

# Formalizing double sided auctions in Coq

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## Abstract

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In this paper we introduce a formal framework for analyzing double sided auction mechanisms in a theorem prover. In double sided auctions multiple buyers and sellers participate for trade. Any mechanism for double sided auctions to match buyers and sellers should satisfy certain properties of matching. For example, fairness, perceived-fairness, individual rationality are some of the important properties. These are critical properties and to verify them we need a formal setting. We formally define all these notions in a theorem prover. This provides us a formal setting in which we prove some useful results on matching in a double sided auction. Finally, we use this framework to analyse properties of two important class of double sided auction mechanism. All the properties that we discuss in this paper are completely formalized in the Coq proof assistant.

**2012 ACM Subject Classification** Information systems → Online auctions; Software and its engineering → Formal software verification; Theory of computation → Algorithmic mechanism design; Theory of computation → Computational pricing and auctions; Theory of computation → Program verification; Theory of computation → Automated reasoning

**Keywords and phrases** Coq, formalization, auction, matching, financial markets

**Digital Object Identifier** 10.4230/LIPIcs..2019.

## 1 Introduction

Trading is a principal component of all modern economy. Over the century more and more complex instruments (for example, index, future, options etc.) are being introduced to trade in the financial markets. With the arrival of computer assisted trading, the volume and liquidity in the markets has improved significantly. Today all big stock exchanges use computer algorithms (matching algorithms) to match buy requests (demands) with sell requests (supplies) of traders. Computer algorithms are also used by many traders to place orders in the markets. This is known as algorithmic trading. As a result of all this the markets has become complex and large. Hence, the analysis of markets is no more feasible without the help of computers.

A potential trader (buyer or seller) places orders in the markets through a broker. These orders are matched by the stock exchange to execute trades. Most stock exchanges divide the trading activity into three main sessions known as pre-markets, continuous markets and post markets. While in the pre-markets session an opening price of a product is discovered through double sided auction. In the continuous markets session the incoming buyers and sellers are continuously matched against each other on a priority basis. In the post-markets session clearing of the remaining orders is done and a closing price is discovered.

A double sided auction mechanism allows multiple buyers and sellers to trade simultaneously [1]. In double sided auctions, auctioneer (e.g. stock exchange) collects buy and sell requests over a period. Each potential trader places the orders with a *limit price*: below which a seller will not sell and above which a buyer will not buy. The exchange at the end of this period matches these orders based on their limit prices. This entire process is completed



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Leibniz International Proceedings in Informatics

**LIPICs** Schloss Dagstuhl – Leibniz-Zentrum für Informatik, Dagstuhl Publishing, Germany

46 using a matching algorithm for double sided auctions.

47 Designing algorithms for double sided auctions is a well studied topic [2, 4, 3, 5]. A major  
 48 emphasis of many of these algorithms is to maximize the number of matches or maximize  
 49 the profit of the auctioneer. Note that an increase in the number of matches increases the  
 50 liquidity in the markets. A matching algorithm can produce a matching with a uniform price  
 51 or a matching with dynamic prices. While an algorithm which clears each matched bid-ask  
 52 pair at a single price is referred as uniform price algorithm. An algorithm which may clear  
 53 each matched bid-ask pair at different prices is referred as dynamic price algorithm. There  
 54 are other important properties besides the number of matches which are considered while  
 55 evaluating the effectiveness of a matching algorithm. For example, fairness, uniform pricing,  
 56 individual rationality are some of the relevant features used to compare these matching  
 57 algorithms. However, it is known that no single algorithm can possess all of these properties  
 58 [4, 2].

59 In this paper, we describe a formal framework to analyze double sided auctions using a  
 60 theorem prover. For this work, we assume that each trader wishes to trade a single unit of  
 61 the product and all the products are indistinguishable as well as indivisible. We have used  
 62 the Coq proof assistant to formally define the theory of double sided auctions. Furthermore,  
 63 we use this theory to validate various properties of matching algorithms. We formally prove  
 64 some important properties of two algorithms; a uniform price algorithm and a dynamic price  
 65 algorithm.

## 66 **2 Modeling double sided auctions**

67 In this section we formally define various concepts involved in a double sided auction  
 68 mechanism. The list data structure turns out to be very useful for describing various processes  
 69 and their properties in a double sided auction mechanism. In this section, we also describe  
 70 some essential properties on lists which are used for stating important results on matching in  
 71 double sided auctions.

### 72 **2.1 Bid, Ask and limit price**

73 An auction is a competitive event, where goods and services are sold to the highest bidders.  
 74 In a double sided auction multiple buyers and sellers place their orders to buy or sell an item  
 75 to an agent. The agent, known as auctioneer, matches these buy-sell requests based on their  
 76 *limit prices*. While the limit price for a buy order (i.e. *bid*), is the price above which the  
 77 buyer doesn't want to buy one quantity of the item. The limit price of a sell order (i.e. *ask*),  
 78 is the price below which the seller doesn't want to sell one quantity of the item. The notions  
 79 of bid as well as ask can be expressed using records with two fields.

```
80 Record Bid: Type := Mk_bid { bp:> nat;    idb: nat }.
81 Record Ask: Type := Mk_ask { sp:> nat;    ida: nat }.
```

82 For a bid  $b$ ,  $(bp\ b)$  is the limit price and  $(idb\ b)$  is its unique identity. Similarly for an ask  $a$ ,  
 83  $(sp\ a)$  is the limit price and  $(ida\ a)$  is the unique identity of  $a$ . The use of coercion symbol  
 84  $:>$  in the first field of *Bid* declares  $bp$  as a function which is applied automatically to any  
 85 term of type *Bid* that appears in a context where a term of type `nat` is expected. Hence, we  
 86 can use the simple expression  $b$  instead of  $(bp\ b)$  to express the limit price of  $b$ . Similarly we  
 87 can use  $a$  for the limit price of an ask  $a$ .

► **Note.** In this work we assume that each bid is a buy request for one unit of item. Similarly each ask is a sell request for one unit of item. If a trader wishes to buy or sell multiple units, he can create multiple bids or asks with different *ids*.

Since both the fields of *Bid* as well as *Ask* are from domain *nat* in which the equality is decidable (i.e. `nat: eqType`), the equality on *Bid* as well as *Ask* can also be proved decidable. This is achieved by declaring two canonical instances `bid_eqType` and `ask_eqType` that connect *Bid* and *Ask* to the `eqType`.

## 2.2 Matching in Double Sided Auctions

In a double sided auction (DSA), the auctioneer collects all the buy and sell requests for a fixed duration. All the buy requests (i.e. bids) can be assumed to be present in a list *B*. Similarly, all the sell requests (i.e. asks) can be assumed to be present in the list *A*. At the time of auction, the auctioneer matches bids in *B* against asks in *A*. Furthermore, the auctioneer assigns a trade price to each matched bid-ask pair. This process results in a matching *M*, which consists of all the matched bid-ask pairs together with their trade prices. We represent matching as a list whose entries are of type `fill_type`.

```
Record fill_type: Type:= Mk_fill {bid_of: Bid; ask_of: Ask; tp: nat}
```

In any matching *M*, a bid or an ask appears at most once in *M*. We say a bid-ask pair  $(b, a)$  is *matchable* if  $b \geq a$  (i.e.  $bp\ b \geq sp\ a$ ). Note that there may be bids in *B* which are not matched to any ask in a matching *M*. Similarly there may be asks in *A* which are not matched to any bid in *M*. The collection of bids present in *M* is denoted as  $B_M$  and collection of asks present in *M* is denoted as  $A_M$ .

For example consider Fig. where the list of asks *A* is represented using left brackets and list of bids *B* is represented using right brackets. A matching in this case is all the pair of matched brackets represented using same colors.

More precisely, for a given list of bids *B* and list of asks *A*, *M* is a matching iff, (1) All the bid-ask pairs in *M* are matchable, (2)  $B_M$  is duplicate-free, (3)  $A_M$  is duplicate-free, (4)  $B_M \subseteq B$ , and (5)  $A_M \subseteq A$ .

► **Definition 1.**  $All\_matchable\ M := \forall\ m, In\ m\ M \rightarrow (ask\_of\ m) \leq (bid\_of\ m).$

► **Definition 2.**  $matching\_in\ B\ A\ M := All\_matchable\ M \wedge NoDup\ B_M \wedge NoDup\ A_M \wedge B_M \subseteq B \wedge A_M \subseteq A.$

Note that the use of term  $(NoDup\ B_M)$  in the above definition expresses the fact that each bid or ask is a request to trade one unit of item and the items are indivisible. We use the term  $B_M \subseteq B$  to represent **Subset** relation between the lists  $B_M$  and *B*. It expresses the fact that each entry in the list  $B_M$  is also present in the list *B*.

## Lists, sublist and permutation

While predicate `NoDup` and binary relation `Subset` are sufficient to define the notion of matching in a double sided auction. We need few more definitions to describe various properties of matching as well as processes that operate on matching. For example, consider the Fig which describes three binary relations on list namely sublist, included and perm.

Insert Figure

## XX:4

128 **sublist** The idea of **sublist** relation is similar to the subsequence relation. In Fig.a the  
129 list L1 is a **sublist** of L2 because every entry in L1 is present in L2 as well as they appear  
130 in the same sequence. In other words no two lines in Fig.a. can intersect with each other.  
131 More precisely, consider the following lemmas describing the sublist relation.

132 **included**

133 **perm**

► **Lemma 3** (Lorem ipsum). *Vestibulum sodales dolor et dui cursus iaculis. Nullam ullamcorper purus vel turpis lobortis eu tempus lorem semper. Proin facilisis gravida rutrum. Etiam sed sollicitudin lorem. Proin pellentesque risus at elit hendrerit pharetra. Integer at turpis varius libero rhoncus fermentum vitae vitae metus.*

**Proof.** Cras purus lorem, pulvinar et fermentum sagittis, suscipit quis magna.

▷ **Claim 4.** content...

Proof. content...

► **Corollary 5** (Curabitur pulvinar.). *Nam liber tempor cum soluta nobis eleifend option congue nihil imperdiet doming id quod mazim placerat facer possim assum. Lorem ipsum dolor sit amet, consectetur adipiscing elit, sed diam nonummy nibh euismod tincidunt ut laoreet dolore magna aliquam erat volutpat.*

► **Proposition 6.** *This is a proposition*

Proposition 6 and Proposition 6 . . .

### 2.3 Curabitur dictum felis id sapien

Curabitur dictum felis id sapien mollis ut venenatis tortor feugiat. Curabitur sed velit diam. Integer aliquam, nunc ac egestas lacinia, nibh est vehicula nibh, ac auctor velit tellus non arcu. Vestibulum lacinia ipsum vitae nisi ultrices eget gravida turpis laoreet. Duis rutrum dapibus ornare. Nulla vehicula vulputate iaculis. Proin a consequat neque. Donec ut rutrum urna. Morbi scelerisque turpis sed elit sagittis eu scelerisque quam condimentum. Pellentesque habitant morbi tristique senectus et netus et malesuada fames ac turpis egestas. Aenean nec faucibus leo. Cras ut nisl odio, non tincidunt lorem. Integer purus ligula, venenatis et convallis lacinia, scelerisque at erat. Fusce risus libero, convallis at fermentum in, dignissim sed sem. Ut dapibus orci vitae nisl viverra nec adipiscing tortor condimentum. Donec non suscipit lorem. Nam sit amet enim vitae nisl accumsan pretium.

### 2.4 Proin ac fermentum augue

Proin ac fermentum augue. Nullam bibendum enim sollicitudin tellus egestas lacinia euismod orci mollis. Nulla facilisi. Vivamus volutpat venenatis sapien, vitae feugiat arcu fringilla ac. Mauris sapien tortor, sagittis eget auctor at, vulputate pharetra magna. Sed congue, dui nec vulputate convallis, sem nunc adipiscing dui, vel venenatis mauris sem in dui. Praesent a pretium quam. Mauris non mauris sit amet eros rutrum aliquam id ut sapien. Nulla aliquet fringilla sagittis. Pellentesque eu metus posuere nunc tincidunt dignissim in tempor dolor. Nulla cursus aliquet enim. Cras sapien risus, accumsan eu cursus ut, commodo vel velit. Praesent aliquet consectetur ligula, vitae iaculis ligula interdum vel. Integer faucibus faucibus felis.

■ Ut vitae diam augue.

■ Integer lacus ante, pellentesque sed sollicitudin et, pulvinar adipiscing sem.

■ Maecenas facilisis, leo quis tincidunt egestas, magna ipsum condimentum orci, vitae facilisis nibh turpis et elit.

► **Remark 7.** content...

### 174 **3 Pellentesque quis tortor**

175 Nec urna malesuada sollicitudin. Nulla facilisi. Vivamus aliquam tempus ligula eget ornare.  
 176 Praesent eget magna ut turpis mattis cursus. Aliquam vel condimentum orci. Nunc congue,  
 177 libero in gravida convallis, orci nibh sodales quam, id egestas felis mi nec nisi. Suspendisse  
 178 tincidunt, est ac vestibulum posuere, justo odio bibendum urna, rutrum bibendum dolor sem  
 179 nec tellus.

180 ► **Lemma 8** (Quisque blandit tempus nunc). *Sed interdum nisl pretium non. Mauris sodales*  
 181 *consequat risus vel consectetur. Aliquam erat volutpat. Nunc sed sapien ligula. Proin faucibus*  
 182 *sapien luctus nisl feugiat convallis faucibus elit cursus. Nunc vestibulum nunc ac massa*  
 183 *pretium pharetra. Nulla facilisis turpis id augue venenatis blandit. Cum sociis natoque*  
 184 *penatibus et magnis dis parturient montes, nascetur ridiculus mus.*

185 Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui. Nam  
 186 vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa sit  
 187 amet neque.

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### 203 **A Styles of lists, enumerations, and descriptions**

204 List of different predefined enumeration styles:

```
205 ■ \begin{itemize}...\end{itemize}
206 ■ ...
207 ■ ...

208 1. \begin{enumerate}...\end{enumerate}
209 2. ...
210 3. ...

211 (a) \begin{alphaenumerate}...\end{alphaenumerate}
212 (b) ...
213 (c) ...

214 (i) \begin{romanenumerate}...\end{romanenumerate}
```

215 (ii) ...

216 (iii) ...

217 (1) \begin{bracketenumerate}...\end{bracketenumerate}

218 (2) ...

219 (3) ...

220 **Description 1** \begin{description} \item[Description 1] ... \end{description}

221 **Description 2** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.

222 Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus  
223 massa sit amet neque.

224 **Description 3** ...

## 225 **B** Theorem-like environments

226 List of different predefined enumeration styles:

227 ► **Theorem 9.** *Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo*  
228 *dui. Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus*  
229 *massa sit amet neque.*

230 ► **Lemma 10.** *Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.*  
231 *Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa*  
232 *sit amet neque.*

233 ► **Corollary 11.** *Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo*  
234 *dui. Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus*  
235 *massa sit amet neque.*

236 ► **Proposition 12.** *Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo*  
237 *dui. Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus*  
238 *massa sit amet neque.*

239 ► **Exercise 13.** *Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo*  
240 *dui. Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus*  
241 *massa sit amet neque.*

242 ► **Definition 14.** *Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo*  
243 *dui. Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus*  
244 *massa sit amet neque.*

245 ► **Example 15.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo  
246 dui. Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus  
247 massa sit amet neque.

248 ► **Note 16.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.  
249 Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa  
250 sit amet neque.

251 ► **Note.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui. Nam  
252 vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa sit  
253 amet neque.

254 ► **Remark 17.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.  
 255 Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa  
 256 sit amet neque.

257 ► **Remark.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.  
 258 Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa  
 259 sit amet neque.

260 ▷ **Claim 18.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.  
 261 Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa  
 262 sit amet neque.

263 ▷ **Claim.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui.  
 264 Nam vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa  
 265 sit amet neque.

266 **Proof.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui. Nam  
 267 vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa sit  
 268 amet neque. ◀

269 **Proof.** Fusce eu leo nisi. Cras eget orci neque, eleifend dapibus felis. Duis et leo dui. Nam  
 270 vulputate, velit et laoreet porttitor, quam arcu facilisis dui, sed malesuada risus massa sit  
 271 amet neque. ◀