

The Forecast of the Fish Consumption in China based on Experimental Analysis

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Abstract: Fish is one of the critical sources for people to obtain animal protein. About 3.1 billion people worldwide rely on fish for 20% of their daily protein intake, and even more, than 70% of some coastal communities rely on fish (Sustainable Seafood 101 - Sustainable Fisheries UW, 2021). Therefore, the fish consumption is an important indicator to judge people's health. Fish consumption is the intersection of the fish supply equation and the fish demand equation. However, the quantity and price variables in equations affect each other which are not independent. Therefore, this article adopts simultaneous equation model to deal with the correlation between the price and quantity of endogenous variables. And this article chooses four exogenous variables: the ex-factory price index of industrial producers, sea surface temperature, the price of eggs and per capita GDP to construct the supply equation and the demand equation. After using `systemfit()` function in R to estimate supply equation and demand equation based on the data from 2003 to 2017, the data from 2018 is used to verify the accuracy of the model.

1 INTRODUCTION

1.1 Why Is It Important?

The consumed fish intersects market demand and supply (Ye, 1999). According to OECD-FAO Agricultural Outlook 2015-2024, the protein intake by fish increases over time in the least developed countries, developed countries, and developing countries. The proportion of protein consumed by fish in developing countries has increased rapidly (OECD-FAO, 2015), which means that with the economic growth of some developing countries such as China, people are paying more attention to a healthy diet, which has also contributed to the increase in the consumption of global fishery products in the past few decades. The body needs 20 kinds of amino acids to maintain body health and normal functions, of which the body can produce about 11 types. The other nine amino acids, the so-called "essential" amino acids, must enter the human body through our diet. And, fish meat can provide these nine essential amino acids, in addition to its omega-3 fatty acids, minerals, and vitamins through its protein (Heffernan, 2021). "According to the Dietary Reference Intake report for

macronutrients, a sedentary adult should consume 0.8 grams of protein per kilogram of body weight, or 0.36 grams per pound. That means that the average sedentary man should eat about 56 grams of protein per day, and the average woman should eat 46 grams" (<https://www.sclhealth.org/blog/2019/07/how-much-protein-is-simple-too-much/>, 2021). Combined with the protein content of fish, 100 grams of cooked food for most types of fish and shellfish can provide approximately 15-25 grams of protein (Heffernan, 2021). The protein content of fish means that fish is rich in amino acids and high in protein. At the same time, compared with other meats, fish has less fat content, which shows that fish is a healthier source of protein. It is precise because fish has so many nutrients that it serves as an essential source of animal protein, accounting for 17% of the world's meat consumption. At the same time, about 3.1 billion people rely on fish for 20% of their daily protein intake, and more than 70% of some coastal communities rely on fish (Sustainable Seafood 101 - Sustainable Fisheries UW, 2021).

1.2 How Is It Changing?

According to FAO's HISTORICAL CONSUMPTION AND FUTURE DEMAND FOR FISH AND FISHERY PRODUCTS, the world average per capita fish consumption has shown an upward trend from 1965 to 1995. Especially in Asia, fish consumption and consumption growth rate are higher than in other continents (Ye, 1999). Many factors affect fish consumption, but they can be classified based on the relationship between supply and demand. For example, factors affecting supply include price, weather, production costs, government policies, etc. (Hu, Pan, Zhang, Tao, 2020). Factors affecting the market include income, substitutes and complementary products, and product quality (Hu, Pan, Han, Lin, Tao, 2020).

1.3 Objectives

Since fish meat is essential for human protein intake, fish consumption is a crucial indicator of people's protein intake or health. The main goal of this article is to find appropriate exogenous variables to establish a supply equation model that conforms to the laws of the market based on the relevant data from 2003 to 2017 in China to predict the future consumption of fish in China to provide essential data for people's protein intake.

2 METHODOLOGY

2.1 Data Source

The data in this article comes from Chinese national data, our world data, and statist. Among them, the ex-factory price index of industrial producers (1985=100), the current value of the market price of eggs (ordinary fresh eggs) (yuan/kg), hairtail (0.5-1) (Kg), the current value of the market price (yuan/kg) and the per capita GDP (yuan) come from Chinese national data. Fish and Seafood supply quantity (kg/capita/yr) comes from our world data. Annual anomalies in global ocean surface temperature from 1880 to 2020, based on temperature departure (in degrees Celsius), comes from Statista.

2.2 Supply and Demand Function

1) *Demand Function:* A demand function is defined by $p = f(x)$ where p measures the unit price and x measures the number of units of the commodity

in question and is generally characterized as a decreasing function of x ; that is, $p = f(x)$ decreases as x increases. Since both x and p assume only nonnegative values, the demand curve is that part of the graph of $f(x)$ that lies in the first quadrant (figure.1) (Pettinger, 2021).

2) *Supply Function:* A supply function defined by $p = f(x)$ with p and x as before is generally characterized as an increasing function of x ; that is, $p = f(x)$ increases as x increases. Since both x and p assume only nonnegative values, the supply curve is that part of the graph of $f(x)$ that lies in the first quadrant (figure.1) (Economic Models, 2021)..

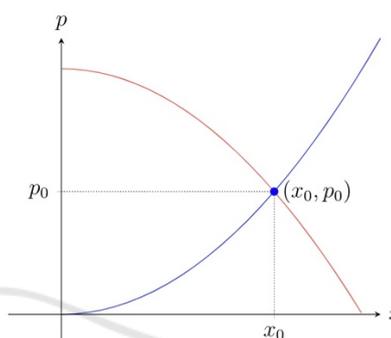


Figure 1: Example of a supply curve (in blue) and a demand curve (in red). The point of intersection corresponds to market equilibrium.

2.3 Simultaneous Equations Models

1) *Introduction to Simultaneous Equations Models:* A simultaneous equation model is a statistical model in a set of simultaneous linear equations. They differ from regular regression models because there are two or more dependent variables (Pettinger, 2021). Because the concurrent equation model can solve the endogenous relationship between variables. For example, the variable price is both an explained variable and an explanatory variable to express quantity. The same is true for the number of variables. So, I choose the simultaneous equation model to solve the supply and demand equation.

2) *Variable Selection of Price of Fish:* This article uses the price of hairtail to replace the price of fish because data on fish prices in China has not been found. The production of hairtail is relatively large, and it is distributed in China's Yellow Sea, East China Sea, Bohai Sea, and even the South China Sea.

3) *Variable Selection of Supply Function:* Supply refers to the quantity of a good that the producer plans to sell in the market. The pool will be determined by price, the number of suppliers, the state of technology, government subsidies, weather

conditions, and the availability of workers to produce the good (Hu, Pan, Zhang, Tao, 2020). Based on this reminder of factors affecting supply, first, I chose the ex-factory price index of industrial producers to estimate the cost of raw materials. The increase in the ex-factory price index of industrial producers means an increase in the cost of the enterprise, so this will lead to a decrease in the production of the enterprise, which will naturally lead to a reduction in supply. Secondly, I chose sea level temperature as the second variable that affects supply because the problem which I am exploring is to predict the consumption of fish in China. The response of fish to changes in water temperature is enormous. If the temperature exceeds or falls below the optimum temperature for the fish, it will cause the death of the fish and thus reduce the yield. Therefore, the supply function can be expressed as follows:

$$\text{Supply: } Q = \alpha_1 + \alpha_2 P + \alpha_3 PF + \alpha_4 ST + \epsilon_s$$

Table 1: The explanation of variables in supply function.

Variables	Explanation
Q	Per capita fish consumption
P	The price of hairtail
PF	The ex-factory price index of industrial producers
ST	Sea surface temperatur

4) *Variable Selection of Demand function:*

The demand for a good depends on several factors, such as the price of the sound, perceived quality, advertising, income, the confidence of consumers, and changes in taste and fashion (Yobero, 2016). Based on such a reminder of factors that affect demand, I plan to choose residents' per capita disposable income as the first variable of the demand equation, but because China only began to investigate residents' per capita disposable income in 2013. So, I chose GDP per capita as the variable that affects demand. Secondly, I chose eggs as a substitute for fish. Because eggs and fish are both important sources of protein for humans. Therefore, the price of eggs is used as the second variable that affects demand. Thus, the demand function can be expressed as follows:

$$\text{Demand: } Q = \beta_1 + \beta_2 P + \beta_3 PS + \beta_4 DI + \epsilon_d$$

Table 2: The explanation of variables in demand function.

Variables	Explanation
Q	Per capita fish consumption
P	The price of hairtail
PS	The price of eggs
DI	Per capita GDP

5) *The Reduced-Form Equation:* The reduced-form equations express the endogenous variables as a function of the exogenous variables, where P and Q are exogenous variables and PS , DI , ST , and PF are exogenous variables.

$$P = \pi_{11} + \pi_{12}PS + \pi_{13}DI + \pi_{14}PF + \pi_{15}ST + v_1$$

$$Q = \pi_{21} + \pi_{22}PS + \pi_{23}DI + \pi_{24}PF + \pi_{25}ST + v_{21}$$

2.4 Identification

Because the reduced-form equation has 8 parameters equal to the structural equation's parameters, this simultaneous equation system is just recognized.

2.5 Two-stage Least Squares Estimation

1) *The Process of Two-Stage Least Squares Estimation:* Because the endogenous variable is related to the error term in the supply and demand equation, the least square method cannot estimate the parameters here. Instead, choose to use Two-Stage Least Squares Estimation. The first step is to apply the least-squares method to the reduced-form equation of the endogenous variable Y_i as the explanatory variable to obtain its estimated value \widehat{Y}_i . The second step is to substitute the estimated value \widehat{Y}_i into the right side of the estimated structural equation to replace the endogenous variable Y_i as the explanatory variable, and then apply the least square method again to obtain the estimated value of the structural parameter.

2) *Correlation of Exogenous Variable:* The use condition of Two-Stage Least Squares Estimation is that there is no serious multicollinearity between exogenous variables. So, the correlation between exogenous variables needs to be tested.

3 ASSUMPTION

1. Assume that people all over China do not have serious prejudice against hairtail.

2. Assume that per capita GDP is even people's disposable income.

3. Assume that there is no large-scale outbreak of infectious diseases (such as the outbreak of Covid19).

4 RESULT

4.1 The Result of Correlation of Exogenous Variable

Test the correlation between exogenous variables using the `cor()` function in R, as shown in figure 2 below. As a result, it can be found that there is a certain correlation between exogenous variables, but the severity of multiple gong xian x cannot be clearly defined. Therefore, it cannot be judged whether there is serious multicollinearity between them.

```
> #Check the correlation of the exogenous variables
> Exogenous_Value <- Database_Fish[, c("pf","ps","di","st")]
> cor(Exogenous_Value,method="pearson")
      pf      ps      di      st
pf 1.0000000 0.8420014 0.6407243 -0.7948199
ps 0.8420014 1.0000000 0.8359415 -0.7579879
di 0.6407243 0.8359415 1.0000000 -0.6903567
st -0.7948199 -0.7579879 -0.6903567 1.0000000
```

Figure 2: The result of the correlation of exogenous variable by using `cor()` in r.

4.2 Estimated Supply and Demand Function

According to the result of the `systemfit()` function in r (Figure 3). The estimated parameters of structural equations of supply and demand function can be determined. The estimated supply function is

$$Q = 24.748772945 + 0.648236619P - 0.000467179PF + -6.362028375ST$$

and the estimated demand function is

$$Q = 22.304304122 + -0.310007465P + 0.365297703PS + 0.000363223DI$$

```
2SLS estimates for 'eq1' (equation 1)
Model Formula: q ~ p + pf + st
Instruments: ~pf + di + st + ps

      Estimate Std. Error t value Pr(>|t|)
(Intercept) 24.748772945 6.243212819 3.96411 0.0022184 **
p            0.648236619 0.049906916 12.98891 5.1337e-08 ***
pf          -0.000467179 0.013403531 -0.03485 0.9728199
st          -6.362028375 3.390095367 -1.87665 0.0873288 .
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.841635 on 11 degrees of freedom
Number of observations: 15 Degrees of Freedom: 11
SSR: 7.791837 MSE: 0.708349 Root MSE: 0.841635
Multiple R-Squared: 0.972265 Adjusted R-Squared: 0.964701
```

```
2SLS estimates for 'eq2' (equation 2)
Model Formula: q ~ p + ps + di
Instruments: ~pf + di + st + ps

      Estimate Std. Error t value Pr(>|t|)
(Intercept) 22.304304122 1.705409125 13.07857 4.7799e-08 ***
p          -0.310007465 0.350595556 -0.88423 0.395487
ps          0.365297703 0.177197802 2.06153 0.063698 .
di          0.000363223 0.000130625 2.78065 0.017883 *
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.576496 on 11 degrees of freedom
Number of observations: 15 Degrees of Freedom: 11
SSR: 3.655823 MSE: 0.332348 Root MSE: 0.576496
Multiple R-Squared: 0.986987 Adjusted R-Squared: 0.983438
```

Figure 3: The estimated parameters of structural equations of supply and demand function.

4.3 Verification

Bring the values of the four variables of PT, PS, DI, and ST in 2018 into the estimated supply equation and demand equation, and get the estimated supply equation:

$$Q = 20.2406741474 + 0.648236619P$$

and the estimated demand equation

$$Q = 49.79757141783484099 - 0.310007465P$$

The graph of the two equations can be shown in figure 4.

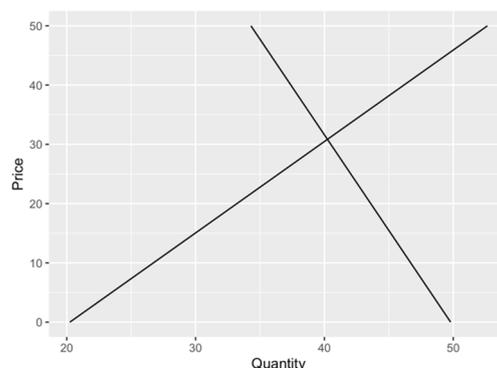


Figure 4: The estimated supply equation and demand equation for 2018.

Combining these two equations can then get the predicted value of the price \hat{P} ,

$$\begin{aligned} 49.79757141783484099 - 0.310007465P \\ = 20.2406741474 \\ + 0.648236619P \\ \hat{P} = 30.8449 \end{aligned}$$

Then substitute the predicted value into the estimated supply equation to get the predicted value of the fish consumption \hat{Q} ,

$$\begin{aligned} \hat{Q} = 20.2406741474 + 0.648236619 * 30.8449 \\ = 40.2354678367931 \end{aligned}$$

Compared with the actual value of the price $P = 27.3467$,

$$ERR = \frac{|P - \hat{P}|}{P} \approx 0.1134136707$$

Therefore, the relative error of the model is about 11.3%.

5 CONCLUSION

In general, the simultaneous equation model used in this article can get a rougher supply equation and demand equation. I think three reasons affect the accuracy of the model: The first reason is that the Pearson correlation coefficient obtained in the previous correlation test of exogenous variables is significant, which shows that the correlation between exogenous variables is very high. It may affect the accuracy of the model. The second reason is that I used per capita GDP instead of the more real per capita disposable income. This approach has significantly improved the judgment of the people's economic level, which will shift the demand equation. The third is that I used the price of hairtail to replace the price of fish, but hairtail is not a very accurate replacement for the cost of fish. Because hairtail is not so popular in every part of China, people in the mainland may reduce their consumption of hairtail because of its fishy smell.

In addition, the more severe problem is that the method in this article can only get the estimated supply equation and demand equation. But if you want to use this estimated equation to predict fish consumption in China, you need to predict the values of four exogenous variables (ST, DI, SF, and PS). This is more difficult than getting the estimated supply and demand equation.

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