Choice System Benefits to Food Bank Allocation*

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This paper investigates the operational efficiency and pricing strategies of food banks in Canada and the USA, focusing on the "Choice system" implemented by Feeding America. The study reveals that Canadian food banks are more efficient in distributing food per share compared to their US counterparts. It also highlights a stratified pricing system where essential items like cereals and diapers have higher relative prices due to their demand or supply. These findings suggest an adaptive market mechanism within the "Choice system" that caters to the nuanced needs of food bank clients.

1 Introduction

Feeding America is an organization that distributes food at over 200 food banks across the United States (Prendergast 2022). In the early 2000s, the organization used a queuing mechanism to distribute approximately 200 million pounds of food donated by distributors, retailers, and manufacturers, and in 2004, a group including original author Canice Prendergast replaced it with a market-based mechanism called a "choice system". ". This system introduced a special currency - shares - that food banks use to bid on truckloads of food.

In the original distribution algorithm, each food bank distributed food (in pounds) equally according to the number of clients it needed, which was problematic in a number of ways. First, different food banks have different needs; second, food is distributed randomly based on geographic location, leading to high transportation costs; and finally, the distribution system is inefficient and discourages donations. The Choice system solves these problems by allocating shares equally to each client and then using these shares to bid in a first price sealed bid auction that takes place twice a day. Shares can be saved and borrowed, and any shares spent

 $^{^*}$ Code and data are available at: https://github.com/FrankMengZJ/food_allocation Replication is available at https://doi.org/10.48152/ssrp-e3cd-1v45

during the day go back to the food bank that night. This mechanism allows the food bank to match its purchases to its long-term and short-term needs and to the geographic location of the donor.

While the Choice system allowed for more flexible food distribution, many practitioners were initially skeptical of the market-based system, primarily fearing that smaller or less savvy food banks would suffer. A number of safeguards were implemented to ensure fairness for all food banks, including access to credit and the ability to bid jointly with other food banks.

By reproducing the data from the original author, Canice Prendergast, we wanted to focus on the characteristics of the shares of certain products and analyze them to try to explain the appearance of outliers for certain products and the possible reasons through these data.

At the same time, we introduced the variables of region, we split these data into two regions, one in Canada and one in the United States to explore possible regional differences. To analyze the data, I worked on R (R Core Team 2022), using the tidyverse (Wickham et al. 2019), forcats (Wickham 2023), and gitcreds (Csárdi 2022) packages. Tables in the report were created with kableExtra (Zhu 2021) and figures were created with ggplot2 which was built in tidyverse (Wickham et al. 2019).

2 Data

Data Set Description

This dataset is derived from Feeding America and covers auction data from 2000 to 2004 (prior to the implementation of the Choice System) as well as from July 1, 2005 onward (Prendergast 2022). The data for this timeframe details the total amount of food received by each food bank, the individual food loads won at auction, whether credit was used to purchase, and the location of the food. The analysis of 75,183 auctions culminated in a study typically using data from 54,058 auctions, which were carefully screened to exclude auctions and food banks that did not fit due to merging and coding issues.

Main variables

The first variables we focused on were food types and prices. This dataset collects the types of food obtained through auctions and their prices, revealing significant differences between food types, such that a share can purchase an average of 4 pounds of food, but in one-quarter of auctions, a share can obtain more than 100 pounds of food.

We then focus on the food bank's targeting factor. This variable captures the number of poor clients in the area where the food bank is located. Analysis shows that small food banks purchase 72% more food under the Choice System than large food banks (Prendergast 2022).

The next variable we focused on was nutritional value. In the original article, the nutritional value of food parcels purchased by small and large food banks was analyzed using the Weight

Watchers point system, which showed that the nutritional value of food acquired by small food banks was only 1.8% lower than that of large food banks, despite acquiring 72% more food.

The final variable we focused on was geographic location and transportation costs. The dataset calculates the average distance from the warehouse to the food bank that won the auction through ArcGIS software, as well as the transportation cost savings through the Choice System. Food banks traveled an average of 1,030 kilometers one way to collect food, saving approximately \$15.7 million in annual transportation costs compared to the 1,720 kilometers estimated by the old algorithm.

Several variables in the data set also serve as labels to help us categorize this data; these include temporal information (e.g., year and month), unique identifiers of the auctions, and the codes of the countries that participated in the auctions (focusing on the United States and Canada).

type	monthyear	total Shares	total Pounds	choicemember
Produce	Dec2005	0	42500	Albuquerque
Produce	Dec2005	0	42000	Albuquerque
Produce	Aug2005	0	42000	Albuquerque
Produce	Aug2005	0	46080	Albuquerque
Produce	Sep2005	0	39000	Albuquerque

Table 1: The first five rows from the selected data

3 Results

These graphs are meant to help us understand how much food banks are usually willing to pay when they auction off food. Imagine that food banks are like shopping at the grocery store, but they are bidding on the food. Sometimes they may pay a lot of money, while other times they may pay very little, or even a negative amount (which means they are actually being paid to take the food). However, this is not very common.

This bar chart Figure 1 discusses how shares regulate choices through market mechanisms in a food bank auction system. Figure 1 shows the distribution of prices per pound of food generated through winning bids. Typically, the results would be described in terms of pounds of food that can be purchased per share, but since some of the transaction prices were negative, a range of shares per pound of food was tallied here. The average price was 0.28 shares, but in 25% of the auctions, purchasers paid less than 0.01 shares per pound. At the higher end of the price spectrum, 3% of shipments resulted in a cost of 1.5 shares per pound or more. Negative shares occurred in 7.8 percent of auctions.

This price variation is largely caused by food type, and in Figure 2, the price of the most popular food, cereal, is normalized to 1. Prices show dramatic variation. Compared to a

pound of cereal, a food bank could get 2 pounds of meat, 5 pounds of dairy, 40 pounds of beverages, or 80 pounds of produce.

From the Figure 2, we can see a clear stratification of food values. certain items like cereals, diapers, and pasta have higher relative prices, indicating they are more valued or scarce. Certain items like cereals, diapers, and pasta have higher relative prices, indicating they are more valued or scarce resources within the network of food banks. The higher price can be indicative of higher demand or lower supply for these items compared to others. It could also reflect the higher nutritional value or utility these items provide to the clients of the food banks.

Conversely, items such as produce, drinks, and baby food appear to have much lower relative prices. This could be indicative of higher abundance or lower demand for these items, either because they are perishable or because of differences in demand among some of the clients of the food banks. Differences in demand.

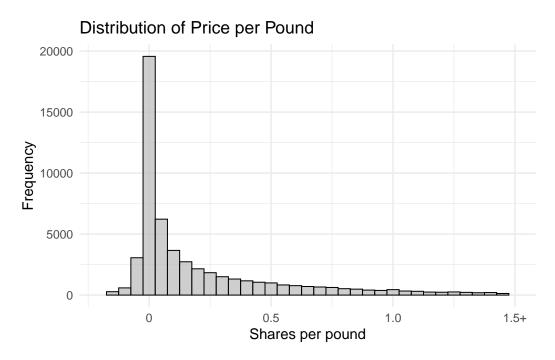


Figure 1: Replication of Figure 2

Additionally, customers of food banks are mainly in the following categories: for example, families in need with sudden changes and minors to support, who may not be able to provide for themselves for a while due to sudden illness, unemployment, or other unfortunate events.

Or the underprivileged, and disabled people covered by the government's security system: these people may be in long-term hardship due to their physical condition, age, or other reasons. Specifically, for those who are temporarily unable to be self-sufficient, items that can

Estimated Price Per Pound by Food Type

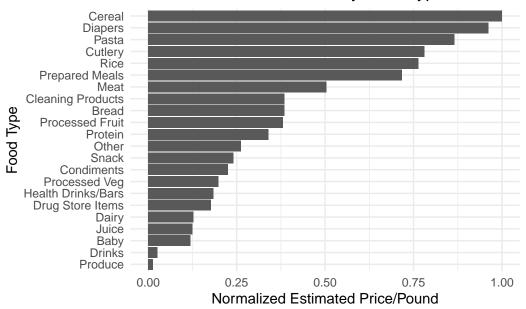


Figure 2: Replication of Figure 3

quickly satisfy life's needs are going to be popular, such as cereals, or some high-calorie fast food. For those families who have minors to support, or for the elderly who are unable to care for themselves, immediate necessities are important such as diapers. These populations have more fixed needs, and for them, the difference in the value of these low-share aids compared to the value of high-share aids is large, which can lead to excessive pressure on food banks to warehouse these low-shares, which further affects low-share prices.

The operational efficiency, in terms of average pounds per share, is significantly higher for Canada than for the USA. Figure 3 suggests that, on average pounds per share, Canadian food banks are distributing over twice the pounds of food compared to their US counterparts.

The reasons behind the difference in operational efficiency could be multifaceted. Factors such as logistical support, resource allocation, the number and size of food banks, the volunteer workforce, and the socio-economic contexts within which these food banks operate could all influence the operational efficiency.

Figure 4 compares the frequency of food prices per pound allocated to food banks in Canada and the USA. It shows that most food items are distributed at a low cost, with a high frequency at the lowest price point, presumably representing free or very cheap items. The frequency diminishes as the price per pound increases, indicating that higher-priced items are less common in food banks. Both countries exhibit a similar pattern, with the majority of food aid being in the lower price ranges.

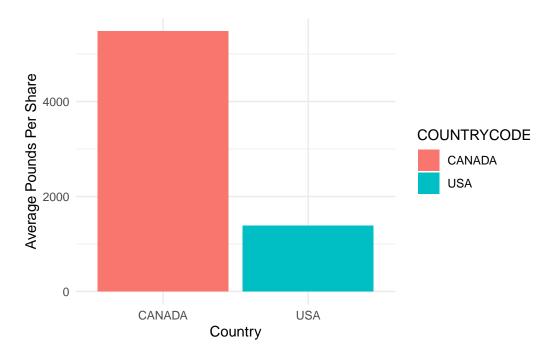


Figure 3: Operational Efficiency: USA vs Canada

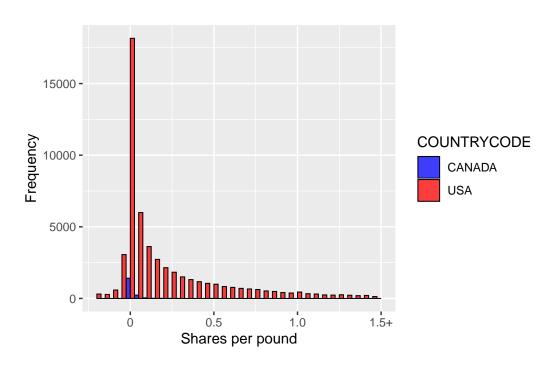


Figure 4: Distribution of Price per Pound: US vs. CAN

4 Discussion

This study has revealed significant insights into the operational efficiency and pricing strategies of food banks across Canada and the USA. Our findings show that the "Choice system" implemented by Feeding America has led to an equitable distribution of food based on the needs and strategic bidding by food banks. However, disparities in operational efficiency suggest that Canadian food banks are more effective in terms of pounds of food distributed per share. The variation in prices per pound of food, especially for essential items like cereals and diapers, underscores the dynamic nature of demand and supply affecting food banks. # Limitations

The study's conclusions are drawn from a dataset that, while extensive, has certain limitations in scope and representation. The data primarily reflects transactions within the "Choice system" employed by Feeding America, potentially omitting smaller or independent food banks. Additionally, the dataset does not fully account for the regional and seasonal variations that may significantly impact the pricing and distribution of food. The absence of a direct analysis of socio-economic factors means that the influence of local policies, donor behaviors, and community support on the operations of food banks is not explicitly measured. These limitations suggest that the findings, while indicative, may not encompass the full spectrum of the food bank ecosystem.

5 Trends

The analysis within this paper has uncovered trends in the operational efficiency and pricing strategies across food banks in North America. It was observed that Canadian food banks tend to distribute food more efficiently when measured in pounds per share, indicating a higher operational efficiency than their American counterparts. Moreover, the study revealed a stratified pricing system where essential items such as cereals and diapers command higher prices, pointing towards their higher demand or lower supply. Such trends highlight the variable nature of food bank operations and suggest an adaptive market mechanism at play within the "Choice system" that reflects the nuanced needs of food bank clients.

6 Future

Future research should focus on the long-term impact of the "Choice system" on food bank operations, including how changes in economic conditions influence bidding strategies. Additionally, a comparative study involving more regions within each country could offer a broader perspective on regional operational efficiencies. Investigating the sustainability of food banks as they face increasing demands and potential disruptions in the supply chain could also provide valuable insights for policy and operational improvements. Finally, integrating client

feedback could refine the understanding of value attributed to different food items and help optimize food distribution further.

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