial insurance is strictly preferred to no insurance; but this is only true if the
sumers will use the same insurance plan. Enriching the model to allow multiple plans in equilibrium greatly complicates the analysis without adding much insight.
expected service price is the same in both cases. In our model, if households are uninsured, they can make additional quote requests, which raises the value of their outside option. Thus, for certain policies, the dispersed price equilibrium may not be individually rational; i.e. $V\left(\theta^{*}, \gamma^{*}, q^{*}\right)<V\left(0,1, q^{*}\right)$.

Even so, the degenerate equilibrium always satisfies the participation constraint for any $\gamma$ and competitively priced $\theta$ (since the uninsured household will still not search more than once if all firms charge the same price $M$ ). Moreover, if we define $\bar{q}(\gamma)$ as the restriction of $q(\gamma)$ to dispersed price equilibria that satisfy the participation constraint, $\bar{q}(\gamma)$ is still closed and upper hemi-continuous (though perhaps empty for some $\gamma$ ).

In some instances, all dispersed price equilibria are ruled out by the participation constraint. ${ }^{14}$ This may be considered an extreme case of moral hazard in search, since households would always seek many more price quotes if they were uninsured. A policy with any amount of coverage $(\gamma>0)$ would only result in all service firms charging $M$.

Next, we find that it is always in the best interest of the insurance firm to offer a policy which maximizes the ex-ante expected utility of households. If they did not, it would leave an opportunity for a competitor to offer such a policy with a slight markup and steal the market. In other words, the insurer's incentives are perfectly aligned with the households in promoting competition among service firms, which is rather surprising.

Proposition 3. If $\gamma^{*}$ is the coinsurance rate in a contestably-insured search equilibrium, then

$$
\left(\gamma^{*}, q^{*}\right) \in \underset{\gamma \in[0,1], q \in \bar{q}(\gamma) \cup\{1\}}{\arg \max } V(\theta(\gamma, q), \gamma, q) .
$$

Proof. Suppose the insurance firm uses a policy $\hat{\gamma}$ such that $V(\theta(\hat{\gamma}), \hat{\gamma}, F(\cdot ; q(\hat{\gamma})))<$ $V\left(\theta\left(\gamma^{*}\right), \gamma^{*}, F\left(\cdot ; q\left(\gamma^{*}\right)\right)\right)$. A competitor could offer a policy $\left(\theta\left(\gamma^{*}\right)+\epsilon, \gamma^{*}\right)$ for some $\epsilon>0$. This would earn strictly positive profit and (due to upper hemi-continuity of $q(\theta, \gamma)$ and continuity of $V)$ would still be strictly preferred by households.

As a corollary of this result, any degenerate equilibrium with partial insurance cannot be a contestably-insured search equilibrium. Full insurance is strictly preferred if the (degenerate) price distribution is held fixed.

[^8]Corollary 1. Supose If $\gamma>0, \theta=\rho(1-\gamma) M$, and $q=1$, then $(\theta, \gamma, q)$ cannot be $a$ contestably-insured search equilibrium.

Proof. Suppose an insurance firm instead provided full insurance using the policy $(\rho M, 0)$. They would still earn zero profits and the resulting insured search equilibrium will still have $q=1$. Household ex-ante expected utility would be

$$
(1-\rho) u(w-\rho M)+\rho u(w-c-\rho M)
$$

which (due to the concavity of $u$ ) is strictly greater than

$$
(1-\rho) u(w-(1-\gamma) \rho M)+\rho u(w-c-\rho M-(1-\rho) \gamma M)
$$

under the other policy.
Also, if there are multiple insured search equilibria associated with a particular $\gamma$, only the one with the smallest $q$ is capable of being an insured search equilibrium. As $q$ increases (holding $\gamma$ constant), the price distribution is concentrated on higher prices and the competitive insurance premium will rise. Thus, for each coinsurance rate $\gamma$, the insured search equilibrium with the smallest $q$ is always strictly preferred, and the rest will be eliminated.

This process of elimination provides a natural algorithm for finding contestablyinsured search equilibria. First, for each $q \in[0,1]$, compute the uninsured reservation utility $V(0,1, F(q))$. Next, substitute the competitive insurance premium, $\theta(\gamma, q)$, into Equation 4 and, for each $\gamma \in[0,1]$, find all solutions $q(\gamma)$. Then, for each $\gamma$ and each $q \in q(\gamma)$, eliminate $q$ if $V(\theta(\gamma, q), \gamma, F(q))<V(0,1, F(q))$. After this, eliminate all but the smallest $q$ for each $\gamma$.

Among these remaining dispersed price equilibria, select the $\gamma$ that produces the highest expected utility, $V .{ }^{15}$ Finally, compare this dispersed price equilibrium utility to $(1-\rho) u(w-\rho M)+\rho u(w-c-\rho M)$, the expected utility under full insurance, choosing whichever is higher. We use this algorithm for the numerical computations in Section 4.

It is possible that the fully-insured degenerate equilibrium will be preferred to all dispersed price equilibria. In such a case, the protection from insurance is more

[^9]valuable to the household than the lower prices obtained via search. For instance, this can occur when risk aversion, search costs, and the marginal cost of production are fairly high.

### 3.6 Equilibrium Selection

One may have noted in the equilibrium definitions of both market structures that it is as if the insurer chooses not only the policy $(\theta, \gamma)$ but also the intensity of search represented in $q$. It is plausible that an insurance firm could coordinate the behavior of their insured clients to some degree. For instance, they could suggest $q$ (i.e. a particular mixed strategy for quote requests) to households, and as long as it is incentive compatible (i.e. consistent with an insured search equilibrium), the households would have no reason to choose some other strategy. Perhaps the informational newsletters distributed by many insurance companies can be seen as an attempt to coordinate on a particular equilibrium.

At the same time, this approach to equilibrium selection is not a crucial feature of the model. To dispense with it, we could define our equilibrium objects not only to be $\left(\theta^{*}, \gamma^{*}, q^{*}\right)$, but also a selection $\psi(\theta, \gamma) \in Q(\theta, \gamma) \cap\{1\}$ for monopoly or $\psi(\gamma) \in$ $\bar{q}(\gamma) \cap\{1\}$ for contestable markets, requiring in equilibrium that $q^{*} \in \psi\left(\theta^{*}, \gamma^{*}\right)$. Here, $\psi$ indicates which insured search equilibrium would follow from a given policy, and might be interpreted as the insurer's beliefs about off-equilibrium choices.

This alteration would have no effect on our analysis of the monopolist's problem. The profit maximizing policy of full insurance has a unique (degenerate) insured search equilibrium which is necessarily selected in $\psi$. Moreover, this was shown to be strictly more profitable than any other policy, regardless of the associated $q$; hence restricting to a subset of policies paired with search intensities will not change the outcome.

The contestably-insured search equilibrium could be affected by the altered equilibrium definition, but only if $\psi$ were to exclude the $\gamma$ and $q$ which maximize expected utility. If so, the insurer would still choose the policy which maximizes expected utility among those in $\psi$. Of course, this setup would assume that the insurer's potential competitors are constrained to policies in $\psi$ as well. This trap in a suboptimal equilibrium is not particularly compelling, as it would offer significant profit opportunity to a challenger who offers the superior policy and somehow coordinates the shift to
the $q$ excluded by $\psi$.
In the numerical exercise which follows, we proceed using the original definition of contestably-insured search equilibrium. Indeed, our calibration of price data is consistent with the smallest $q$ for a given $\gamma$, and utility is increasing in $q$ (for a given policy).

## 4 A Calibrated Example

Since the model is not analytically solvable (even with linear utility), we now illustrate equilibrium behavior by calibrating parameters to data on purchases of prescription drugs and numerically solving for a contestably-insured search equilibrium. The aim of this numerical example is to provide (in a plausible context) a sense of the magnitude of the problem that moral hazard in search creates and, through comparative statics, indicate when a high coinsurance rate might be optimal.

A large sample of household drug purchases is provided in the 2005 Medical Expenditure Panel Survey, compiled by the US Department of Health and Human Services. This data set is described in Appendix A, along with details of our calibration procedure. The market for prescription drugs is well suited to our theory due to the homogeneity of the product within each drug, the heavy presence of insurance in the market, and the significant price dispersion that is observed. ${ }^{16}$

We use CRRA preferences $u(w)=\frac{w^{1-\sigma}}{1-\sigma}$, setting $\sigma=4 .{ }^{17}$ Using Maximum Likelihood Estimation, we set the parameters which cannot be directly observed ( $q, M, r$, and $c$ ) so as to match our equilibrium conditions to the observed price distribution (annualized ${ }^{18}$ ). The details of this procedure are also found in Appendix A; from this, we obtain the values listed in Table 1. As discussed in the appendix, the data and theory are very closely aligned in the selection of $q, r$, and $M$, and does well with most others. The coinsurance rate $\gamma$ is the hardest to match, since the data lacks details on individual insurance plans and the theory assumes a single plan. However, the features described here are qualitatively robust to changes in the parameters.

[^10]Table 1: Calibrated parameters

| Parameter | Value | Target |
| :---: | :---: | :--- |
| $w$ | $\$ 23,788$ | Matched to average personal income in data |
| $\gamma$ | $5.9 \%$ | Matched to average coinsurance rate among population |
| $\rho$ | $11.1 \%$ | Matched to fraction of population using drugs in data |
| $q$ | $22.0 \%$ | Theoretical distribution of prices (Eq. 3) matched to |
| $M$ | $\$ 3,260.4$ | distribution of data prices |
| $r$ | $\$ 640.8$ | Solved by requiring indifference between one and two <br> searches (Eq. 4) |
| $c$ | $\$ 14.9$ |  |

### 4.1 Insured Search Equilibria

In order to observe how insured search equilibria vary with coinsurance rates, we compute $q$ for a grid of values of $\gamma \in[0,1]$, with $\theta$ set to the competitive premium. Figure 1 illustrates the resulting solution pairs. Several features of this graph are qualitatively robust for variations in the parameter values:

- The degenerate equilibrium $\left(q^{*}=1\right)$ exists for any coinsurance rate, and for low coinsurance rates $(\gamma<5 \%)$, it is the only equilibrium.
- A sharp discontinuity occurs where the dispersed price equilibrium emerges, which is to say that as $\gamma$ approaches $5 \%$, a new equilibrium at $q^{*}=36 \%$ emerges. Nearly two-thirds of the population suddenly begins to request two quotes.
- At higher rates of coinsurance, two dispersed price equilibria exist. The higher of these (the upper branch of the curve) is dominated, as mentioned in conjunction with Proposition 3. Note that the calibration produced a $(\gamma, q)$ pair on the lower brach of the curve. The rest of our analysis considers these lower equilibria.

Of course, each of these equilibria result in a different service firm price distribution. Figure 2 plots the cumulative distribution function $F(p)$ in the equilibrium, for selected coinsurance rates. At $\gamma=5 \%$, a wide price distribution suddenly emerges. As $\gamma$ increases beyond that point, the distribution increasingly concentrates on lower prices. However, the largest price reductions occurs between $5 \%$ and $15 \%$, and there is little movement beyond $\gamma=50 \%$.


Figure 1: Insured search equilibrium pairs of fraction of single quotes, $q$, and coinsurance rate, $\gamma$.


Figure 2: Equilibrium distribution of prices for selected coinsurance rates: $\gamma=99 \%$ (Solid), $\gamma=50 \%$ (Long Dash), $\gamma=10 \%$ (Short Dash), $\gamma=6 \%$ (Dotted), $\gamma=5 \%$ (Dot Dash), and $\gamma<5 \%$ (Solid)


Figure 3: Ex-ante expected costs for each coinsurance rate, $\gamma$ : insurance premium (solid), out-of-pocket (dotted), and total costs (dashed). (For $\gamma<5 \%$, total cost is constant at $\$ 363.6$. Insurance premium is $\$ 363.6(1-\gamma)$.)

This dramatic change in the price distribution has a stark effect on the insurance premiums and out-of-pocket costs paid in each insured search equilibrium. These are illustrated in Figure 3. In the degenerate equilibrium range, an increase in the coinsurance rate simply transfers responsibility from the insurance firm to the individual; the total expected cost remains constant. When the dispersed price equilibrium emerges at $\gamma=5 \%$, the reduction in prices is reflected in a discontinuous drop in both insurance premium and out-of pocket costs. At higher coinsurance rates, premiums fall and out of pocket costs rise, yet the total cost strictly decreases.

Clearly higher coinsurance results in lower expected prices for households; yet it also leaves the household exposed to more risk from the negative event. The net effect of these two factors is represented in Figure 4. The price reductions are more important initially, but eventually are not sufficient to compensate for additional risk. For a simple interpretation of utility, we translate expected utility into dollar terms by finding the certainty equivalent wealth for each level of coinsurance; that is, the wealth $w$ such that $\frac{w^{1-\sigma}}{1-\sigma}=V(\theta, \gamma, q)$.

While considering expected utility, we should also note that the participation constraint binds for dispersed price equilibria with a coinsurance rate at or below $7 \%$. For instance, when the dispersed price equilibrium first emerges at $\gamma=5 \%$, a household would increase its certainty equivalent wealth by $\$ 7.2$ by foregoing insurance and, should the event occur, requesting 6 quotes. As $\gamma$ increases, this advantage quickly


Figure 4: Equilibrium ex-ante utility for each coinsurance rate, expressed as certaintyequivalent wealth. (At $\gamma=0 \%$, the this is $\$ 23,424$, with a small decline as $\gamma$ increases. At $\gamma=5 \%$, this jumps to $\$ 23,608$.)
erodes. The probability of drawing a low price from $F(\cdot)$ increases, so an uninsured household would request fewer quotes (4 at $\gamma=7 \%$ ).

The utility-maximizing coinsurance rate occurs at $\gamma=52 \%$, with an expected total cost of $\$ 76.1$. For some perspective as to the magnitude of moral hazard in search, consider that under full insurance $(\gamma=0)$, the expected total cost of the event is $\$ 363.6$, nearly 5 times as large! Of course, under the optimal insurance contract, households shoulder more of the risk; however, the utility cost of this risk only amounts to $\$ 1.20$ reduction in certainty equivalent wealth (computed as initial wealth minus the certainty equivalent wealth and the expected total cost).

Note that in our calibration, we observe an average coinsurance rate of $5.9 \%$ in the prescription drug market. Under that contract, expected total cost would be \$138.1, and the utility cost of the risk is negligible. As discussed in Appendix A, it is difficult to rationalize this low coinsurance rate as an optimal contract even with extreme risk aversion. In our view, this reflects some monopoly power in the insurance market which, as shown in Section 3.3, biases insurers toward lower coinsurance rates. It is particularly striking that the observed coinsurance rate is very close to the rate at which the participation constraint becomes binding, bearing in mind that the participation constraint was not used in calibration. In other words, to exploit some monopoly power, the insurer has reduced coinsurance to the lowest rate that is still consistent with a dispersed price equilibrium.

In addition to household utility, we may also inquire about total welfare; that is, the sum of certainty equivalent wealth and firm profits. The latter strictly declines as coinsurance increases (since the resulting prices have a smaller markup). In fact, total welfare strictly declines as well. Three important factors produce this result. First, recall that demand is perfectly inelastic for the repair service; consequently, pricing above marginal cost creates no deadweight loss in this model. If demand showed some price sensitivity, households would see greater welfare gains (as coinsurance rises) and these would offset firm losses. As it is here, however, any price decrease is simply a transfer from firms to households.

At the same time, there are two costs which cause total welfare to decline. First, search effort is a real cost. Although households find it individually rational to incur extra search costs in response to higher coinsurance, this reduces total wealth in the economy. Second, higher coinsurance rates place more of the risk on households rather than risk neutral insurers. For the estimated parameters, however, both costs are minor ( $\$ 1.6$ and $\$ 1.2$, respectively under the optimal contract).

### 4.2 Comparative Statics

Since we must numerically solve this model, an important question is how the optimal contract changes under different parameters. Here we provide these comparative statics ${ }^{19}$ as well as the intuition as to why contracts respond in this particular manner. Much of this can be framed in terms of the positive externality of search: people choose how many quotes to request based on their private cost and benefit, yet additional search will reduce prices for all households needing a repair, including those who only search once.

- Higher cost of requesting a quote: A $1 \%$ increase in the cost of search $c$ results in a $0.3 \%$ increase in the optimal coinsurance rate.

As $c$ increases, the second quote request becomes less attractive to households; if $\gamma$ were unchanged, a smaller fraction would request two quotes. Yet the positive externality of search is still as great as before; so $\gamma^{*}$ must increase to give added incentive for search. Even under the optimal contract, the number of people requesting two quotes still falls ( $q^{*}$ rises by $0.9 \%$ ).

[^11]- Higher probability of loss: A $1 \%$ increase in event probability $\rho$ results in a $0.2 \%$ increase in the optimal coinsurance rate.

The probability of loss $\rho$ has very little impact on an individual's incentive to search. In Equation 4, note that it does not appear except for its effect on insurance premiums. However, because the event is more likely, more people will need repair service, increasing the positive externality. Thus, increasing $\gamma^{*}$ encourages more search ( $q^{*}$ falls by $0.2 \%$ ) and lowers prices for all households.

- Higher risk aversion: A $1 \%$ increase in risk aversion $\sigma$ results in a $0.3 \%$ decrease in the optimal coinsurance rate.

As $\sigma$ increases, it becomes more important to smooth risk for households. Thus, a lower $\gamma^{*}$ is better for households, even though it results in fewer people searching twice ( $q^{*}$ falls by $0.4 \%$ ) and higher prices.

- Higher marginal cost of service: For this comparative static, we shift both $r$ and $M$ by the same dollar amount, thus keeping the potential markup the same and only increasing the marginal cost of service. A $1 \%$ increase in $r$ results in a $0.6 \%$ decrease in the optimal coinsurance rate.

Although prices are higher as $r$ increases, the expected benefit of search (the price reduction) is unchanged. On the other hand, the higher expected cost of the event is equivalent to a reduction in expected wealth. Thus, absolute risk aversion increases and it is better to forego some price competition in order to insure households more fully. Thus, $\gamma^{*}$ lowers and fewer people search twice ( $q^{*}$ rises by $0.8 \%$ ).

- Higher potential markup: A $1 \%$ increase in the maximum allowed price $M$ results in a $0.15 \%$ decrease in the optimal coinsurance rate.

As $M$ increases, households naturally have greater incentive to search because of the wider price distribution they face. Thus, $\gamma^{*}$ can be lowered and still have a net result of more people requesting two quotes ( $q^{*}$ falls by $1.3 \%$ ). Indeed, the surprising result is that expected utility under the equilibrium contract rises, in spite of the higher $M$ ! In our model, $M$ is exogenous, but this suggests that if the insurer could choose this price cap, contestable markets would encourage them to loosen it (since it benefits their consumers).

The remaining parameter, $w$, is less interesting. A decrease in $w$ looks very similar to an increase in $r$; its only real effect is in increasing absolute risk aversion.

We repeated these computations for a variety of parameter values, and in all cases these comparative statics maintain the same sign. As $\gamma^{*}$ becomes small, generally the magnitude of the comparative static diminishes; as $\gamma^{*}$ becomes large, it eventually hits a corner solution at 1 . It is also possible that the degenerate equilibrium with no coinsurance will eventually dominate the dispersed price equilibrium.

In summary, we can see that a high coinsurance rate is optimal when search costs or the probability of loss are high, or when risk aversion, cost of provision, or the maximum allowable price is low. Most of these confirm what one would expect, such as insuring consumers more fully when they are risk averse or having consumer pay for a larger fraction of routine care (high $\rho$ ) or low-cost prescriptions (low $r$ ).

Two results are somewhat surprising: First, higher coinsurance is needed precisely when it is more costly to obtain price quotes. This continues to be true up until $c>79$, when no insurance is optimal; then once $c \geq 288$, full insurance dominates no insurance. Second, a higher maximum allowable price is actually better for consumers (after optimally adjusting contracts). This effect becomes small as $M$ increases, but is still positive when $M=w$.

## 5 Measuring Moral Hazard

We quantify the effect of moral hazard in search using the ex-ante expected total cost of repair, which includes all expenditures, whether paid for by insurance or out-ofpocket. Here, as in other forms of moral hazard, the presence of insurance will cause the expected cost to be higher than it would be without.

In Section 3.5, we derived expressions for equilibrium premiums and expected out-of-pocket expenses (which include search costs). Their sum, the ex-ante total cost, is $\rho\left(r+2 c+(M-r-c) q^{*}\right)$ in equilibrium ( $\$ 76.1$ in our calibration). Note that this is not directly affected by $\gamma$ or $\theta ; q^{*}$ is the only endogenous variable that directly enters. Of course, any change in $\gamma$ or $\theta$ that induces a higher fraction of people to search twice will drive down total cost.

Of course, the policy observed in the data has a much lower coinsurance rate and consequently a higher fraction of people requesting a single quote. We now consider the implications of moving from the observed policy to the optimal policy.

As a benchmark, suppose we naïvely believed that increasing the coinsurance rate from $5.9 \%$ to $52 \%$ would have no effect on consumer search behavior or service firm pricing. This is to say, if there were no moral hazard in search, the fraction requesting one quote would hold constant at $\bar{q}=0.22$ regardless of the coinsurance rate. As a consequence, total expected cost would be $\rho(r+2 c+(M-r-c) \bar{q})$ (\$138.1 in our calibration) for any insurance policy; an increase in $\gamma$ would reduce the insurance premium, but that would be exactly offset by increases in expected out-of-pocket costs.

We measure moral hazard, then, as the difference between expected cost in an environment without moral hazard (i.e. search is fixed at $\bar{q}$ ) and expected cost in an insured search equilibrium (i.e. at the equilibrium $q^{*}$ ): $\rho(M-r-c)\left|\bar{q}-q^{*}\right|$ or $\$ 62$ per household in our calibration.

In our model, two effects contribute to the moral hazard problem. The direct effect is that, by requesting more quotes, the household has more draws from the distribution, giving additional chances to obtain a lower quote. This effect was the sole focus of Dionne (1981), for instance. There is also an indirect (or general equilibrium) effect: as more households request a second quote, they encourage greater price competition among the firms, actually lowering the distribution of prices. Our model is the first to incorporate both effects - and the latter effect is much larger than the former.

We would like to decompose the two effects. To isolate the direct effect on total cost, we consider what would happen to total cost (off the equilibrium path) if the service firm price distribution were fixed while the fraction of households searching once can vary. In particular, firms set prices as if fraction $\bar{q}$ of the population searches once, even though $q^{*}$ actually do. The ex-ante total cost $E C\left(q^{*}, \bar{q}\right)$ in this scenario is:

$$
\begin{aligned}
E C\left(q^{*}, \bar{q}\right) \equiv & \rho q^{*}\left(r+\frac{\bar{q}(M-r) \ln \left(\frac{2-\bar{q}}{\bar{q}}\right)}{2(1-\bar{q})}+c\right) \\
& +\rho\left(1-q^{*}\right)\left(\frac{2(1-\bar{q})(M \bar{q}+r-2 \bar{q} r)-\bar{q}^{2}(M-r) \ln \left(\frac{2-\bar{q}}{\bar{q}}\right)}{2(1-\bar{q})^{2}}+2 c\right) .
\end{aligned}
$$

The two large parenthetical terms are the expected price after one quote request (or two, respectively); note that these only depend on $\bar{q}$. The direct effect of moral hazard
is then measured as the difference between this cost and the cost when there is no moral hazard: $\left|\rho(r+2 c+(M-r-c) \bar{q})-E C\left(q^{*}, \bar{q}\right)\right|$. Indeed, this equation simplifies to:

$$
\frac{\rho\left|\bar{q}-q^{*}\right|\left(\bar{q}(M-r) \ln \left(\frac{2-\bar{q}}{\bar{q}}\right)-2(1-\bar{q})((M-r-c) \bar{q}+c)\right)}{2(1-\bar{q})^{2}}
$$

For the calibration, this amounts to $\$ 5.6$ of the $\$ 62$ change in cost; in other words, $9.1 \%$ of the change in total cost is due to the direct effect of additional search.

Indeed, we can analytically determine what fraction of the total moral hazard effect is due to the direct effect: $\frac{\left|\rho(r+2 c+(M-r-c) \bar{q})-E C\left(q^{*}, \bar{q}\right)\right|}{\rho(M-r-c)\left|\bar{q}-q^{*}\right|}$. This simplifies to:

$$
\begin{equation*}
S=\frac{\bar{q}(M-r) \ln \left(\frac{2-\bar{q}}{\bar{q}}\right)-2(1-\bar{q})((M-r-c) \bar{q}+c)}{2(M-c-r)(1-\bar{q})^{2}} \tag{7}
\end{equation*}
$$

Surprisingly, $q^{*}$ is cancelled out; the fraction $S$ only depends on the parameters and the fixed reference point $\bar{q} . S$ is largest when $\bar{q} \approx 0.365,{ }^{20}$ and is quasi-concave in $\bar{q}$. At its maximum, $S \approx 0.104-\frac{0.896 c}{M-c-r}$. Thus, the direct effect cannot account for more than $10.4 \%$ of the change in total cost; the remaining $89.6 \%$ must be due to the indirect effect. Put another way, the indirect effect is at least $\frac{0.896}{0.104}=8.6$ times as big as the direct effect, and (if other $\bar{q}$ are used) potentially more.

## 6 Conclusion

Our model of moral hazard in search has allowed us to study optimal insurance contracts when service prices are endogenously determined. Accounting for the firms' response to consumer search behavior significantly worsens the moral hazard problem. In our model, insurance companies realize that they can influence the search behavior with the terms of the contract. In particular, a higher coinsurance rate motivates more consumers to request a second price quote, which in turn spurs greater competition among service firms. We find that the indirect effect of search (i.e. greater price competition among firms) is at least 8.6 times as large as the direct effect (i.e. more quotes evaluated by households).

The theory also allows us to comment on the industrial organization of the insurance market and its impact on the optimal contract. When the insurance firm is a

[^12]monopolist, the equilibrium contract results in full insurance and no price dispersion among service firms. However, when the insurance market is perfectly contestable, the threat of competition leads to a contract with a competitive premium and only partial insurance coverage. This contract also maximizes household expected utility.

Our model could easily be reinterpreted to consider programs for the reimbursement of employee expenses. Company policies range from full reimbursement, which is equivalent to having no coinsurance, to providing an expense stipend with the employee claiming any unused residual, similar to $100 \%$ coinsurance. Particularly for business travel, one might reasonably conclude that airline and hotel prices have been affected by the moral hazard problem of employees making travel arrangements.

From a policy point of view, our work has particular relevance to the debate regarding health savings accounts (HSAs). HSAs have high deductibles (essentially a $100 \%$ coinsurance rate) coupled with full coverage for catastrophic events. Advocates have cited increased price competition among health providers as one of the benefits of HSAs, since households covered by such plans will have incentive to shop around (at least for services that aren't urgent or likely to exceed the full-coverage threshold). This paper offers some theoretical foundation for the optimality of that insurance arrangement. For instance, it is typically optimal to have a $100 \%$ coinsurance rate on routine (i.e. highly likely) and minor (i.e. low marginal cost) health expenses. When search costs are extremely high (such as when medical attention is urgently needed) or when the marginal cost of providing the service is quite large (such as heart surgery), it is often optimal to have a $0 \%$ coinsurance rate.

Several extensions to this work would make the model applicable to a broader range of situations. First and most important is to allow heterogeneity in insurance coverage, capturing the great variety of private and public insurance plans found coexisting in the United States. Similarly, we could allow for heterogeneous households, differing in wealth, cost of search, or probability of loss. This would also enable investigation into adverse selection issues. The challenge associated with heterogeneity is that it significantly complicates the procedure of solving for the equilibrium price distribution, and may render the problem intractable even for numerical solutions.

We would also like to add a quality or product differentiation dimension to the service firms, since this is the aspect on which most people currently choose their medical care. Finally, we should note that extension of the present model to a multiperiod environment is crucial to better quantify the magnitude of moral hazard. This
would allow future premiums or coinsurance rates to be conditioned on claims paid in the past, as is the case with most auto insurance. Incorporating this dynamic framework would probably encourage additional search and hence reduce our estimates of the moral hazard problem.

## A Data Appendix

The Medical Expenditure Panel Survey (MEPS) is a survey of families and individuals in the U.S., providing a complete source of data on the cost and use of health care and health insurance coverage. In this paper, we use the 2005 Prescription Medicine Event File data that belongs to the Household Component of MEPS. It provides data from individual households on all their drug purchases, supplemented with data from their medical providers. An observation is registered each time a prescription is filled, indicating the prescribed medication (identified with the national drug code (NDC), which distinguishes among brand names), the date on which the person first used the medicine, and the amount paid from each potential source of drug coverage (private insurance, Medicare, out of pocket, etc.).

We focus on prescription drugs because of the homogeneity of the good (within a given NDC), yet the total price paid for a particular number of pills shows remarkable dispersion. For instance, a 30 day supply of 10 mg Lipitor pills was sold at anywhere from $\$ 52.60$ to $\$ 236.69$, and as our theory would predict, the distribution is highly skewed towards lower prices. Figure 5 depicts the observed distribution of prices, as well as the theoretical distribution found after calibrating $q, r$, and $M .{ }^{21}$ Moreover, prices are not significantly correlated with the source of payment. Moral hazard in search is a good candidate for explaining price dispersion in this market.

We performed the following calibration on 11 different drugs, listed in Table 2. Each of these had at least 800 observations in the sample. To maintain homogeneity within a market, we separate drugs by brand name, dosage, and number of pills filled in a particular prescription. After calibrating for these, we also calibrate the model for an aggregation of the drugs (whose values are reported at the bottom of the table), which are the parameters used in Section 4. The aggregate can be thought of as insuring against the event that any of these drugs are needed. The calibration approach is quite similar for an individual drug or for the aggregate.

## A. 1 Parameters held constant for all drugs

We use the following procedure to set parameter values:

[^13]

Figure 5: Observed price distribution (bars) and fitted model price distribution (line) for Lipitor, in annual expenditures.

Wealth $(w)$ : We chose $w$ to match the average annual personal income in the data. We would prefer matching $w$ to wealth, but this data is not available. However, in the U.S., average wealth and average income are fairly close to each other.

The coinsurance rate $(\gamma)$ : Although the data does report the dollar amount paid directly by the household rather than by various forms of insurance, it does not indicate whether the person must contribute a fixed amount for the prescription (a copay) or a fixed percentage (a coinsurance). ${ }^{22}$ This is important for our model, since the former would give no marginal incentive to search if the drug cost is greater than the copay.

To obtain a reasonable estimate for the average coinsurance rate among households, we turn to the Kaiser Foundation's annual study of employer-provided insurance plans (Kaiser Family Foundation, 2006). From their report, one can compute that across all types of prescription drug policies, $14.9 \%$ of employees have a plan with some form of coinsurance, and among these plans, the average coinsurance rate

[^14]is $26.2 \%$ on preferred drugs (which are approved brand-name drugs with no generic substitute). Another $2 \%$ have no coverage (and hence a $100 \%$ coinsurance rate). The remaining $83 \%$ have some form of copay, but essentially $0 \%$ coinsurance. Thus, we compute an average coinsurance rate for the population of $5.9 \%$.

Admittedly, this is still not a perfect match to our model, which assumes all households face the same rate of coinsurance. However, addressing heterogeneity in the insurance coverage of households would add significant complexity to both the setup and solution of the model; we thus postpone this for future work. This rough aggregation is sufficient for our purposes of illustrating the equilibrium behavior.

## A. 2 Parameters set for each drug

The following parameters were calibrated specifically for each drug. The resulting values are reported in Table 2.

Percentage of population searching once (q), the marginal cost of production (r), and the maximum allowable price $(M)$ : The values of these three parameters are calculated from a Maximum Likelihood Estimation that best matches the theoretical distribution of prices to the observed distribution in the data.

The prices we observe in the data are accepted prices rather than offered prices, but it is a simple exercise to derive the cumulative distribution of the former using the cumulative distribution of the latter (expressed in Equation 3 as $F(p)$ ). In the model, $q$ of the population request only one quote and thus accept whatever they draw; so $F(p)$ of their accepted prices will be at or below price $p$. The remaining fraction of the population, $1-q$, accepts the lowest of two quotes; thus, if either one or both of the quotes is below $p$, we observe an accepted price below $p$. This happens $1-(1-F(p))^{2}$ of the time. Hence, the theoretical cumulative distribution function of accepted prices is

$$
\begin{equation*}
G(p)=q F(p)+(1-q)\left(1-(1-F(p))^{2}\right)=\left(1+\frac{(M-p) q}{2(p-r)}\right)\left(1-\frac{(M-p) q}{2(1-q)(p-r)}\right) . \tag{8}
\end{equation*}
$$

This results in a probability density function of

$$
\begin{equation*}
G^{\prime}(p)=\frac{q^{2}(M-r)^{2}}{2(1-q)(p-r)^{3}} \tag{9}
\end{equation*}
$$

Hence, the Likelihood Function is

$$
\begin{equation*}
L=\prod_{i=1}^{n} \frac{q^{2}(M-r)^{2}}{2(1-q)\left(p_{i}-r\right)^{3}} . \tag{10}
\end{equation*}
$$

Note that the solution to this problem must satisfy two constraints: first, the theoretical highest price has to be at least as big as the maximum observed price in the data: $p_{\max } \leq M$. Second, the theoretical lowest price cannot be larger than the minimum observed price: $\underline{p}=r+\frac{(M-r) q}{2-q} \leq p_{\min }$. Therefore, we solve a constrained optimization problem; typically, both constraints will bind. The results are presented in Table 2. In the aggregate case, we take the weighted average of these parameters across all drugs. Note that these parameters are estimated independently of the others; that is, $w, \rho, \gamma$ and $c$ are not used in fitting the price data to $M, r$, and $q$.

The probability of event occuring ( $\rho$ ): For each medicine, we used the sample weights and population estimates to calculate the percentage of the population who purchased the drug, using this as $\rho$. For the aggregate case, we set $\rho$ to the fraction who used any of the listed drugs.

Search cost (c): This last remaining parameter is calibrated by using Equation 4; that is, households are indifferent between requesting one or two quotes. This must be solved numerically, but typically has a unique solution for $c$. The same procedure is used for the aggregate data, using the average $q, r$, and $M$.

Note that we do not try to calibrate for $\sigma$. One might consider adjusting this parameter until the observed coinsurance rate is in fact optimal. Higher risk aversion will typically lower the coinsurance rate in the optimal contract, but not nearly enough. Even with extreme risk aversion as high as $\sigma=50$, the optimal coinsurance rate is typically above $20 \%$, far from the observed $5.9 \%$ average coinsurance rate.
Table 2: Estimated parameter values and expected cost, by drug

| $\begin{aligned} & \# \text { of } \\ & \text { Obs } \end{aligned}$ | Prescription drug | $\rho(\%)$ | q (\%) | r (\$) | M (\$) | c (\$) | $\begin{array}{r} \mathrm{TC}(\$) \\ \gamma=0 \\ \hline \end{array}$ | $\begin{gathered} \text { TC }(\$) \\ \gamma=5.9 \end{gathered}$ | $\begin{gathered} \gamma^{*} \\ (\%) \\ \hline \end{gathered}$ | $\begin{gathered} \mathrm{TC}(\$) \\ \gamma=\gamma^{*} \end{gathered}$ | Risk <br> Cost (\$) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 2048 | Lipitor - 10 mg | 1.4 | 15.0 | 52.6 | 236.7 | 11.0 | 41.3 | 14.2 | 46 | 9.6 | 0.1 |
| 1930 | Lipitor - 20 mg | 1.3 | 18.8 | 67.3 | 334.0 | 17.4 | 52.8 | 18.9 | 46 | 11.3 | 0.2 |
| 1546 | Norvasc - 10 mg | 0.8 | 19.9 | 41.4 | 186.2 | 9.6 | 19.0 | 7.3 | 51 | 4.4 | 0.1 |
| 1364 | Prevacid - 30 mg | 1.0 | 22.5 | 80.6 | 394.8 | 21.6 | 45.4 | 17.7 | 44 | 9.9 | 0.2 |
| 1328 | Albuterol - 90 mg | 1.2 | 5.4 | 7.9 | 344.6 | 12.2 | 51.0 | 4.1 | 100 | 1.5 | 0.0 |
| 1197 | Protonix - 40 mg | 0.9 | 19.1 | 72.2 | 323.6 | 16.4 | 36.5 | 13.8 | 43 | 8.6 | 0.1 |
| 1191 | Flonase -0.05 mg | 1.6 | 67.8 | 26.1 | 99.1 | 4.0 | 18.7 | 14.3 | 52 | 5.1 | 0.0 |
| 1133 | Norvasc -5 mg | 0.6 | 24.9 | 26.3 | 134.7 | 7.6 | 10.1 | 4.1 | 63 | 2.1 | 0.0 |
| 966 | Lipitor - 40 mg | 0.6 | 12.1 | 73.9 | 414.5 | 18.7 | 31.5 | 8.9 | 43 | 6.0 | 0.1 |
| 941 | Lexapro - 10 mg | 0.8 | 22.9 | 44.7 | 181.5 | 9.4 | 18.5 | 7.8 | 49 | 4.8 | 0.1 |
| 890 | Advair Diskus - $250 / 50$ | 0.7 | 26.6 | 105.8 | 344.6 | 17.0 | 28.1 | 13.9 | 35 | 9.0 | 0.1 |
|  | Aggregate | 11.1 | 22.0 | 53.4 | 271.7 | 14.9 | 363.6 | 138.1 | 52 | 76.1 | 1.2 |

- TC denotes the household's expected total cost of the prescription. This is the sum of the insurance premium, the expected coinsurance payments out-of-pocket, and expected search costs, totaling $\rho(r+q(M-r)+(2-q) c)$ in the model.
- Risk Cost measures the reduction in household welfare from being only partially insured (though at the optimal $\gamma^{*}$ ). It is computed as $w-C E-T C$, where $C E$ is the household's certainty-equivalent wealth at equilibrium.


## B Proofs

## B. 1 Proposition 2

Proof. For a given $q$, the expected price from a single quote request is:

$$
\underline{p}+\int_{\underline{p}}^{M} \frac{q(M-p)}{2(1-q)(p-r)} d p=r+\frac{q(M-r) \ln \left(\frac{2-q}{q}\right)}{2(1-q)}
$$

Similarly, the expected price after two quote requests is:

$$
\underline{p}+\int_{\underline{p}}^{M}\left(\frac{q(M-p)}{2(1-q)(p-r)}\right)^{2} d p=\frac{2(1-q)(M q+r-2 q r)-q^{2}(M-r) \ln \left(\frac{2-q}{q}\right)}{2(1-q)^{2}}
$$

Fraction $\rho$ of the population incurs the loss. Of those, fraction $q$ search once, while $1-q$ search twice. The insurance company pays $1-\gamma$ of the price they are quoted. Thus, the expected profit is:

$$
\begin{aligned}
\Pi_{I}(\theta, \gamma)= & \theta- \\
& (1-\gamma) \rho\left[q\left(r+\frac{q(M-r) \ln \left(\frac{2-q}{q}\right)}{2(1-q)}\right)+\right. \\
& \left.(1-q)\left(\frac{2(1-q)(M q+r-2 q r)-q^{2}(M-r) \ln \left(\frac{2-q}{q}\right)}{2(1-q)^{2}}\right)\right] \\
=\theta- & \rho(1-\gamma)(r+q(M-r))
\end{aligned}
$$

## B. 2 Sufficient conditions for the number of equilibria

We have not found an example of risk averse utility in which Equation 4 has more than two solutions. However, the integrals in this equation make it very hard to prove that there cannot be more than two solutions. Fortunately, integrals do not appear in the second derivative of the equilibrium condition, which permits a much better characterization. Using this approach, we must impose two restrictions on the degree of curvature of the utility function:

Assumption 1. For all $\hat{w} \in[w-M-c, w], \frac{4}{5} u^{\prime}(\hat{w}-c)<u^{\prime}(\hat{w})$ and

$$
2 u^{\prime}(\hat{w})+9(M-r) \gamma\left(u^{\prime \prime}(\hat{w})-u^{\prime \prime}(\hat{w}-c)\right)>(M-r)^{2} \gamma^{2}\left(2 u^{\prime \prime \prime}(\hat{w}-c)-u^{\prime \prime \prime}(\hat{w})\right) .
$$

The first condition limits how much marginal utility can change after incurring the cost of one additional search (with no other change in wealth). The second can be seen as a restriction on how much the curvature of $u$ can change with the cost of an additional search. The combination of these ensures that the second derivative of Equation 4 can only change signs twice. For commonly used utility functions such as $u(w)=\frac{w^{1-\sigma}}{1-\sigma}$, these conditions are easily satisfied when $M$ and $c$ are small relative to $w$.

This condition is sufficient to bound the number of dispersed price equilibria at two; yet it is definitely not necesary. When chosen parameters and utility functions violate this assumption (with a very large search cost, for instance), there are typically no solutions to Equation 4 (because a second quote request never produces enough additional expected utility to justify the cost).

Proposition 4. Under Assumption 1 with a given $(\theta, \gamma)$, at most two insured search equilibria with dispersed prices exist.

Proof. Note that $\int_{r+\frac{(M-r) q}{}}^{M-q} \frac{q(M-r) u(w-\theta-c-\gamma p)}{2(1-q)(p-r)^{2}} d p$ approaches $u(w-\theta-c-\gamma M)$ as $q \rightarrow 1$ and $u(w-\theta-c-\gamma r)$ as $q \rightarrow 0$ (since the probability distributions converge to a single atom on $M$ and $r$, respectively). Similarly, the expected utility of searching twice converges to $u(w-\theta-2 c-\gamma M)$ and $u(w-\theta-2 c-\gamma r)$, respectively. Thus, we know that one bid request is strictly preferred to two bid requests for $q$ near 0 or 1 .

The first derivative (w.r.t. q) of the equilibrium condition (Eq. 4) is:

$$
\begin{aligned}
\frac{2(1-q)}{q^{2}(M-r)}( & 2 u(w-\theta-2 c-\gamma \underline{p})-u(w-\theta-c-\gamma \underline{p}) \\
& -q \int_{\underline{p}}^{M} \frac{q(M-r) u(w-\theta-c-\gamma p)}{2(1-q)(p-r)^{2}} d p \\
& \left.-(1-q) \int_{\underline{p}}^{M} \frac{q^{2}(M-p)(M-r) u(w-\theta-2 c-\gamma p)}{2(1-q)^{2}(p-r)^{3}} d p\right) .
\end{aligned}
$$

As $q \longrightarrow 0$, this derivative approaches $-\infty$. As $q \longrightarrow 1$, it approaches 0 from below; that is, there exists an $\epsilon>0$ such that the derivative is strictly negative for all
$q \in[1-\epsilon, 1)$.
The second derivative (w.r.t. $q$ ) of the equilibrium condition is:

$$
\begin{aligned}
& \frac{4}{q^{3}(M-r)}(u(w-\theta-c-\gamma \underline{p})-u(w-\theta-2 c-\gamma \underline{p})) \\
& -\frac{4(1-q) \gamma}{(2-q)^{2} q^{2}}\left(2 u^{\prime}(w-\theta-2 c-\gamma \underline{p})-u^{\prime}(w-\theta-c-\gamma \underline{p})\right)
\end{aligned}
$$

At both $q=0$ and 1 , this derivative is strictly positive. The following equation has the same sign as the second derivative for each $q$ as well as the same zeros:

$$
\begin{aligned}
D(q) \equiv & u(w-\theta-c-\gamma \underline{p})-u(w-\theta-2 c-\gamma \underline{p}) \\
& -\frac{q(1-q)(M-r) \gamma}{(2-q)^{2}}\left(2 u^{\prime}(w-\theta-2 c-\gamma \underline{p})-u^{\prime}(w-\theta-c-\gamma \underline{p})\right) .
\end{aligned}
$$

Its derivative is:

$$
\begin{aligned}
D^{\prime}(q)= & \frac{(M-r) \gamma}{(2-q)^{4}}\left(4 q(2-q) u^{\prime}(w-\theta-2 c-\gamma \underline{p})-(2+q)(2-q) u^{\prime}(w-\theta-c-\gamma \underline{p})\right. \\
& \left.+2 q(1-q)(M-r) \gamma\left(2 u^{\prime \prime}(w-\theta-2 c-\gamma \underline{p})-u^{\prime \prime}(w-\theta-c-\gamma \underline{p})\right)\right) .
\end{aligned}
$$

This derivative is initially negative: $D^{\prime}(0)=-\frac{(M-r) \gamma}{4} u^{\prime}(w-\theta-c-\gamma r)<0$ and ends positive: $D^{\prime}(1)=(M-r) \gamma\left(4 u^{\prime}(w-\theta-2 c-\gamma M)-3 u^{\prime}(w-\theta-c-\gamma M)\right)>0$.

Moreover, since $\frac{4}{5} u^{\prime}(w-\theta-2 c-\gamma \underline{p})<u^{\prime}(w-\theta-c-\gamma \underline{p})$ by assumption; therefore $4 q u^{\prime}(w-\theta-2 c-\gamma \underline{p})-(2+q) u^{\prime}(w-\theta-c-\gamma \underline{p})<0$ for all $q \leq \frac{1}{2}$. Since the second term of $D^{\prime}$ is always negative, this means $D^{\prime}(q)<0$ for all $q \leq \frac{1}{2}$.

Let $A(q) \equiv \frac{(2-q)^{4}}{(M-r) \gamma} D^{\prime}(q)$, so $A$ and $D^{\prime}$ have the same sign and zeros. Now consider any $q>\frac{1}{2}$. Assumption 1 gives us:

$$
\begin{array}{r}
u^{\prime}(w-\theta-c-\gamma \underline{p})+\frac{9(M-r) \gamma}{2}\left(u^{\prime \prime}(w-\theta-c-\gamma \underline{p})-u^{\prime \prime}(w-\theta-2 c-\gamma \underline{p})\right) \\
>\frac{(M-r)^{2} \gamma^{2}}{2}\left(2 u^{\prime \prime \prime}(w-\theta-2 c-\gamma \underline{p})-u^{\prime \prime \prime}(w-\theta-c-\gamma \underline{p})\right) .
\end{array}
$$

Note that the following must also therefore hold since it reduces the right hand side and increases the left hand side for each $q>\frac{1}{2}$ :

$$
\begin{aligned}
& B(q) \equiv \frac{(2-q)^{3}}{q} u^{\prime}(w-\theta-c-\gamma \underline{p}) \\
& +2(M-r) \gamma\left((1+q)(2-q) u^{\prime \prime}(w-\theta-c-\gamma \underline{p})-3(2-q) q u^{\prime \prime}(w-\theta-2 c-\gamma \underline{p})\right) \\
& -2(1-q) q(M-r)^{2} \gamma^{2}\left(2 u^{\prime \prime \prime}(w-\theta-2 c-\gamma \underline{p})-u^{\prime \prime \prime}(w-\theta-c-\gamma \underline{p})\right)>0 .
\end{aligned}
$$

Suppose $A(q) \geq 0$ for some $q$. Then $\frac{2}{(2-q)^{2}} B(q)+\frac{2(1-q)}{q(2-q)} A(q)=A^{\prime}(q)>0$. Thus, once $A$ becomes non-negative it is strictly increasing, so there is a unique $\hat{q} \in\left(\frac{1}{2}, 1\right]$ such that $A(\hat{q})=0$. Moreover, $\hat{q}$ is the unique solution in $[0,1]$ for $D^{\prime}(q)=0$.

Recalling that $D(q)>0$ for both $q=0$ and 1 , then there may be zero, one, or two solutions to $D(q)=0$ because its derivative can only change sign once. Since $D$ has the same zeros as the second derivative of the equilibrium condition, the latter also has at most two zeros.

The first derivative of the equilibrium condition is negative near $q=0$ and 1 . Suppose there is some interval $\left[q_{1}, q_{2}\right]$ for which the first derivative is weakly positive. Then there exists a $q \in\left[q_{1}, q_{2}\right]$ such that $D(q)=0$, and another $q>q_{2}$ such that $D(q)=0$. Since the second derivative has at most two zeros, there can only be one such interval. Thus the first derivative has at most two zeros.

Returning to the equilibrium condition, similar reasoning applies. It is strictly positive at $q=0$ and 1 , and if the condition is weakly negative on some interval, then one zero of the first derivative lies within that interval and another lies above that interval. Hence, only one such interval exists, and the equilibrium condition can only hold with equality up to twice.

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[^1]:    ${ }^{1}$ Sorensen (2000) provides an empirical investigation of price dispersion in the prescription drug market (pricing the same drug across retailers). He documents that, on average, the highest posted price is over 50 percent above the lowest available price; furthermore, differences in pharmacy characteristics can account for at most $1 / 3$ of the dispersion.
    ${ }^{2}$ This is defined as the insurance premium plus expected out-of-pocket and search costs.

[^2]:    ${ }^{3}$ This is purely a monetary loss, then, and ignores any irreparable damage. Ma and McGuire (1997) also model health shocks as a monetary loss which can be partially recovered depending on the quantity and quality of health care purchased.
    ${ }^{4}$ We do not consider the case in which several contracts are offered (by one or by many firms), as this becomes analytically intractable.

[^3]:    ${ }^{5}$ Arrow (1963) mentions the potential problem: "Insurance removes the incentive on the part of individuals, patients, and physicians to shop around for better prices for hospitalization and surgical care."

[^4]:    ${ }^{6}$ There is no option to seek another set of quotes, even if the first set were clustered on the high end of the distribution. Also, requesting a quote is prerequisite to obtaining service, so all unlucky households must have $n \geq 1$.
    ${ }^{7}$ These assumptions are sufficient but not necessary to obtain concavity with respect to $n$; however, it is difficult to find less restrictive yet intuitive assumptions on $u(\cdot)$ or $F(\cdot)$ that ensure the result.

[^5]:    ${ }^{8}$ In particular, an individual firm does not expect that raising its price will result in fewer searches, since it is only one of the continuum of firms and cannot affect the price distribution. This would only occur if a positive mass of firms raised their prices.

[^6]:    ${ }^{9}$ One can use the same approach as in Burdett and Judd (1983), with some adaptation to incorporate coinsurance.
    ${ }^{10}$ In Appendix B, we offer sufficient conditions (limiting the curvature of $u$ ) which ensure two or fewer equilibria. These are certainly not necessary conditions, and in fact we have been unable to create an example with more than two equilibria.
    ${ }^{11}$ This follows from the Implicit Correspondence Theorem (Mas-Colell, 1990, p. 49).

[^7]:    ${ }^{12}$ This might appropriately depict employer-based health insurance. US households typically only consider the insurance plan offered by their employer because outside options lack the employer subsidy and exemption from income tax. Yet even as the only provider for those employees, the insurer cannot exercise monopoly power lest potential competitors undercut them when bidding to provide the employer's insurance plan.
    ${ }^{13} \mathrm{We}$ assume that no switching occurs if households are merely indifferent. As a result, all con-

[^8]:    ${ }^{14}$ An example was constructed using CRRA utility, where $M$ was nearly as big as $w$ while both $c$ and $r$ were quite small.

[^9]:    ${ }^{15}$ In numerical examples, $V(\theta(\gamma), \gamma, F(\cdot ; q(\gamma)))$ is typically a concave function of $\gamma$, maximized either at some interior $\gamma$ or at $\gamma=1$ (when the search cost is very low, for instance).

[^10]:    ${ }^{16}$ See footnotes 1 and Appendix A.
    ${ }^{17}$ This provides a moderate amount of risk aversion while still being within the range of values that are commonly accepted for individuals. Lower values for $\sigma$ reduces the importance of insurance, and if small enough, result in an optimal coinsurance rate of $100 \%$.
    ${ }^{18}$ This is to say that the household faces a negative event at the beginning of the year; if it occurs, 12 purchases of a 30-day supply are required. Moreover, households only perform a search when they first fill the prescription; all refills are made with the same service firm at the same price.

[^11]:    ${ }^{19}$ The comparative statics must also be numerically determined, as implicit differentiation of the equilibrium condition does not yield a sign.

[^12]:    ${ }^{20}$ i.e. the solution to $S^{\prime}(\bar{q})=0$, which is $2(3-\bar{q})(1-\bar{q})=(2-\bar{q})(1+\bar{q}) \ln \left(\frac{2-\bar{q}}{\bar{q}}\right)$.

[^13]:    ${ }^{21}$ It is important to note that if some fraction of the population requested more than two quotes, the equilibrium price distribution would be bimodal, with a second spike near $M$. The observed data is fully consistent with all households requesting either one or two quotes.

[^14]:    ${ }^{22}$ Indeed, even confidential data linking households to their insurance plan lacks details on the copay or coinsurance associated with prescription drugs.

