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Agent-Based Modeling of Deshopping Behavior: A Single Shop Model with Multiple Deshoppers

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Abstract—Deshopping is rapidly turning into a modern day scourge for the retailers worldwide due to its prevalence and regularity. The presence of flexible return policies have made retail return management a real challenging issue for both the present and the future. In this study, we propose and develop a multi-agent simulation model for deshopper behavior in a single shop context. The background, theoretical underpinning, logical and computational model, experiment design and simulation results are reported and discussed in the paper.

Keywords - deshopping; simulation; multi-agent system; logistics; retail marketing; software agent

I. INTRODUCTION

Liberal return policies are both a prerequisite and a legal requirements in today's retail business environments. Marketing literature suggests close link between liberal return policies and long term competitive and financial benefits [1]. Certain intersections of customers are thriving in this environment of liberal return policies. These customers are delaying the actual purchase decision until after having experienced or used the product. Returning the products allows them to reverse the purchase decision [2]. The retailer 'Montgomery Ward' first instituted liberal return policies in their chain stores in 1880. These policies were put in place to provide retailers with an opportunity to cultivate long term competitive advantage [3].

Deshopping is considered in retail marketing literature to be abuse of return policy. It has also been introduced under a broad umbrella of terms such as retail borrowing [4], Jay customers [1], fraudulent borrowing [5], unethical retail disposition [3], wardrobing, free customer rentals, fraudulent return, and boomerang shopping among others in retail marketing literature [6]. Schmidt et al. [7] labelled deshopping as the "deliberate and arguably inappropriate return of goods for reasons other than actual faults in the product". This unethical behaviour is forcing retailers with illicit product returns and unwanted inventories in both forward/reverse supply chains [8, 9, 10, 11]. Retailers

consider fraudulent returns to erase 10%-20% from profit margin [12].

Retailers and researchers reported that the total value of retail shrinkage in 2003 was 27,258 million pounds [13]. Research indicates about 20% returns in retail landscape are deshopped products [3]. This includes a sizeable amount of deshopped merchandise. Ironically, despite its quasi-criminal nature, deshopping is only considered 4th (out of 15) worst ethically questionable consumer behaviour by consumers [5]. Ironically, deshopping is considered less intrusive and destructive than other forms of unethical shopping norms. However, it can create huge pressure on both the retail environment and reverse logistics structure of firms with products returns [9].

Deshopping remains under researched in retail marketing, strategy, simulation and modeling based research/analysis. The current deshopping related research is based on a number of theories in multi-disciplinary perspectives such as marketing [3], retail marketing management [2, 4, 9, 13, 14] behaviour and intention theories [15, 16, 17] and ethics [18].

II. THE DESHOPPING PROCESS

Schmidt et al. [7] considered the financial and risk reduction aspects that triggered deshopping and proposed a framework which combines the demographic characteristics and psychographic factors of deshoppers. It also illustrates the relationships and associations between the factors.

Consumer research has been centred on the consumer's acquisition and consumption stages and not much at all on the disposition stage. Most of the disposition research has covered the sunnier side of disposition options such as gift giving, recycling, and online and offline auctions. All these options fail to consider the darker side of consumer disposition [6] which is essentially deshopping.

According to Rosenbaum, Kuntze and Woodridge [19], deshopping shows the following characteristics: 1. The product must be purchased and subsequently returned at a later date for a full refund. 2. The purchaser must have

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received some value from the product prior to return and refund. 3. The product does not possess any actual defects. 4. The purchaser must decide on the return before, during or after purchase. 5. The purchaser must be aware that he/she is taking advantage of the retailers return policy.

Marketing literature has provided considerable attention to consumer decision making models in both research and practice. The five stage consumer decision making process model forwarded by [20] provided the ideal background for consumer behaviour. This process model illustrates that all consumer behaviours are planned behaviours; they are reasoned actions [21]. This line of research follows smoothly into planned behaviour which is the driving force behind consumer decision process.

The behavioural intention theory used to analyse deshopping behaviour of consumers was refined by King, Dennis and Wright [2]. Mitchell et al. [22] measured unethical consumer behaviour across four countries using index of unethical consumer behaviour tailored for deshopping activities. Since then Muncy and Vitell [23] index of unethical consumer behaviour scale has since been updated to reflect newer retailing scenarios.

The retail marketing environment can be viewed as a complex adaptive system with its network of interacting agents such as the regulations, competing firms, shoppers, etc. [24]. The deshopping environment can be built as a complex adaptive system populated by the deshoppers, firms, competition, regulations etc. These agents can be adaptive and attempt to maximize its assigned value over time. These models also provide a large degree of control [25].

The simulation method can be very useful for deshopping analysis. Simulation with "what-if" analysis and dynamic graphical displays can provide an enriched experience. Simulation with graphical animation has the advantages of being able to provide system behaviour depiction, information communication, visual interaction, simulation realism and decision support [26]. Simulation based analysis can also depict deshopping scenarios for debate and analysis[1].

III. THE COMPUTATIONAL MODEL FOR DESHOPPING

The focus of our research is to propose and develop an agent-based model for deshopping behavior of consumers in a simulation modeling environment. The model includes elements of the retail environments such as deshoppers, businesses, shoppers, etc.

Rapid development of theory and applications based upon multi-agent systems have revolutionized the research approach towards complex economic and business systems [27]. Most of these systems are complex dynamic systems.

The modeling approach for our complex systems is agent-based approach.

Simulation allows business processes to be modelled, better understood and has the potential to make improvements without incurring the traditional risks [15].

The theoretical underpinnings of the deshopping model is based on prior research carried out by Rahman and Li [1] and theory of crime [27].

In our computational modeling, we consider deshopping as a social dilemma scenario – a 'tragedy of the commons'. This makes it possible to describe and represent deshopping as a crime and model its payoffs as such.

In the presence of easy return policies, let us consider Reward from Deshopping to be - g

If a deshopping/ return attempt is rejected then the Cost of deshopping becomes f - cost of deshopping attempt and p – chance of being caught.

Thus, Cost of Deshopping comes to – p * f

In order for deshopping to be less appealing

$$g - p * f < 0 \quad (1)$$

Where g can be further broken down into: Utility of usage (u); Peer approval through concept transmission (t); Funds reuse (m).

These are consistent with the literature on deshopping and what motivates deshoppers [12].

Costs can be defined as the following: Cost of item c; Opportunity cost v; Enforcement cost gc.

Thus the deshopping equation becomes

$$g (u + t + m) - pF (c + v + gc) < 0 \quad (2)$$

This controls the motivation, loyalty and persistence of a deshopper to continue with continued deshopping attempts.

IV. THE SIMULATION MODEL

The retail marketing environment can be viewed as a complex adaptive system with its network of interacting agents such as the regulations, competing firms, shoppers, etc. [28].

The deshopping environment can be built as a complex adaptive system populated by the deshoppers, firms, competition, regulations etc. These agents can be adaptive and attempt to maximize its assigned value over time. These models also provide a large degree of control [4, 29].

Our iteration interface as illustrated in Fig 1 has the following improvements: making consumer deshopping behaviour as the central tenant of the model, and using pseudo random seeds for reproducibility.

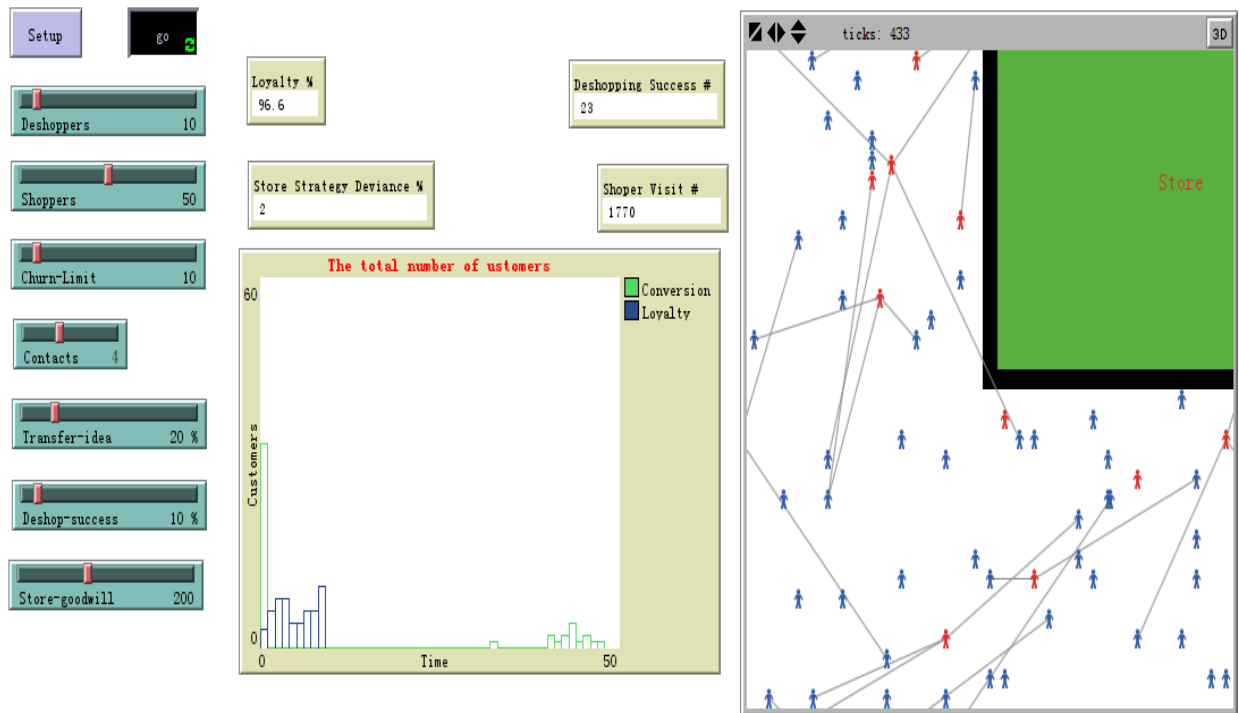


Fig 1: The interface of deshopping modeling

The logic flow of the model consists of the following steps.

Step 1 sets up the parameters of the model and initializes Global Variables. Step 2 initialises Turtle Variables. Next on Step 3, the deshopper turtles link with a set of turtles to form its own group. These are the turtles to whom it can pass deshopping concepts. In Step 4, Turtles start on the Real World designated by the White Patch. They move around randomly. In Step 5 the turtles visit the Store designated by the green patch.

Once on the green patch, Deshoppers try to return products and shoppers try to buy products. Then they return to the shop world and renews the process. In Step 6, if the deshoppers fail to return then its loyalty is reduced. If it falls below Threshold, then it dies. And this means that the store has lost a shopper forever.

V. THE EXPERIMENTAL DESIGN AND RESULTS

The experiment will contain ten computational scenarios that will simulate the spread of deshopping and its impact on a business's consumer base.

We will compare scenarios where Deshopper numbers vary. Table I holds the data from the simulation runs.

By analyzing the data from the experiments, we can see from Fig.2 that the deshopping success grows as Deshopping Success % grows and losses are greater and store strategy suffers. This obviously hurts both the bottom line and goal alignment.

TABLE I. DATA FOR SCENARIO COMPARISON

Exp #	Simulation Parameters							Results					
	Deshopper #	Shopper #	Churn Limit	No of Contacts	Transfer Idea %	Deshop success %	Store Goodwill	Loyalty	Store Strategy Deviance	Deshopping Success	Shopper Visits	Deshopping attempt/ Shopper visits Ratio	Deshopper /Shopper Ratio
1	10	50	10	4	20%	10%	200	86.80%	2.50%	37	1830	2.02%	0.2
2	10	50	10	4	20%	40%	200	88.90%	11.50%	89	1830	4.86%	0.2
3	10	50	10	4	40%	40%	200	96.60%	11.50%	122	1830	6.67%	0.2
4	10	100	10	4	40%	40%	200	91.10%	18.50%	232	6105	3.80%	0.1
5	50	100	10	4	40%	40%	200	84.60%	30%	1428	11026	12.95%	0.5

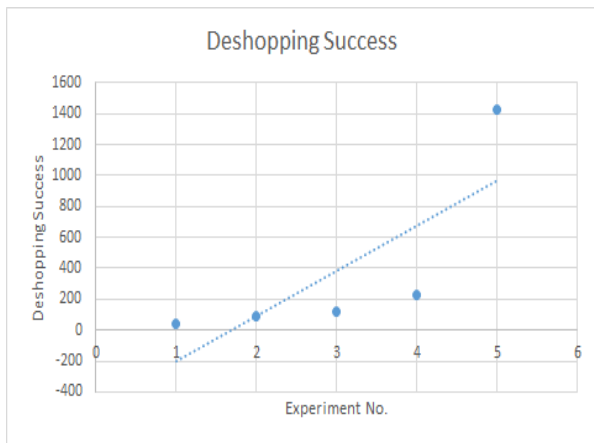


Fig 2: Deshopping success in simulation runs

VI. CONCLUSIONS

The multi-agent simulation model created in the paper demonstrates the impact of deshopping and the dilemma of retail businesses with return policies. From the experiment we have observed that deshopping requires further awareness from businesses and regulatory bodies due to its consequences. This will be of interest to both practitioners and academics of deshopping research, retail crime research, marketing management, supply chain and strategic management. Our model integrates the benefits of various methods, techniques and technologies for representing, simulating and analyzing deshopper behavior. Such a model will help managers understand deshoppers and consumers through relevant framework, processes and tools, and will be of great operational and strategic importance to companies for scenario-based analysis. In addition, the model draws attention to the general state of deshopping in retail marketing arena, and provides a solid foundation for further research and development.

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