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Dynamic Model of R&D, Spillovers and Efficiency of Bertrand and Cournot Equilibria*

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Abstract

Using an infinite-horizon two-player differential game, we derive and compare Bertrand and Cournot equilibria, for a differentiated duopoly engaging in process R&D competition. The main findings of this study are as follows. First, Bertrand competition is more efficient if either R&D productivity is low, or products are very different. Second, Cournot competition is more efficient provided that R&D productivity is high, products are close substitutes and spillovers are not close to zero. This last result is different from what has been obtained in the literature. This shows hence that considering a dynamic model and more general investment costs do have an impact on efficiency results.

Keywords: Differential games, Research and development, Bertrand equilibrium, Cournot equilibrium, Social optimum, Duopoly.

Résumé

On considère un jeu différentiel à deux joueurs et à horizon infini où les joueurs investissent en R&D pour réduire leurs coûts de production. On calcule et on compare les équilibres de Bertrand et de Cournot. Les résultats sont comme suit. La concurrence à la Bertrand est plus efficiente si la productivité de la R&D est basse ou si les produits sont très différents. Par contre, si la productivité de la R&D est élevée, les produits sont similaires et les effets de débordement sont différents de zéro, alors la concurrence à la Cournot est plus efficiente. Ce dernier résultat est différent de ceux obtenus dans la littérature avec des modèles statiques et des fonctions de coûts moins générales que celle considérée ici.

Mots clés : Jeux différentiels, Recherche et développement, Équilibre de Bertrand, Équilibre de Cournot, Optimum social, Duopole.

1 Introduction

We develop in this paper infinite-horizon differential game models for a differentiated duopoly producing substitutable goods. The firms' aims are to maximize their total discounted profit functions by choosing the optimal levels of either their outputs or prices as well as research and development (R&D) investments. The latter investments are of the production process type, i.e., are intended to reduce production costs. Due to the presence of possible R&D spillovers, however, firms may also benefit from each other in decreasing these costs, depending on the degree of substitutability between their products. This implies that each firm may inadvertently make the other firm a tougher competitor.

Our main objectives are to characterize and compare the efficiency of Bertrand and Cournot equilibria and to examine the robustness of the results obtained in the literature in typically static or two-stage games setting.

In a seminal paper, Singh and Vives (Ref. 1) show that in a differentiated duopoly (i) Bertrand (*price*) competition is always more efficient than Cournot (*quantity*) competition, (ii) Bertrand prices (*quantities*) are smaller (*larger*) than Cournot prices (*quantities*) if the goods are substitutes (*complements*), and (iii) it is a dominant strategy for a firm to choose quantity (*price*) as its strategic variable provided that the goods are substitutes (*complements*). These findings attracted economists' attention and two main streams have appeared in the literature. The first stream extends the above model in different ways, e.g., more general class of cost and demand functions, more players, homogeneous product, quality differences (see Refs. 2-8).

A second stream, to which this paper naturally belongs, introduces investments in R&D as additional strategic variables. Such investments may lead to improvement of the quality of product(s) (in the case of product R&D) and/or to reduction in production cost (in the case of process R&D). Hence the demand and/or cost structures of the Cournot and Bertrand markets may change. One objective of this stream is to reexamine the issue of efficiency of the two equilibria (Cournot and Bertrand). For instance, Delbono and Denicolo (Ref. 9) consider a homogenous duopoly with process R&D in the form of patent race and show that although R&D investments are higher in the Cournot competition, the comparison of the efficiency of Bertrand and Cournot outcomes is generally ambiguous. The same conclusions are obtained in Motta (Ref. 10) for a vertically differentiated duopoly with either fixed or variable costs of quality improvements. Qiu (Ref. 11) extends the model in Ref. 1 by introducing a stage of process R&D. He shows that (i) although Cournot competition induces more R&D effort than Bertrand competition, the latter results in lower prices and higher quantities, (ii) Bertrand competition is more efficient if either R&D productivity is low, or spillovers are weak, or products are very different, and (iii) Cournot competition is more efficient if either R&D productivity is high, spillovers are strong, and products are close substitutes. Finally, Symeonidis (Ref. 12) compares the Bertrand and Cournot equilibria in a differentiated duopoly with substitute goods and product R&D.

This paper extends Qiu's model in different respects and checks if the comparative efficiency results still hold when firms are not necessarily symmetric, operate in a dynamic environment rather than in a static one¹, actual spillover is related to product differentiation and face more general production and process R&D costs. Our conclusion is that the results reported in Ref. 11 still hold in general but in the case where R&D productivity and product substitutability are high.

The rest of the paper is organized as follows. In Section 2, the proposed model is outlined. Cournot, Bertrand and first best equilibria are presented in Sections 3, 4 and 5, respectively. In Section 6, Cournot and Bertrand outcomes are compared and the results of numerical experiments are presented and analyzed. Finally, concluding remarks are presented in Section 7.

2 The Model

Consider a non-cooperative differential game with two firms producing one variety of differentiated but substitutable goods. Firms independently undertake cost-reducing R&D. They also sell their products in the market.

As in Ref. 1, the representative consumer's preferences are described by the following utility function:

$$U(q_1, q_2) = A(q_1 + q_2) - \frac{\omega}{2}(q_1 + q_2)^2 - \eta q_1 q_2 \quad (1)$$

where q_i is firm i 's output, and $0 \leq \eta \leq \omega$. The ratio $\frac{\eta}{\omega}$ represents the degree of product differentiation; the closer this term is to 1 the more substitutes the products are. The resulting market inverse demands are linear and given by

$$P_i = A - \omega q_i - \eta q_j, \quad i, j = 1, 2, i \neq j. \quad (2)$$

Let K_i be firm i 's accumulated capital stock of R&D. The total production cost of firm i is supposed to depend on the quantity produced and, to take into account spillovers in knowledge, on both players' R&D stocks. The following quadratic form is adopted

$$C_i(q_i, K_i, K_j) = (c_i + \sigma q_i - \psi(K_i + \frac{\eta}{\omega}\beta K_j))q_i \quad (3)$$

where $c_i < A$, $0 \leq \psi \leq 1$, $\sigma \geq 0$, and $0 \leq \beta \leq 1$. The degree of spillover of the process R&D is thus given by $\frac{\eta}{\omega}\beta$, where the spillover parameter β is assumed to be exogenous. Note that, contrary to previous contributions in this area, our formulation assumes that the degree of spillover depends on the degree of product substitutability; the higher the latter, the higher the degree of spillover can be. In particular, if the products are unrelated, then

¹Typically in the R&D literature, the game is a two-stage one where in the first stage the firms determine their investments in R&D and in the second stage they engage in market competition. In such framework there is no dynamic or carry-over effects of investments in R&D.

a reasonable assumption would be that firms will not benefit from each other's research effort. Equation (3) is assumed to be strictly positive. Note that $C_i(\cdot)$ is convex increasing in q_i and linear decreasing in capital stocks.

Denote by I_i the investment of firm i in R&D. The resulting investment cost is assumed to be quadratic convex increasing

$$F_i(I_i) = \theta_i I_i + \frac{\phi}{2} I_i^2 \quad (4)$$

where $\theta_i, \phi > 0$. This specification is similar to those used in Refs. 13–14.

Firm i 's capital stock evolves over time according to the following standard capital accumulation process

$$\dot{K}_i = I_i - \delta K_i, \quad K_i(0) = K_{i0} \quad (5)$$

where $\delta, 0 \leq \delta < 1$, is the depreciation rate.

The following table summarizes the assumptions made on the parameters values in Ref. 11 and in this paper.

Qiu (Ref. 11)	$c_i = c_j$	$\sigma = 0$	$\psi = 1$	$\frac{\eta}{\omega} = 1$	$0 \leq \beta \leq 1$	$\theta_i = 0$
This paper	$c_i \neq c_j$	$\sigma > 0$	$0 \leq \psi \leq 1$	$0 \leq \frac{\eta}{\omega} \leq 1$	$0 \leq \beta \leq 1$	$\theta_i > 0$

As readily seen, the firms' costs of production (4) differ from the one proposed in Ref. 11 in the following aspects. First, for any given degree of spillover, the more substitutes the firms' products are the more each firm benefits from the other's accumulated capital stock, in reducing its costs. This in turn implies that, even if the degree of spillover is very high, if firms' products are unrelated (not substitutes) then these firms will not benefit from each other's capital stocks. Second, firm i 's production cost function is assumed to be quadratic in its level of production rather than linear. Note also that this formulation is more general than the one proposed in the seminal paper by d'Aspremont and Jacquemin (Ref. 15), and adopted in subsequent literature of R&D.

Assuming that each player maximizes her total discounted stream of profits over an infinite horizon, then player i 's objective functional is given by

$$\pi^i = \int_0^{\infty} e^{-rt} [P_i(t)q_i(t) - C_i(q_i(t), K_i(t), K_j(t)) - F_i(I_i(t))] dt \quad (6)$$

where $r, 0 < r \leq 1$, is the discount rate.

In addition to deciding on the level of its R&D, firm i chooses either output (in the Cournot game) or price (in the Bertrand game) levels so as to maximize π^i subject to the state dynamics in (5). Using differential game terminology, $K_i, i = 1, 2$, are the state variables, and I_i and q_i (or P_i) are the control variables. Note that the differential game at hand is a linear-quadratic one. It is well known (see, e.g., Ref. 16) that value functions of such games are quadratic and strategies are linear in state. Further, we confine our

interest to stationary Markovian feedback strategies which is standard in infinite horizon differential games in economics.

We shall compare outputs, prices, investments and R&D stocks obtained at steady state under different modes of play, i.e., Cournot, Bertrand and social planner solution. We then compare consumer surplus (CS), profits and total welfare (TW) obtained under these different modes of play which are defined as follows (the bar on a variable refers to its steady state value):

$$CS = U(\bar{q}_1, \bar{q}_2) - \bar{P}_1 \bar{q}_1 - \bar{P}_2 \bar{q}_2 \quad (7)$$

$$\pi_i = \bar{P}_i \bar{q}_i - C_i(\bar{q}_i, \bar{K}_i, \bar{K}_j) - F_i(\bar{I}_i) \quad (8)$$

$$TW = CS + \sum_{i=1}^2 \pi_i \quad (9)$$

3 Cournot Feedback Equilibrium

In the non-cooperative Cournot feedback game, firms select independently their output q_i and R&D investment levels I_i . The following proposition characterizes the resulting feedback Cournot equilibrium, where the superscript C refers to Cournot solution.

Proposition 3.1 *The firms' Cournot feedback equilibrium output and R&D investment strategies are given by*

$$q_1^C = \frac{1}{m_6} (m_1 K_1 + m_2 K_2 + m_3 A + m_4 c_1 + m_5 c_2) \quad (10)$$

$$q_2^C = \frac{1}{m_6} (m_2 K_1 + m_1 K_2 + m_3 A + m_5 c_1 + m_4 c_2) \quad (11)$$

$$I_i^C = \frac{1}{\phi} [z_{2i}^C + z_5^C K_i + z_4^C K_j - \theta_i], i, j = 1, 2, i \neq j, \quad (12)$$

where the constants m_1, \dots, m_6 are given by

$$m_1 = 2\psi\omega(\omega + \sigma) - \psi\eta^2\beta$$

$$m_2 = (2\beta(\omega + \sigma) - \omega)\eta\psi$$

$$m_3 = (2(\omega + \sigma) - \eta)\omega$$

$$m_4 = -2(\omega + \sigma)\omega$$

$$m_5 = \eta\omega$$

$$m_6 = (4(\omega + \sigma)^2 - \eta^2)\omega,$$

and the coefficients z_{ij}^C solve the system of equations in Appendix 1.

The value functions are quadratic and given by

$$V_i^C(K_i, K_j) = z_{1i}^C + z_{2i}^C K_i + z_{3i}^C K_j + z_4^C K_i K_j + \frac{z_5^C}{2} K_i^2 + \frac{z_6^C}{2} K_j^2, i, j = 1, 2, i \neq j. \quad (13)$$

Proof. We apply a standard sufficient condition for a stationary feedback equilibrium and wish to find bounded and continuously differentiable functions $V_i(K_i, K_j)$, $i, j = 1, 2, i \neq j$, satisfying the Hamilton-Jacobi-Bellman (HJB) equations

$$\begin{aligned} rV_i(K_i, K_j) = & \max_{I_i, q_i} \{ (A - \omega q_i - \eta q_j) q_i - (c_i + \sigma q_i - \psi(K_i + \frac{\eta}{\omega} \beta K_j)) q_i \\ & - \left(\theta_i I_i + \frac{\phi}{2} I_i^2 \right) + \frac{\partial V_i(\cdot)}{\partial K_i} (I_i - \delta K_i) + \frac{\partial V_i(\cdot)}{\partial K_j} (I_j - \delta K_j) \}. \end{aligned} \quad (14)$$

Differentiating the right-hand side w.r.t. q_i and I_i and equating to zero leads to

$$q_i^C = \frac{1}{2(\omega + \sigma)} \left(A + \eta q_j^C - c_i + \psi(K_i + \frac{\eta}{\omega} \beta K_j) \right), \quad i, j = 1, 2, i \neq j \quad (15)$$

$$I_i^C = \frac{1}{\phi} \left(\frac{\partial V_i(\cdot)}{\partial K_i} - \theta_i \right), \quad i, j = 1, 2, i \neq j. \quad (16)$$

Substituting for outputs and investments in (14) yields

$$\begin{aligned} rV_i(K_i, K_j) = & (A - \omega q_i^C - \eta q_j^C) q_i^C - (c_i + \sigma q_i^C - \psi(K_i + \frac{\eta}{\omega} \beta K_j)) q_i^C \\ & - \frac{\theta_i}{\phi} \left(\frac{\partial V_i(\cdot)}{\partial K_i} - \theta_i \right) - \frac{1}{2\phi} \left(\frac{\partial V_i(\cdot)}{\partial K_i} - \theta_i \right)^2 + \frac{\partial V_i(\cdot)}{\partial K_i} \left[\frac{1}{\phi} \left(\frac{\partial V_i(\cdot)}{\partial K_i} - \theta_i \right) - \delta K_i \right] \\ & + \frac{\partial V_i(\cdot)}{\partial K_j} \left[\frac{1}{\phi} \left(\frac{\partial V_j(\cdot)}{\partial K_j} - \theta_j \right) - \delta K_j \right], \quad i, j = 1, 2, i \neq j \end{aligned}$$

where q_i^C and q_j^C are given by (10) and (11).

Straightforward (however long) algebraic manipulations show that the following quadratic value functions are solutions to the above system of partial differential equations

$$V_i^C(K_i, K_j) = z_{1i}^C + z_{2i}^C K_i + z_{3i}^C K_j + z_4^C K_i K_j + \frac{z_5^C}{2} K_i^2 + \frac{z_6^C}{2} K_j^2, \quad i, j = 1, 2, i \neq j, \quad (17)$$

where the coefficients z_{ki}^C solve the system of equations given in Appendix 1. ■

The following comments apply to the results in the above proposition:

- The value functions are quadratic and the strategies linear in the state. This result is a by-product of the (linear-quadratic) structure of the game.
- Under the assumptions made before, namely that $0 \leq \beta \leq 1$ and $\eta \leq \omega$, it is easy to verify that m_1 and m_6 are positive and hence $\frac{\partial q_i^C}{\partial K_i} = \frac{m_1}{m_6} > 0$, i.e. each player's output is an increasing function of her own capital stock.
- A condition for having $\frac{\partial q_i^C}{\partial K_j} = \frac{m_2}{m_6} > 0$, $i, j = 1, 2, i \neq j$, is $\beta > \frac{\omega}{2(\sigma + \omega)}$, which means that the spillover parameter has to be above a certain threshold value for the capital stock to have a positive impact on competitor's output.

- Each player's value function in (13) involves six coefficients, three of them (z_5^C, z_6^C and z_4^C) being common to both players. The system of equations providing them is nonlinear and its solution is a priori not unique. In the numerical simulations, we chose one solution satisfying the condition of global asymptotic stability of the steady state (to be given below) and check if everything makes sense (e.g., quantities and costs are nonnegative). Note that in all numerical experiments, it turned out that only one solutions satisfy these requirements.

The following proposition characterizes the steady state.

Proposition 3.2 *If following condition holds*

$$\delta > \frac{z_5^C \pm z_4^C}{\phi}, \quad (18)$$

then Cournot feedback equilibrium steady state is given by

$$\bar{K}_i^C = \frac{-z_4^C(z_{2j}^C - \theta_j) + (z_5^C - \delta\phi)(z_{2i}^C - \theta_i)}{(z_4^C)^2 - (z_5^C - \delta\phi)^2}, i, j = 1, 2, i \neq j. \quad (19)$$

Proof. Substituting for the equilibrium values of I_i^C (from (12)) into the state dynamics (5) yields a system of first order differential equations. This system is globally asymptotically stable and yields the steady state capital stocks in (19) if condition (18) holds. ■

Given (19), we can evaluate the output and investment strategies (using (10)-(12)) as well as consumer surplus (CS^C), profits (π_i^C) and total welfare (TW^C), given by (7)-(9), at the steady state. Again the superscript C refers here to Cournot solution.

4 Bertrand Feedback Equilibrium

In the non-cooperative Bertrand game firms independently choose their price and R&D levels. The representative consumer's demand for product i is derived from equation (2) and given by

$$q_i = \frac{(\omega - \eta) A - \omega P_i + \eta P_j}{\omega^2 - \eta^2}, i, j = 1, 2, i \neq j. \quad (20)$$

The production cost and investment costs, profit function and state equation are as defined previously.

The firms' feedback equilibrium price and R&D strategies are given in the following proposition, where the superscript B stands for Bertrand equilibrium.

Proposition 4.1 *The firms' Bertrand feedback equilibrium price and R&D investment strategies are given by*

$$P_1^B = \frac{1}{y_6} [y_1 K_1 + y_2 K_2 + y_3 A + y_4 c_1 + y_5 c_2] \quad (21)$$

$$P_2^B = \frac{1}{y_6} [y_2 K_1 + y_1 K_2 + y_3 A + y_5 c_1 + y_4 c_2] \quad (22)$$

$$I_i^B = \frac{1}{\phi} [z_{2i}^B + z_5^B K_i + z_4^B K_j - \theta_i], i, j = 1, 2, i \neq j, \quad (23)$$

where the constants y_1, \dots, y_6 are given by

$$\begin{aligned} y_1 &= \psi [(\eta^2 \beta + 2\omega^2) (\eta^2 - \sigma\omega - \omega^2) - \sigma\omega\eta^2 \beta] \\ y_2 &= \omega\psi\eta [(2\beta + 1) (\eta^2 - \omega^2 - 2\sigma\omega)] \\ y_3 &= - [(\omega^2 - \eta^2)^2 + \omega(1 - \eta) (\omega^2 - \eta^2)] - 2\sigma\omega [(2\sigma\omega - \eta^2) + \omega(3\omega - \eta)] \\ y_4 &= 2\omega^2 (\sigma\omega - \eta^2 + \omega^2) \\ y_5 &= \eta\omega (2\sigma\omega - \eta^2 + \omega^2) \\ y_6 &= (\eta^2 - 2\omega^2)^2 + 4\sigma\omega (2\omega^2 - \eta^2) + \omega^2 (4\sigma^2 - \eta^2) \end{aligned}$$

and the coefficients z_{ij}^B solve the system of equations given in Appendix 2.

The value functions are quadratic and given by

$$V^i(K_i, K_j) = z_{1i}^B + z_{2i}^B K_i + z_{3i}^B K_j + z_4^B K_i K_j + \frac{z_5^B}{2} K_i^2 + \frac{z_6^B}{2} K_j^2, i, j = 1, 2, i \neq j. \quad (24)$$

Proof. Similar to that of Proposition 3.1 and it is hence omitted. ■

The following comments apply to the results in the above proposition:

- Under the assumptions made before, namely that $0 \leq \beta \leq 1$ and $\eta \leq \omega$, it is easy to verify that y_1 is negative and y_6 is positive and hence $\frac{\partial P_i^B}{\partial K_i} = \frac{y_1}{y_6} < 0$, i.e., each player's price is a decreasing function of her own capital stock. Similarly, it is easy to check that $\frac{\partial P_i^B}{\partial K_j} = \frac{x_2}{x_6} < 0, i, j = 1, 2, i \neq j$, and hence each player's price is a decreasing function of competitor's capital stock.
- Each player's value function in (24) involves six coefficients, three of them (z_5^B, z_6^B and z_4^B) being common to both players. The same comment on the chosen solution in the numerical experiments made in the Cournot case applies here.

The following proposition characterizes the steady state.

Proposition 4.2 *If the following condition holds*

$$\delta > \frac{z_5^B \pm z_4^B}{\phi}, \quad (25)$$

then Bertrand feedback equilibrium steady state is given by

$$\bar{K}_i^B = \frac{-z_4^B (z_{2j}^B - \theta_j) + (z_5^B - \delta\phi) (z_{2i}^B - \theta_i)}{(z_4^B)^2 - (z_5^B - \delta\phi)^2}, i, j = 1, 2, i \neq j. \quad (26)$$

Proof. Substituting for the equilibrium values of I_i^B , from (23), into the dynamics (5) yields a system of first order differential equations. This system is globally asymptotically stable and yields the steady state capital stocks in (26), provided that condition (25) is satisfied. ■

Given (26), we can evaluate the price and investment strategies (using (21)-(23)) as well as consumer surplus (CS^B), profits (π_i^B) and total welfare (TW^B), given by (7)-(9), at the steady state. Again the superscript B refers here to Bertrand solution.

5 First-Best Equilibrium

We determine in this section the socially optimal allocation, referred to as first-best solution, which will serve as a benchmark for Bertrand and Cournot equilibria. To obtain this allocation, it is well known that the social planner solves an optimization problem where the objective is defined as the difference between consumer's utility and producers' costs, i.e.,

$$J = \max_{(q_1, q_2, I_1, I_2)} \int_{t=0}^{\infty} e^{-rt} [U(q_1, q_2) - \sum_{i=1}^2 C_i(q_i, K_1, K_2) - \sum_{i=1}^2 F_i(I_i)] dt \quad (27)$$

$$\text{subject to (5).} \quad (28)$$

where $U(q_i, q_j)$, $C_i(q_i, K_i, K_j)$ and $F_i(I_i)$ are given by (1), (3), and (4).

The firms' socially optimal price and R&D strategies are given in the following proposition, where the superscript S stands for social optimum.

Proposition 5.1 *The socially optimal output and investment strategies are given by*

$$q_1^S = \frac{1}{v_6} [v_1 K_1 + v_2 K_2 + v_3 A + v_4 c_1 + v_5 c_2] \quad (29)$$

$$q_2^S = \frac{1}{v_6} [v_1 K_2 + v_2 K_1 + v_3 A + v_4 c_2 + v_5 c_1] \quad (30)$$

$$I_i^S = \frac{z_{2i}^S + z_5^S K_i + z_4^S K_j - \theta_i}{\phi}, i, j = 1, 2, i \neq j \quad (31)$$

where the constants v_1, \dots, v_6 are given by

$$\begin{aligned} v_1 &= \psi (2\sigma\omega + \omega^2 - \eta^2\beta) \\ v_2 &= \eta\psi (2\beta\sigma + \omega\eta - \omega) \\ v_3 &= (2\sigma + \omega - \eta)\omega \\ v_4 &= -(2\sigma + \omega)\omega \\ v_5 &= \eta \\ v_6 &= (4\sigma(\omega + \sigma) + \omega^2 - \eta^2)\omega. \end{aligned}$$

where the coefficients z_{ij}^S solve the system of equations given in Appendix 3.

The value function is quadratic and given by

$$V(K_i, K_j) = z_1^S + z_2^S K_i + z_3^S K_j + z_4^S K_i K_j + \frac{z_5^S}{2} K_i^2 + \frac{z_6^S}{2} K_j^2. \quad (32)$$

Proof. The Hamilton-Jacobi-Bellman equation of the optimization problem is

$$\begin{aligned} rV(K_i, K_j) = \max_{q_i, q_j, I_i, I_j} & \left\{ U(q_i, q_j) - \sum_{i=1}^2 C_i(q_i, K_i, K_j) \right. \\ & \left. - \sum_{i=1}^2 C_i(I_i) + \sum_{i=1}^2 \frac{\partial V(\cdot)}{\partial K_i} (I_i - \delta K_i) \right\}, i, j = 1, 2, i \neq j \end{aligned} \quad (33)$$

Differentiating the right-hand side with respect to $q_i, i = 1, 2$, and equating to zero leads to the results in (29)-(30). The maximization with respect to I_i yields

$$I_i(K_i, K_j) = 1/\phi(\partial V/\partial K_i - \theta_i), i, j = 1, 2, i \neq j$$

Substituting for outputs and investments in (33) yields

$$\begin{aligned} rV(K_i, K_j) = & U(q_i, q_j) - \sum_{i=1}^2 C_i(q_i, K_i, K_j) - \sum_{i=1}^2 \left[\frac{\theta_i}{\phi} \left(\frac{\partial V}{\partial K_i} - \theta_i \right) \right] \\ & - \sum_{i=1}^2 \left[\frac{1}{2\phi} \left(\frac{\partial V}{\partial K_i} - \theta_i \right)^2 \right] + \left[\frac{\partial V(\cdot)}{\partial K_i} \right] \left[\frac{1}{\phi} \left(\frac{\partial V}{\partial K_i} - \theta_i \right) - \delta K_i \right] \\ & + \left[\frac{\partial V}{\partial K_j} \right] \left[\frac{1}{\phi} \left(\frac{\partial V}{\partial K_j} - \theta_j \right) - \delta K_j \right]. \end{aligned}$$

The following quadratic value function solves the above partial differential equation

$$V(K_i, K_j) = z_1 + z_2 K_i + z_3 K_j + z_4 K_i K_j + \frac{z_5}{2} K_i^2 + \frac{z_6}{2} K_j^2, i, j = 1, 2, i \neq j \quad (34)$$

where the coefficients are given in Appendix 3. ■

The following comments apply to the results in the above proposition:

- Under the assumptions made before, namely that $0 \leq \beta \leq 1$ and $\eta \leq \omega$, it is easy to verify that v_1 and v_6 are positive and hence $\frac{\partial q_i^S}{\partial K_i} = \frac{v_1}{v_6} > 0$, i.e. each player's output is an increasing function of her own capital stock.
- A condition for having $\frac{\partial q_i^S}{\partial K_j} = \frac{v_2}{v_6} > 0, i, j = 1, 2, i \neq j$, is $\beta > \frac{\omega(1-\eta)}{2\sigma}$ which means, as in the Cournot scenario, that the spillover rate has to be above a certain threshold value to increase own output when the capital stock of the other player increases.

- Each player's value function in (13) involves six coefficients, three of them (z_5^C, z_6^C and z_4^C) are common to both players. These coefficients satisfy the system of equations given in Appendix 3. As one can expect, this solution is not unique and the previous remarks regarding the numerical simulations applies here.

The following proposition characterizes the steady state.

Proposition 5.2 *If the following condition holds*

$$\delta > \frac{1}{2\phi} [z_5 + z_6 \pm \sqrt{z_5^2 - 2z_5z_6 + 4z_4^2}], \quad (35)$$

then social optimum steady state capital stocks are given by

$$\bar{K}_1^S = \frac{-z_4^S(z_3^S - \theta_2) + (z_6^S - \delta\phi)(z_2^S - \theta_1)}{(z_4^S)^2 - (\delta\phi - z_6^S)(\delta\phi - z_5^S)}, \quad (36)$$

$$\bar{K}_2^S = \frac{-z_4^S(z_2^S - \theta_1) + (z_5^S - \delta\phi)(z_3^S - \theta_2)}{(z_4^S)^2 - (\delta\phi - z_6^S)(\delta\phi - z_5^S)}. \quad (37)$$

Proof. Substituting for the equilibrium values of I_i^P , from (31), into the dynamics (5) yields a system of first order differential equations. This system is globally asymptotically stable and yields the steady state capital stocks in (36)-(37), provided that condition (35) is satisfied. ■

Given (36)-(37), we can evaluate the output and investment strategies (using (29)-(31)) as well as consumer surplus (CS^S), profits (π_i^S) and total welfare (TW^S), given by (7)-(9), at the steady state. Again the superscript S refers here to Social optimum.

6 Comparison

As highlighted before, the proposed value functions for Cournot and Bertrand equilibria as well as for the first-best optimum have multiple solutions. Further, these value functions are not amenable to analytical comparison. For this reason, we shall compare numerically the strategies, profits, consumer surplus and total welfare at the steady state. We shall check that each derived solution is an interior one, satisfies the conditions for asymptotic stability and the costs of production and investment are positive.

Recall that the model includes the following thirteen parameters

Demand function:	A, ω, η
Investment cost functions:	θ_1, θ_2, ϕ
Production cost functions:	$c_1, c_2, \sigma, \psi, \beta$
Depreciation and discount rates:	$\delta, r.$

Varying all these parameters in an ordered manner, e.g., one at a time, poses no conceptual difficulty but will induce a huge number of tables to report. Instead, we choose to fix once for all the values of the following parameters which do not play an essential role with respect to the objectives of the paper:

$$A = 100, \quad \psi = 0.4, \quad \delta = 0.09, \quad r = 0.6, \quad \omega = 2, \quad \sigma = 1.$$

Further, we organize the simulations into two sets where in the first one we consider a symmetric setting, i.e., the players have the same investment and production costs, and in the second an asymmetric one.

6.1 Symmetric Games

Assume that the players have the same cost parameters, i.e., $\theta_1 = \theta_2 = 3$ and $c_1 = c_2 = 5$. Three parameters, namely β , η and ϕ will be varied in turn to assess the impact of spillover, products substitutability and investment cost on steady state and payoffs.

Table 1 provides the results for various values of the spillover parameter β for a given “high” ϕ ($\phi = 6$) and a given high level of products substitutability ($\frac{\eta}{\omega} = \frac{1.8}{2}$). Note that a high value for ϕ corresponds to a low productivity of investment in process R&D. In Table 2 the level of products substitutability is given a low value ($\frac{\eta}{\omega} = \frac{0.3}{2}$). From these results we note the following:

- Prices are the lowest under first-best followed by Bertrand and Cournot. The same ordering applies to consumer surplus and total welfare. Hence, if consumer has a say with respect to the solution to be chosen, his preference would be clear cut. This is by no mean a surprising result.
- Firms make the highest profits in the Cournot equilibrium. The ordering between first-best and Bertrand depends on the values of β and η . If the spillover parameter is high ($\beta = 0.9$) and the degree of products substitutability is also high ($\frac{\eta}{\omega} = \frac{1.8}{2}$), then first-best leads to higher profits than Bertrand. In all other cases, we obtain the reverse. Note that when $\frac{\eta}{\omega}$ is low, profits under Bertrand and Cournot are very close. This could be explained by the fact that when the products are only far substitutes, each firm faces little competition and therefore in this near monopolistic situation it does not matter to play Bertrand or Cournot from profits perspective.
- In all cases, first-best leads to the highest steady-state levels of R&D capital, followed by Cournot and Bertrand. Note that when the degree of products substitutability is low, Cournot and Bertrand steady-state stocks are very close to each other and almost do not vary with the degree of spillover.

Table 1: Equilibrium values for symmetric games with low R&D productivity and high products substitutability

Values of parameters	$A = 100, \phi = 6, \delta = .09, \psi = .4, \theta_1 = 3, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 5, \omega = 2, \sigma = 1$								
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{1.8}{2}$			$\beta = 0.4, \frac{\eta}{\omega} = \frac{1.8}{2}$			$\beta = 0, \frac{\eta}{\omega} = \frac{1.8}{2}$		
Values of variables at equilibria	Cournot	Bertrand	First Best	Cournot	Bertrand	First Best	Cournot	Bertrand	First Best
K_1	5.8349	2.99634	34.68377	7.8366	5.4376	21.2713	9.3949	7.3678	12.9899
K_2	5.8349	2.99634	34.68377	7.8366	5.4376	21.2713	9.3949	7.3678	12.9899
I_1	0.52514	0.26967	3.12154	0.7053	0.4894	1.9144	0.8455	0.6631	1.16910
I_2	0.52514	0.26967	3.12154	0.7053	0.4894	1.9144	0.8455	0.6631	1.16910
q_1	12.7211	15.7232	20.70880	12.7260	15.8508	18.3744	12.6613	15.8490	17.2752
q_2	12.7211	15.7232	20.70880	12.7260	15.8508	18.3744	12.6613	15.8490	17.2752
P_1	51.6599	40.25186	21.30655	51.6411	39.7669	30.1772	51.8871	39.7736	34.3543
P_2	51.6599	40.25186	21.30655	51.6411	39.7669	30.1772	51.8871	39.7736	34.3543
TC_1	174.094	292.7529	50.97538	174.9381	285.8015	233.6083	180.7152	287.037	302.6534
TC_2	174.094	292.7529	50.97538	174.9381	285.8015	233.6083	180.7152	287.037	302.6534
π_1	483.075	340.1349	390.2578	482.2479	344.5363	320.8807	476.2423	343.337	290.8239
π_2	483.075	340.1349	390.2578	482.2479	344.5363	320.8807	476.2423	343.337	290.8239
$\pi_1 + \pi_2$	966.150	680.2698	780.5156	964.4958	689.0726	641.7615	952.4846	686.674	581.6478
CS	614.939	939.4318	1629.646	615.4178	954.7443	1282.9519	609.1701	954.531	1134.039
TW	1581.089	1619.7016	2410.161	1579.9136	1643.8169	1924.7134	1561.654	1641.20	1715.687

Table 2: Equilibrium values for symmetric games with low R&D productivity and low products substitutability

Values of parameters	$A = 100, \phi = 6, \delta = .09, \psi = .4, \theta_1 = 3, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 5, \omega = 2, \sigma = 1$								
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{0.3}{2}$			$\beta = 0.4, \frac{\eta}{\omega} = \frac{3}{2}$			$\beta = 0, \frac{\eta}{\omega} = \frac{3}{2}$		
Values of variables at equilibria	Cournot	Bertrand	First Best	Cournot	Bertrand	First Best	Cournot	Bertrand	First Best
K_1	11.4465	11.4386	24.5182	11.4516	11.4442	22.0605	11.4564	11.4496	20.1771
K_2	11.4465	11.4386	24.5182	11.4516	11.4442	22.0605	11.4564	11.4496	20.1771
I_1	1.0302	1.0293	2.2066	1.0306	1.0299	1.9854	1.3011	1.0305	1.8159
I_2	1.0302	1.0293	2.2066	1.0306	1.0299	1.9854	1.3011	1.0305	1.8159
q_1	15.9042	16.0181	24.6817	15.8501	15.9636	24.2683	15.8068	15.92	23.9699
q_2	15.9042	16.0181	24.6817	15.8501	15.9636	24.2683	15.8068	15.92	23.9699
P_1	63.4202	63.1584	43.2321	63.5448	63.2837	44.1829	63.6445	63.3839	44.8691
P_2	63.4202	63.1584	43.2321	63.5448	63.2837	44.1829	63.6445	63.3839	44.8691
TC_1	256.0905	259.753	479.083	259.7943	263.4663	501.0764	262.7342	266.413	516.2919
TC_2	256.0905	259.753	479.083	259.7943	263.4663	501.0764	262.7342	266.413	516.2919
π_1	752.5604	751.923	587.958	747.3959	746.7699	571.167	743.2784	742.660	559.2184
π_2	752.5604	751.923	587.958	747.3959	746.7699	571.167	743.2784	742.660	559.2184
$\pi_1 + \pi_2$	1505.1208	1503.84	1175.916	1494.791	1493.539	1142.335	1486.556	1485.32	1118.4368
CS	581.7734	590.131	1401.127	577.8172	586.1243	1354.585	574.6635	582.929	1321.4859
TW	2086.8942	2093.97	2577.143	2072.609	2079.664	2496.920	2061.220	2068.25	2439.9226

In Tables 3 and 4, we provide the same type of results with a lower value for ϕ ($\phi = 2$)². The main difference with the above results is that now Cournot produces a higher total welfare than Bertrand when the degree of products substitutability is high ($\frac{\eta}{\omega} = \frac{1.8}{2}$) provided that the spillover rate is high ($\beta = 0.9$) or moderate ($\beta = 0.4$)³. When the spillover rate is near zero, then we recover again the result that total welfare is higher under Bertrand. This shows that the investment cost has a significant effect on the results, not only quantitatively speaking but also qualitatively.

Table 3: Equilibrium values for symmetric games with high R&D productivity and high products substitutability

Values of parameters	$A = 100, \phi = 2, \delta = .09, \psi = .4, \theta_1 = 3, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 5, \omega = 2, \sigma = 1$					
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{1.8}{2}$		$\beta = 0.4, \frac{\eta}{\omega} = \frac{1.8}{2}$		$\beta = 0, \frac{\eta}{\omega} = \frac{1.8}{2}$	
Values of variables at equilibria	Cournot	Bertrand	Cournot	Bertrand	Cournot	Bertrand
K_1	21.6643	10.52185	27.93956	18.75377	32.47696	25.07075
K_2	21.6643	10.52185	27.93956	18.75377	32.47696	25.07075
I_1	1.94979	0.94697	2.51456	1.68784	2.92293	2.25637
I_2	1.94979	0.94697	2.51456	1.68784	2.92293	2.25637
q_1	14.19038	16.60482	14.12809	17.02299	13.84497	16.99487
q_2	14.19038	16.60482	14.12809	17.02299	13.84497	16.99487
P_1	46.07655	36.90167	46.31325	35.31265	47.38911	35.41949
P_2	46.07655	36.90167	46.31325	35.31265	47.38911	35.41949
TC_1	59.39401	235.98945	69.37557	209.13992	98.36335	215.23062
TC_2	59.39401	235.98945	69.37557	209.13992	98.36335	215.23062
π_1	594.44981	376.75624	584.94229	391.98689	557.7375	386.71906
π_2	594.44981	376.75624	584.94229	391.98689	557.7375	386.71906
$\pi_1 + \pi_2$	1188.8996	753.75624	1169.88458	783.97378	1115.4750	773.43812
CS	765.19442	1047.73679	758.49138	1101.17174	728.3963	1097.53737
TW	1954.0940	1801.24927	1928.37596	1885.14552	1843.8713	1870.97549

6.2 Asymmetric Games

We now turn to the case where the players differ in terms of their production and investment costs. We adopt the following parameters' values

$$c_1 = 5, \quad c_2 = 7, \quad \theta_1 = 2, \quad \theta_2 = 3,$$

assuming hence that player 1 has both a lower investment and production cost.

In Tables 5 and 6, the results are reported for a low investment productivity ($\phi = 6$) and various spillover rates β and products substitutability parameter $\frac{\eta}{\omega}$. It is straightforward to

²We present from now on only the results for Bertrand and Cournot equilibria. The results for the first-best are clear-cut without any surprise.

³Our numerical experiments show that for even lower values for β one still has the same qualitative result. For instance for $\beta = 0.2$, whereas total welfare is 1892.593 in Cournot equilibrium, it is equal to 1887.084 in Bertrand equilibrium. Profits are, as in all other experiments, higher under Cournot than under Bertrand and consumer surplus is higher under Bertrand.

see that the results are qualitatively similar to those obtained in the symmetric case. The main (expected) difference is that the cost-advantaged player is doing better, profit-wise, than her competitor.

Table 4: Equilibrium values for symmetric games with high R&D productivity and low products substitutability

Values of parameters	$A = 100, \phi = 2, \delta = .09, \psi = .4, \theta_1 = 3, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 5, \omega = 2, \sigma = 1$					
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{0.3}{2}$		$\beta = 0.4, \frac{\eta}{\omega} = \frac{.3}{2}$		$\beta = 0, \frac{\eta}{\omega} = \frac{.3}{2}$	
Values of variables at equilibria	Cournot	Bertrand	Cournot	Bertrand	Cournot	Bertrand
K_1	41.23081	41.19829	40.68892	40.69951	40.28109657	40.25403817
K_2	41.23081	41.19829	40.68892	40.69951	40.28109657	40.25403817
I_1	3.71077	3.70785	3.6620	3.65936	3.625298693	3.622863433
I_2	3.71077	3.70785	3.6620	3.65936	3.625298693	3.622863433
q_1	18.0506	18.17810	17.81779	17.94399	17.63689502	17.76204880
q_2	18.0506	18.17810	17.81779	17.94399	17.63689502	17.76204880
P_1	58.48362	58.190367	59.01907	58.72778	59.43514145	59.14728775
P_2	58.48362	58.190367	59.01907	58.72778	59.43514145	59.14728775
TC_1	103.0940	106.20189	123.56461	126.72778	139.0898391	142.2966752
TC_2	103.0940	106.20189	123.56461	126.72778	139.0898391	142.2966752
π_1	952.5704	951.58849	928.0251	927.10157	909.1615109	908.2803368
π_2	952.5704	951.58849	928.0251	927.10157	909.1615109	908.2803368
$\pi_1 + \pi_2$	1905.1408	1903.17698	1856.0502	1854.20312	1818.3230218	1816.5606736
CS	749.3956	760.01957	730.1897	740.56973	715.438152	725.627869
TW	2654.5364	2663.19655	2586.2399	2594.77285	2533.761174	2542.188542

Table 5: Equilibrium values for asymmetric games with low R&D productivity and high products substitutability

Values of parameters	$A = 100, \phi = 6, \delta = .09, \psi = .4, \theta_1 = 2, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 7, \omega = 2, \sigma = 1$					
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{1.8}{2}$		$\beta = 0.4, \frac{\eta}{\omega} = \frac{1.8}{2}$		$\beta = 0, \frac{\eta}{\omega} = \frac{1.8}{2}$	
Values of variables at equilibria	Cournot	Bertrand	Cournot	Bertrand	Cournot	Bertrand
K_1	7.8774498	5.046532165	9.947360497	7.58726556	11.57937346	9.627724094
K_2	5.5616956	2.736031195	7.433123903	5.021198298	8.859348795	6.784316611
I_1	0.7089704	0.4541878949	0.8952624456	0.68285390	1.042143611	0.8664951688
I_2	0.5005526	0.2462428079	0.6689811520	0.45190784	0.7973413915	0.6105884951
q_1	12.934043	16.08785539	12.97209033	16.28019724	12.94297207	16.34950605
q_2	12.415948	15.24460026	12.34265115	15.25038592	12.20773163	15.13347395
P_1	51.783204	40.38400876	51.83904727	39.98891073	52.14013893	40.06073481
P_2	51.886823	40.55265978	51.96493511	40.19487299	52.28718701	40.30394125
TC_1	170.82363	294.0489846	171.8304307	288.0300744	177.6292606	290.0758969
TC_2	184.01010	298.4207067	187.7115049	294.0032162	195.5210960	296.8384604
π_1	498.94258	355.6431084	500.6303731	362.9972797	497.2191013	364.8973292
π_2	460.21404	319.7883811	453.6735612	318.9841089	442.7868507	313.1001846
$\pi_1 + \pi_2$	959.15663	675.4314895	954.3039343	681.9813886	940.0059520	677.9975138
CS	610.50443	932.6721922	608.8141389	944.5218209	600.9570303	941.6930640
TW	1569.6610	1608.103682	1563.118073	1626.503210	1540.962982	1619.690578

Decreasing the value of ϕ to 2 (Tables 7 and 8), leads also to the same qualitative results as in the symmetric case. Again, we obtain that Cournot is more efficient, i.e., produces a higher total welfare, than Bertrand when the products substitutability rate is high and the spillover rate is high ($\beta = 0.9$) or moderate ($\beta = 0.4$). Actually, this last result still holds

Table 6: Equilibrium values for asymmetric games with low R&D productivity and low products substitutability

Values of parameters	$A = 100, \phi = 6, \delta = .09, \psi = .4, \theta_1 = 2, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 7, \omega = 2, \sigma = 1$					
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{0.3}{2}$		$\beta = 0.4, \frac{\eta}{\omega} = \frac{.3}{2}$		$\beta = 0, \frac{\eta}{\omega} = \frac{.3}{2}$	
Values of variables at equilibria	Cournot	Bertrand	Cournot	Bertrand	Cournot	Bertrand
K_1	13.45664526	13.44885444	13.46503742	13.45782922	13.47276976	13.46602092
K_2	11.07515611	11.06718015	11.06695735	11.05953989	11.06114481	11.05416641
I_1	1.211098073	1.210396900	1.211853368	1.211204630	1.212549279	1.211941883
I_2	0.9967640503	0.9960462136	0.9960261611	0.9953585897	0.9955030331	0.9948749771
q_1	16.05227744	16.16738402	16.00068918	16.11550760	15.95954636	16.07413095
q_2	15.55683967	15.66799246	15.49162284	15.60237642	15.43943233	15.54986184
P_1	63.22839322	62.96483425	63.35113479	63.08827189	63.44907758	63.18677955
P_2	64.07063743	63.81379991	64.21654757	63.96059489	64.33327143	64.07803703
TC_1	248.7553487	252.4020073	252.4251266	256.0811606	255.3330603	258.9968003
TC_2	276.6617598	280.3875060	280.8116824	284.5476563	284.1005663	287.8448856
π_1	766.2043613	765.5746477	761.2366904	760.6183644	757.2854347	756.6757687
π_2	720.0748743	719.4466298	714.0068526	713.3896212	709.1686245	708.5597372
$\pi_1 + \pi_2$	1486.279236	1485.021278	1475.243543	1474.007986	1466.454059	1465.235506
CS	574.6076839	582.8634282	570.3754250	578.5757995	567.0050912	575.1610432
TW	2060.886920	2067.884706	2045.618968	2052.583786	2033.459150	2040.396549

Table 7: Equilibrium values for asymmetric games with high R&D productivity and high products substitutability

Values of parameters	$A = 100, \phi = 2, \delta = .09, \psi = .4, \theta_1 = 2, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 7, \omega = 2, \sigma = 1$					
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{1.8}{2}$		$\beta = 0.4, \frac{\eta}{\omega} = \frac{1.8}{2}$		$\beta = 0, \frac{\eta}{\omega} = \frac{1.8}{2}$	
Values of variables at equilibria	Cournot	Bertrand	Cournot	Bertrand	Cournot	Bertrand
K_1	28.506168	17.21645979	35.35324635	26.2590336	40.78967653	33.92397885
K_2	21.312721	10.04574688	26.61204263	17.22540662	29.84343264	21.87807479
I_1	2.5655551	1.549481381	3.181792171	2.36331303	3.671070887	3.053158094
I_2	1.9181449	0.9041172196	2.395083836	1.55028659	2.685908939	1.969026730
q_1	14.666568	17.30048053	14.71661672	17.96001118	14.62173236	18.33763553
q_2	14.060210	16.31405645	13.70762907	16.28845737	13.10304247	15.69485974
P_1	45.358484	36.03373760	45.89303423	34.76075441	47.17105883	35.07398119
P_2	45.479755	36.23102242	46.09483176	35.09506515	47.47479681	35.60253635
TC_1	31.641810	215.8576892	42.14115715	189.4798534	69.15632896	194.5509210
TC_2	55.820086	227.3198838	81.07524960	212.5656151	122.2669467	228.6274608
π_1	633.61149	407.5432866	633.2490378	434.8236844	620.5662684	448.6229626
π_2	583.63486	363.7550612	550.7756062	359.0788575	499.7973322	330.1493536
$\pi_1 + \pi_2$	1217.2463	771.2983478	1184.024644	793.9025419	1120.363601	778.7723162
CS	783.98482	1073.488884	767.5917642	1114.449421	730.3453041	1100.649418
TW	2001.2311	1844.787232	1951.616408	1908.351963	1850.708905	1879.421734

true provided that the spillover parameter is not close to zero. Indeed, if we let $\beta = 0.2$, then total welfare would be equal to 1907.136 in Cournot equilibrium and to 1902.416 in Bertrand equilibrium. Ranking of profits and consumer surplus are the same as in all other experiments.

Table 8: Equilibrium values for asymmetric games with high R&D productivity and low products substitutability

Values of parameters	$A = 100, \phi = 2, \delta = .09, \psi = .4, \theta_1 = 2, \theta_2 = 3, r = 0.6, c_1 = 5, c_2 = 7, \omega = 2, \sigma = 1$					
	$\beta = 0.9, \frac{\eta}{\omega} = \frac{0.3}{2}$		$\beta = 0.4, \frac{\eta}{\omega} = \frac{.3}{2}$		$\beta = 0, \frac{\eta}{\omega} = \frac{.3}{2}$	
Values of variables at equilibria	Cournot	Bertrand	Cournot	Bertrand	Cournot	Bertrand
K_1	48.45285085	48.41961795	47.82626857	47.79746190	47.45453796	47.42820490
K_2	40.15112275	40.11682688	39.33904842	39.30891718	38.80647554	38.77862366
I_1	4.360756564	4.357765622	4.304364168	4.301771569	4.270908419	4.268538444
I_2	3.613601060	3.610514424	3.540514357	3.537802548	3.492582801	3.490076130
q_1	18.54059412	18.67188777	18.30918498	18.43929980	18.13795917	18.26713483
q_2	17.68578747	17.81021391	17.39844905	17.52122857	17.18020041	17.30164719
P_1	57.61307552	57.31316030	58.16209532	57.86503187	58.57002154	58.27523622
P_2	59.06624682	58.77800587	59.71034641	59.42575297	60.19821143	59.91656519
TC_1	64.65746901	67.62114333	86.35807756	89.37647226	102.1664456	105.2304209
TC_2	130.1707686	133.3792247	153.9061164	157.1760098	171.4153611	174.7357597
π_1	1003.523180	1002.523754	978.5424844	977.6141987	960.1742134	959.2911761
π_2	914.4623194	913.4696333	884.9613036	884.0361912	862.8019759	861.9195123
$\pi_1 + \pi_2$	1917.985499	1915.993387	1863.503788	1861.650390	1822.976189	1821.210688
CS	754.912211	765.608206	733.497710	743.924982	717.628981	727.850666
TW	2672.897710	2681.601593	2597.001498	2605.575372	2540.605170	2549.061354

7 Concluding Remarks

The numerical experiments (both symmetric and asymmetric) suggest the following:

- Bertrand prices (quantities) are lower (higher) than their Cournot counterparts. Consumer surplus under Bertrand competition is always higher than under Cournot competition. These results are expected in view of those in, e.g., Refs. 1-3.
- Firms' profits under Bertrand competition are always lower than those of the Cournot competition. Note however that they are very close when the rate of products substitutability is low.
- Firms' capital stocks and process R&D investments under Cournot competition are higher than their Bertrand counterparts. The same result has been obtained by Qiu (Ref. 11).
- Bertrand competition is more efficient than Cournot if either R&D productivity is low, or products are very different. Cournot competition is more efficient provided that R&D productivity is high, products are close substitutes and R&D spillovers are not close to zero.

Comparing our results to Qiu's ones, we obtain that his conclusions still hold true with one important difference however. Indeed, our simulations show that for any but not close to zero spillover rate (and not only for strong spillovers as in his case), Cournot is more efficient than Bertrand provided that R&D productivity is high and the products are close substitute.

Given the important role played by the spillover rate, a natural extension to this work is to allow for endogenous R&D spillovers by letting, e.g., the firm invests in acquiring knowledge from its competitor's R&D.

Appendix 1

The coefficients of the value functions in Cournot game are the solutions of the following nonlinear system of equations

$$\begin{aligned}
-z_5^2 - 2z_4^2 + nz_5 + C1 &= 0 \\
-z_4^2 - 2z_6z_5 + nz_6 + C2 &= 0 \\
-2z_4z_5 - z_6z_4 + nz_4 + C3 &= 0 \\
(-z_{21} + \theta_1)z_5 + (-z_{22} + \theta_2 - z_{31})z_4 + mz_{21} + C4 &= 0 \\
(\theta_2 - z_{22})z_6 + (-z_{21} + \theta_1)z_4 - z_{31}z_5 + mz_{31} + C5 &= 0 \\
(-2z_{22} + 2\theta_2)z_{31} - z_{21}^2 - \theta_1^2 + 2\phi rz_{11} + 2z_{21}\theta_1 + C6 &= 0 \\
(\theta_2 - z_{22})z_5 + (\theta_1z_{21} - z_{32})z_4 + mz_{22} + C7 &= 0 \\
(-z_{21} + \theta_1)z_6 + (\theta_2 - z_{22})z_4 + mz_{32} - z_{32}z_5 + C8 &= 0 \\
(2\theta_1 - 2z_{21})z_{32} + 2z_{22}\theta_2 + 2\phi rz_{12} - z_{22}^2 - \theta_2^2 + C9 &= 0
\end{aligned}$$

where

$$\begin{aligned}
C1 &= -\frac{2\phi\psi^2(\sigma + \omega)(-2\omega^2 - 2\sigma\omega + \eta^2\beta)^2}{\omega^2(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2} \\
C2 &= -\frac{2\phi\eta^2\psi^2(\sigma + \omega)(-\omega + 2\omega\beta + 2\beta\sigma)^2}{\omega^2(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2} \\
C3 &= \frac{2\phi\psi^2\eta(\sigma + \omega)(-\omega + 2\omega\beta + 2\beta\sigma)(\eta^2\beta - 2\omega^2 - 2\sigma\omega)}{\omega^2(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2} \\
C4 &= -\frac{2\phi\psi(\sigma + \omega)(-2\omega A + 2\omega c_1 + A\eta - 2A\sigma - \eta c_2 + 2\sigma c_1)(\eta^2\beta - 2\omega^2 - 2\sigma\omega)}{\omega(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2} \\
C5 &= \frac{2\phi\eta\psi(\sigma + \omega)(-2\omega A + 2\omega c_1 + A\eta - 2A\sigma - \eta c_2 + 2\sigma c_1)(-\omega + 2\omega\beta + 2\beta\sigma)}{\omega(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2} \\
C6 &= -\frac{2\phi(\sigma + \omega)(-2\omega A + 2\omega c_1 + A\eta - 2A\sigma - \eta c_2 + 2\sigma c_1)^2}{(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2} \\
C7 &= \frac{2\phi\psi(\sigma + \omega)(-2\omega c_2 + 2\omega A - 2\sigma c_2 - A\eta + c_1\eta + 2A\sigma)(\eta^2\beta - 2\omega^2 - 2\sigma\omega)}{\omega(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2}
\end{aligned}$$

$$C8 = -\frac{2\phi\eta\psi(\sigma + \omega)(-2\omega c_2 + 2\omega A - 2\sigma c_2 - A\eta + c_1\eta + 2A\sigma)(-\omega + 2\omega\beta + 2\beta\sigma)}{\omega(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2}$$

$$C9 = -\frac{2\phi(\sigma + \omega)(-2\omega c_2 + 2\omega A - 2\sigma c_2 - A\eta + c_1\eta + 2A\sigma)^2}{(2\sigma + 2\omega + \eta)^2(2\sigma + 2\omega - \eta)^2}$$

$$n = \phi(r + 2\delta), \quad m = \phi(r + \delta)$$

Appendix 2

The coefficients of the value functions in Bertrand game are the solutions of the following nonlinear system of equations

$$\begin{aligned} -z^2 + nz_5 - 2z_4^2 + C_1 &= 0 \\ -z_4^2 + nz_6 - 2z_6z_5 + C_2 &= 0 \\ -2z_5z_4 - z_6z_4 + nz_4 + C_3 &= 0 \\ (\theta_1 - z_{21})z_5 + (-z_{22} + \theta_2 - z_{31})z_4 + mz_{21} + C_4 &= 0 \\ (\theta_2 - z_{22})z_6 + mz_{31} + (-z_{21} + \theta_1)z_4 - z_{31}z_5 + C_5 &= 0 \\ -2z_{31}z_{22} + 2z_{31}\theta_2 - \theta_1^2 - z_{21}^2 + 2\phi r z_{11} + 2\theta_1 z_{21} + C_6 &= 0 \\ (\theta_1 - z_{21} - z_{32})z_4 + mz_{22} + (-z_{22} + \theta_2)z_5 + C_7 &= 0 \\ (\theta_2 - z_{22})z_4 - z_{32}z_5 + (-z_{21} + \theta_1)z_6 + mz_{32} + C_8 &= 0 \\ 2z_{32}\theta_1 + 2\theta_2 z_{22} - \theta_2^2 - z_{22}^2 + 2\phi r z_{12} - 2z_{32}z_{21} + C_9 &= 0 \end{aligned}$$

where

$$\begin{aligned} C_1 &= \frac{2(\eta^2 - \sigma\omega - \omega^2)(\eta^2\beta + \eta^2 - 2\sigma\omega - 2\omega^2)^2\psi^2\omega\phi}{(-2\omega^2 - 2\sigma\omega - \eta\omega + \eta^2)^2(-2\omega^2 - 2\sigma\omega + \eta\omega + \eta^2)^2} \\ C_2 &= \frac{2(\eta^2 - \sigma\omega - \omega^2)(\eta^2\beta + \omega^2 - 2\sigma\omega\beta - 2\omega^2\beta)^2\psi^2\eta^2\phi}{\omega(-2\omega^2 - 2\sigma\omega - \eta\omega + \eta^2)^2(-2\omega^2 - 2\sigma\omega + \eta\omega + \eta^2)^2} \\ C_3 &= \frac{2(\omega^2 + \omega\sigma - \eta^2)(-\omega^2 + 2\omega^2\beta + 2\beta\omega\sigma - \eta^2\beta)(-2\omega\sigma - 2\omega^2 + \eta^2 + \eta^2\beta)\psi^2\eta\phi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2} \\ C_4 &= -\frac{2(\omega^2 + \omega\sigma - \eta^2)\Phi(-2\omega\sigma - 2\omega^2 + \eta^2 + \eta^2\beta)\omega\phi\psi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2} \\ C_5 &= \frac{2(\omega^2 + \omega\sigma - \eta^2)\Phi(-\omega^2 + 2\omega^2\beta + 2\sigma\beta\omega - \eta^2\beta)\omega\phi\psi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2} \\ C_6 &= -\frac{2(\omega^2 + \omega\sigma - \eta^2)\Phi^2\omega\phi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2} \\ C_7 &= -\frac{2(\omega^2 + \omega\sigma - \eta^2)\Psi(-2\omega^2 - 2\omega\sigma + \eta^2\beta)\omega\phi\psi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2} \end{aligned}$$

$$C_8 = \frac{2(\omega^2 + \omega\sigma - \eta^2)\Psi(2\omega^2\beta - \omega^2 + 2\sigma\beta\omega - \eta^2\beta)\phi\eta\psi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2}$$

$$C_9 = -\frac{2(\omega^2 + \omega\sigma - \eta^2)\Psi^2\omega\phi}{(2\omega\sigma - \eta^2 + 2\omega^2 + \omega\eta)^2(2\omega\sigma - \eta^2 + 2\omega^2 - \omega\eta)^2}$$

$$n = \phi(r + 2\delta), \quad m = \phi(r + \delta)$$

$$\Phi = (-2\omega^2A + 2\omega^2c_1 + \omega\eta A + 2\omega\sigma c_1 - \omega\eta c_2 - 2\omega\sigma A - c_1\eta^2 + A\eta^2)$$

$$\Psi = (2\omega^2c_2 - 2\omega^2A - \omega c_1\eta + 2\omega\sigma c_2 + \omega\eta A - 2\omega\sigma A + A\eta^2 - c_2\eta^2)$$

Appendix 3

The coefficients of the value function of social optimum are the solutions of the following nonlinear system of equations

$$\begin{aligned} -z_5^2 - z_4^2 + nz_5 + C_1 &= 0 \\ -z_4^2 - z_6^2 + nz_6 + C_2 &= 0 \\ (-z_6 + n - z_5)z_4 + C_3 &= 0 \\ (-z_2 + \theta_1)z_5 + (-z_3 + \theta_2)z_4 + mz_2 + C_4 &= 0 \\ (-z_3 + \theta_2)z_6 + mz_3 + (-z_2 + \theta_1)z_4 + C_5 &= 0 \\ -z_2^2 - z_3^2 - \theta_2^2 - \theta_1^2 + 2z_2\theta_1 + 2\phi r z_1 + 2z_3\theta_2 + C_6 &= 0 \end{aligned}$$

where

$$C_1 = -\frac{(\omega^3 + 2\sigma\omega^2 + \omega\eta^2\beta^2 - 2\omega\eta^2\beta + 2\sigma\eta^2\beta^2)\psi^2\phi}{\omega^2(2\sigma + \omega + \eta)(2\sigma + \omega - \eta)}$$

$$C_2 = -\frac{(\omega^3 + 2\sigma\omega^2 + \omega\eta^2\beta^2 - 2\omega\eta^2\beta + 2\sigma\eta^2\beta^2)\psi^2\phi}{\omega^2(2\sigma + \omega + \eta)(2\sigma + \omega - \eta)}$$

$$C_3 = \frac{(\omega^2 - 2\omega^2\beta - 4\sigma\beta\omega + \eta^2\beta^2)\phi\eta\psi^2}{\omega^2(2\sigma + \omega + \eta)(2\sigma + \omega - \eta)}$$

$$C_4 = \frac{(-\Psi + \omega^2c_1 + c_2\eta\beta\omega - c_2\eta\omega - \eta\beta A\sigma\omega + 2c_1\sigma\omega + 2c_2\sigma\eta\beta - c_1\eta^2\beta)\phi\psi}{\omega(2\sigma + \omega + \eta)(2\sigma + \omega - \eta)}$$

$$C_5 = -\frac{(-\omega^2c_2 + \Psi + \eta\beta A\omega - \eta\beta c_1\omega + c_1\eta\omega - 2c_2\sigma\omega - 2\eta\beta c_1\sigma + c_2\eta^2\beta)\phi\psi}{\omega(2\sigma + \omega + \eta)(2\sigma + \omega - \eta)}$$

$$C_6 = \frac{2A(\omega + 2\sigma - \eta)(A - c_1 - c_2) + (\omega + 2\sigma)(c_1^2 + c_2^2) - 2\eta c_1 c_2}{(2\sigma + \omega + \eta)(2\sigma + \omega - \eta)}$$

$$n = \psi(r + 2\delta), \quad m = \phi(r + \delta)$$

$$\Psi = -\omega^2A + A\eta\omega - 2A\sigma\omega - 2\eta\beta A\sigma + \eta^2\beta A$$

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