# Risk Assessment of Cash on Delivery System in Indonesian E-Commerce Using House of Risk and Content Validity Index

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Abstract:- The phenomenon of rapid development of Ecommerce in Indonesia is increasing every year. This is influenced by several factors, including cheaper prices and ease of use. The payment method that is often used in Indonesian E-Commerce is using the Cash on Delivery (COD) payment system with 82.26% transaction. COD payments still have risks that can harm the seller, such as the buyer not paying until the product is returned. The aim of this study is to determine the risks of the COD payment system in Indonesian e-commerce faced by the sellers. This research uses the Content Validity Index (CVI) method and the House of Risk (HOR) method. The result is that there are 21 risk indicators divided into seven risk dimensions, there are 21 risk events and there are 23 risk agents which are the main causes of risks such as increasing order volume and dissatisfaction with the quality of products received.

**Keywords:-** E-Commerce, Cash on Delivery, Content Validity, House of Risk.

## I. INTRODUCTION

The growth of internet usage in the world is rapidly and widely, with an easy internet access making. The pace of E-commerce advancement is rapidly accelerating, that the findings from surveys on E-commerce in Indonesia reveal annual increments. There is an increase in the number of businesses in 2020 by 2,361,423 businesses, and in 2021 by 2,868,178 businesses [1]. In 2022, it is estimated that there will be 2,995,986 businesses [2]. A survey by the Indonesian Internet Service Providers Association (APJII), state that the use of internet was able to double sales compared to sales without using the internet [3].

Even though E-commerce is experiencing very fast development, this activity is experiencing logistics problems, Indonesia is one of the countries that has the biggest logistics problems, especially delivery delays [4]. Poor logistics performance is caused by inadequate infrastructure and inefficient provisions from service providers [5]. In reducing logistics problems, there are several important factors that E-commerce providers must understand, namely, quality of product information, convenience of the purchasing process, perceived security, customer service, payment capabilities and delivery services [6].

Based on these factors, E-commerce needs to control logistics activities to improve operational functions and customer service. An option available for customers through E-commerce customer service is that customers can freely choose their payment method [7]. The other survey by the Central Statistics Agency in 2023 in Indonesia, it is known that the payment method frequently used in E-commerce is using the COD payment system at 82.26% [2].

E-commerce companies send goods from sellers through their own logistics or hiring other logistics partners. This can indirectly harm the sellers and E-commerce companies, the loss referred to the COD system is vulnerable to product returns where the customer does not pay for the product so that the seller will incur additional costs to the company and courier [8]. Therefore, E-commerce needs to create a COD system policy to increase customer satisfaction and obtain added value and also reduce company losses [9].

Based on the explanation above, in forming this policy it is necessary to determine the risks that occur in the Cash on Delivery payment system. This research began by conducting a literature review and using the Content Validity Index (CVI) method among experts. Next, distribute a risk assessment questionnaire to the sellers regarding the COD payment system. The results of the questionnaire will be processed using the House of Risk (HOR) method to determine the risks that can occur to sellers in COD ecommerce transactions in Indonesia. With this research, it is hoped that it can minimize risks in the COD payment system.

#### II. LITERATURE REVIEW

#### A. E-Commerce

E-commerce is a transaction process starting from customers, selling or exchanging goods or services to information via the internet network [10]. There are four principles in running E-commerce well, namely Connection, Creation, Consumption, and Control. These principles will lead to the company's Return of Investment (ROI) [11]. There are several advantages that result from using E-commerce [12], Market Globalization, Personalized demands, Business Integration, and Equal Business Opportunities.

# B. Cash on Delivery (COD)

Business transactions carried out include payment systems implemented by E-commerce which can be divided

into several types [13], Online Credit Cards, e-Wallets, Virtual Account, online stored-value systems, digital check payment systems, and wireless payment systems. According to the Central Statistics Department [14] E-commerce in Indonesia offers a variety of payment systems including interbank transfers, credit cards, e-Wallets, and Cash on Delivery (COD). The COD method is a cash payment made by consumers when the desired product has been received at the location [15]. The COD method provides an option to other methods because it is preferred by consumers, if the goods do not match the consumer's order, then the consumer does not have to pay for it [16].

#### C. Content Validity Index (CVI)

Content Validity Index is defined as how relevant the elements in the assessment indicators are and represent the meaning or important points targeted for certain assessment objectives [17]. Apart from that, another meaning is whether the sample items used in an assessment adequately represent all the items [18].

The scores in the CVI are divided into two types, first the assessment at each item level is called Item level (I-CVI) and the overall assessment is called Scale-level (S-CVI) [19]. I-CVI will show whether the items used in an assessment are considered relevant to the total number of respondents [18].

## D. House of Risk

The House of Risk framework represents an evolution of the Failure Mode and Effect Analysis (FMEA) and Quality Function Deployment (QFD) methodologies. It quantifies risk levels and prioritizes risk sources based on their potential impact [20]. Provide solutions based on risk sources, risk factor probabilities, and Severity levels [21].

#### III. METHODOLOGY

This study focused on examining the risks associated with the Cash on Delivery (COD) payment system in Indonesia, specifically within the supply chain or operational processes as experienced by sellers in Indonesian ecommerce. The research involved 10 sellers who utilized the COD payment method, representing various business categories in the e-commerce sectors. Toassess the relevance of each item, experts were asked to rate them typically on a four-point scales in the item-level Content ValidityIndex (I-CVI) calculation. Four experts meeting the criteria were selected as respondents for the validation process, which involved distributing questionnaires to the experts.

## A. Content Validity Index (CVI)

In calculating item-level CVI (I-CVI), experts are asked to rate the relevance of each item, usually on a 4-point scale.

Table 1: Validity Test Rating Scale

| Scale | Description       |
|-------|-------------------|
| 1     | Not Relevant      |
| 2     | Somewhat Relevant |
| 3     | Quite Relevant    |
| 4     | Very Relevant     |

I-CVI = (Total expert agreeing)/(Total expert) (1)

 $S-CVI = (\Sigma I-CVI)/(Total item)$  (2)

(=)

The number of experts involved determines how much valid data will be obtained, so that there is a calculation of the number of experts and the results that are said to be valid [22].

Table 2: I-CVI Assessment Based on Number of Experts

| (1)          | (2)  | (3) <sup>a</sup> | (4) <sup>b</sup> | (5) <sup>c</sup> | $(6)^d$    |
|--------------|--|------------------|------------------|------------------|------------|
| Total Expert | Number of Expert Agreeing<br>(Rating 3 or 4) | I-CVI            | Pc               | к*               | Evaluation |
| 3            | 3  | 1.00             | 0.125            | 1.00             | Excellent  |
| 3            | 2  | 0.67             | 0.375            | 0.47             | Fair       |
| 4            | 4  | 1.00             | 0.063            | 1.00             | Excellent  |
| 4            | 3  | 0.75             | 0.250            | 0.67             | Good       |
| 5            | 5  | 1.00             | 0.041            | 1.00             | Excellent  |
| 5            | 4  | 0.80             | 0.156            | 0.76             | Excellent  |
| 6            | 6  | 1.00             | 0.016            | 1.00             | Excellent  |
| 6            | 5  | 0.83             | 0.094            | 0.81             | Excellent  |
| 6            | 4  | 0.67             | 0.234            | 0.57             | Fair       |
| 7            | 7  | 1.00             | 0.008            | 1.00             | Excellent  |
| 7            | 6  | 0.86             | 0.055            | 0.85             | Excellent  |
| 7            | 5  | 0.71             | 0.164            | 0.65             | Good       |
| 8            | 8  | 1.00             | 0.004            | 1.00             | Excellent  |
| 8            | 7  | 0.88             | 0.031            | 0.88             | Excellent  |
| 8            | 6  | 0.75             | 0.109            | 0.72             | Good       |

| 9 | 9 | 1.00 | 0.002 | 1.00 | Excellent |
|---|---|------|-------|------|-----------|
| 9 | 8 | 0.89 | 0.014 | 0.89 | Excellent |
| 9 | 7 | 0.78 | 0.070 | 0.76 | Excellent |

# B. House of Risk (HOR)

HOR focuses on processing data on risk events and risk causes (risk agents) to obtain risk priorities based on ARP

weights. The ARP formula itself uses the following calculations.

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$$ARP(j) = O(j)\sum S(i)R(ij)$$
(3)

ARPj = Aggregate Risk Potential Oj = Probability of Occurrence Si = Severity of Impact

Rij = Correlation Between Risk Agents and Risk Eventsi = Risk event

j = Risk agent

• The following is an explanation of the values included in the risk event and risk agent assessment [23].

Table 3: Severity Criteria

| Level | Severity         | Severity Criteria                            |
|-------|------------------|--|
| 1     | No impact        | The risk has no impact on COD activities     |
| 2     | Low impact       | Risk has small impact on COD Activities      |
| 3     | Moderate Impact  | Risk has a moderate impact on COD            |
| 4     | Serious Impact   | Risk has a serious impact on COD             |
| 5     | Extremely Severe | Risk has an extreme impact on COD activities |

Table 4: Occurrence Criteria

| Level | Occurrence        | Occurrence Criteria  |
|-------|-------------------|--|
| 1     | Never happen      | The probability of this happening is 0-25% (Risks Almost Never Happen) |
| 2     | Rarely occurs     | Low probability of occurrence is 26-50% (Risk Rarely Occurs)           |
| 3     | May occurs        | The probability of this happening is 51-60% (Risk may occur)           |
| 4     | Often occurs      | The probability of this happening is 61-75% (Risks Often Occur)        |
| 5     | Very often occurs | The probability of this happening is 76-100% (Risk Occurs Very Often)  |

Table 5: Corelation Criteria

| Corelation Value | Corelation Criteria             |
|------------------|---------------------------------|
| 0                | No correlation                  |
| 1                | There is a small correlation    |
| 3                | There is a moderate correlation |
| 9                | There is a high correlation     |

# IV. RESULT AND DISCUSSION

## A. CVI Indicator

Risk indicator data was collected by conducting a literature study of several previous studies related to

distribution flows using the COD payment system in ecommerce. Based on the literature study that has been carried out, there are 7 risk dimensions were obtained consisting of: Distribution, Financial, Product, Privacy, Platform, Sales and Inventory, and Macro Factor.

Table 6: Cash on Delivery Indicators and Sub-Indicators

| No | <b>Risk Dimension</b> | Risk Indicator  | Reference              |
|----|-----------------------|---|------------------------|
| 1  | Distribution          | Delivery speed, Delivery Cost, The role of thirdparties                       | [24], [25], [9]        |
| 2  | Financial             | Payment policy, Buyer fails topay, PlatformCompliance, Payment information    | [25], [26], [27], [28] |
|    |                       |   |                        |
| 3  | Product               | Product quality, Product packaging, Riskof fake or imitation goods            | [27], [29], [30]       |
| 4  | Privacy               | Confidentiality of personal information, Cheating or falsifying Personal data | [25], [31]             |
| 5  | Platform              | Regulatory violations, Dependence on Platform algorithms, Platform            | [32], [33], [34], [35] |
|    |                       | interruptions ortechnical failures, Platform Credibility                      |                        |
| 6  | Sales                 | Inventory management, Loss of sales, Customer ratings and reviews, Error      | [36], [37], [35], [38] |
|    | AndInventory          | forecasting, Product returns  |                        |
| 7  | Macro                 | Impact of natural disasters, Impact of Pandemic, Risk of network disruption   | [37], [39], [27]       |

After completing the questionnaire, the recapitulation results of the questionnaire are then calculated using the I-CVI method. The results of calculations using this method

produced a total of 21 indicators which were declared valid in 7 risk dimensions withan I-CVI value of 0.94.

Table 8: List of Valid COD Indicators

| Risk Dimension      | Risk Indicator                               | Number of ExpertAgreeing | I-CVI |
|---------------------|--|--------------------------|-------|
|                     | Delivery speed                               | 4                        | 1.0   |
| Distribution        | Delivery Cost                                | 4                        | 1.0   |
|                     | The role of third parties                    | 4                        | 1.0   |
| Financial           | Payment policy                               | 3                        | 0.8   |
|                     | Buyer fails to pay                           | 4                        | 1.0   |
|                     | Platform Compliance                          | 3                        | 0.8   |
|                     | Payment fee commission                       | 3                        | 0.8   |
| Product             | Product quality                              | 4                        | 1.0   |
|                     | Product packaging                            | 4                        | 1.0   |
|                     | Risk of fake or imitation goods              | 4                        | 1.0   |
| Privacy             | Cheating or falsifying personal data         | 4                        | 1.0   |
| Platform            | Regulatory violations                        | 4                        | 1.0   |
|                     | Dependence on Platform algorithms            | 3                        | 0.8   |
|                     | Platform interruptions or technical failures | 4                        | 1.0   |
|                     | Platform Credibility                         | 4                        | 1.0   |
| Sales and Inventory | Inventory management                         | 3                        | 0.8   |
|                     | Loss of sales                                | 4                        | 1.0   |
|                     | Product returns                              | 4                        | 1.0   |
| Macro               | Impact of natural disasters                  | 4                        | 1.0   |
|                     | Impact of Pandemic                           | 4                        | 1.0   |
|                     | Risk of network disruption                   | 4                        | 1.0   |

## B. Risk Identification

After the validation process with the experts has been completed, valid indicators can be continued to determine the

risk of events and also risk causes using the HOR approach. Based on valid risk indicators, TABLE VIII shown that there were 21 Risk Events and 48 Risk Agent results.

Table 8: Risk Identification

| No | Risk Dimension | Risk Event                         | Risk Agent   |
|----|----------------|------------------------------------|--|
| 1  |                | The length of delivery duration in | Items Lost or Damaged During Shipping (A1)                         |
| 2  |                | the COD payment system (E1)        | Errors in Order Delivery (A2)                                      |
| 3  |                |                                    | Increased order volume or high workload on the logistics side (A3) |
| 4  | Distribution   | Changes in shipping costs when     | Increase in logistics costs (A4)                                   |
| 5  |                | sending goods using COD (E2)       | The COD administration process is complicated and requires         |
|    |                |                                    | additional costs (A5)  |
| 6  |                |                                    | Variability in shipping costs between regions (A6)                 |
| 7  |                | Involvement of third parties as    | Delay in Handling Payments from Third Parties (A7)                 |
| 8  |                | delivery service providers (E3)    | Misuse of customer and seller information or data (A8)             |
| 9  |                |                                    | Interference or system failure from the third party (A9)           |
| 10 |                | Changes to payment policies setby  | Delays or delays in disbursing funds from COD sales to sellers     |
|    |                | the Platform (E4)                  | from the Platform (A10)  |
| 11 |                |                                    | Payment Policy Changes Without Notification or Approval            |
|    |                |                                    | (A11)  |
| 12 |                |                                    | Non-Transparent Fees and Deductions (A12)                          |
| 13 |                | Failure of the buyer to make       | Fraud by Using Certain Reasons (A13)                               |
| 14 |                | payment (E5)                       | Buyer's Inability to Make Payment (A14)                            |
| 15 | Financial      |                                    | Interception or Theft of Orders in Transit (A15)                   |
| 16 |                | Incompatibility of regulations and | Violations of Payment Regulations or Data Security (A16)           |
| 17 |                | financial policies implemented by  | Policy changes and lack of transparency regarding fund             |
|    |                | the E-commerce Platform (E6)       | management and payments (A17)                                      |
| 18 |                |                                    | Delay in Handling Complaints or Disputes (A18)                     |
| 19 |                | Changes in sales commission fees   | Platforms that do not provide transparency or clear                |
|    |                | from the Platform (E7)             | information regarding commission fee structures (A19)              |

| 20 |           |   | Commission Fees That Are Disproportionate to the Services         |
|----|-----------|---|---|
|    |           |   | Received (A20)  |
| 21 |           | Differences in the quality of products                        | Poor handling during the shipping process (A21)                   |
| 22 |           | sold (E8)   | Product Delivery Does Not Conform to Specifications(A22)          |
| 23 |           | Damage to product packagingduring                             | Bad weather during shipping may damage the product if             |
|    | Product   | COD delivery (E9)   | packaging is inadequate (A23)                                     |
| 24 |           |   | High costs of safe product packaging(A24)                         |
| 25 |           | Fake or imitation goods (E10)                                 | Not being careful in product verification or lack of quality      |
|    |           |   | control(A25)  |
| 26 |           |   | Abuse of the Goods Return System by buyers(A26)                   |
| 27 |           |   | Does notprovide accurate or appropriate product information(A27)  |
|    |           | Fraud or falsification of data                                | Buyers who make fictitious transactions (A28)                     |
| 28 | Privacy   | when using the COD method(E11)                                | •   |
| 29 | Platform  | General Regulatory Violations committed by the Platform (E12) | Indecisiveness of regulations implemented (A29)                   |
| 30 |           | committed by the Flatform (E12)                               | There is no regulatory transparency provided to sellers (A30)     |
| 30 |           |   | There is no regulatory transparency provided to seners (A50)      |
| 31 |           | Platform algorithms that are difficult                        | Lack of information regarding Algorithms received by sellers      |
| 31 |           | for sellers to understand (E13)                               | (A31)   |
| 32 |           |   | Injustice in the application of Algorithms on the Platform        |
|    |           |   | (A32)   |
| 33 |           | Technical disruption or failure in                            | Internal problems on the E-commerce Platform (A33)                |
|    |           | the COD system (E14)  | ,   |
| 34 |           |   | The system maintenance or update process carried out by the       |
|    |           |   | Platform (A34)  |
| 35 |           | Decreased Platform Credibility                                | Poor or unresponsive customer service from the Platform           |
|    |           | (E15)   | (A35)   |
| 36 |           |   | The appearance of the application is unattractive and the lack    |
|    |           |   | of promos offered (A36)   |
| 37 | Sales And | Inaccurate Inventory Managementin                             | Inaccurate transaction reporting (A37)                            |
|    | Inventory | the COD System (E16)  |   |
| 38 |           |   | Inconsistency in inventory data (A38)                             |
| 39 |           | Lost sales on the COD payment system (E17)                    | Rejection or Cancellation of Orders by Buyers (A39)               |
| 40 |           |   | Buyer Unready or Unwilling to Pay (A40)                           |
| 41 |           | High Rate of Product Returns in                               | Returning products without a clear or valid reason (A41)          |
|    |           | the COD System (E18)  |   |
| 42 |           |   | Dissatisfaction with the quality of the product received (A42)    |
| 43 | Macro     | Impact of Natural Disasters on COD                            | Disruption of Inventory or Supplies management (A43)              |
|    |           | payment systems (E19)   |   |
| 44 |           |   | Delays in the delivery process due to disruption in the logistics |
|    |           |   | system (A44)  |
| 45 |           | Impact of the Pandemic on the COD                             | Movement Restrictions and Lockdown (A45)                          |
|    |           | payment system (E20)  |   |
| 46 |           |   | Inconvenience of cash payments (A46)                              |
| 47 |           | Internet network disruption during COD payments (E21)         | Technical Disturbances in Network Infrastructure (A47)            |
| 48 |           |   | Internet connection instability (A48)                             |
|    |           |   |   |

# C. House of Risk

Risk processing in House of Risk phase 1 includes 2 stages, namely: First, determining the correlation matrix to determine the relationship or link between Risk Event and

Risk Agent and second, calculate the aggregate risk potential (ARP) value and Risk Agent prioritization. Based on the results of data processing, the following TABLE IX are the results of the House of Risk processing matrix

Table 9: Matrix HOR

| D: 1          | Ris     | k Ag    | ent         |         |         |         |         |           |           |         |         | . 1110  | urix    | 11010   | •       |         |         |         |         |         |             |             |         |         | C            |
|---------------|---------|---------|-------------|---------|---------|---------|---------|-----------|-----------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|-------------|-------------|---------|---------|--------------|
| Risk<br>Event | A1      | A2      | A3          | A4      | A5      | A6      | A7      | <b>A8</b> | <b>A9</b> | A10     | A11     | A12     | A13     | A14     | A15     | A16     | A17     | A18     | A19     | A20     | A21         | A22         | A23     | A24     | Seve<br>rity |
| E1            | 9       | 3       | 9           |         |         |         |         |           | 3         |         |         | 1       |         |         | 3       |         |         |         |         |         | 3           |             |         |         | 3            |
| E2            |         |         |             | 3       | 1       | 3       |         |           |           |         |         |         |         |         |         |         |         |         |         |         |             |             |         | 3       | 4            |
| E3            |         |         | 9           |         |         |         | 3       | 1         | 3         |         |         |         |         |         | 3       |         |         |         |         |         | 3           | 3           | 1       |         | 2            |
| E4            |         |         |             |         |         |         |         |           |           | 3       | 9       | 3       |         |         |         |         |         |         |         |         |             |             |         |         | 2            |
| E5            | 3       | 3       |             |         |         |         |         |           |           |         |         |         | 3       | 3       | 1       |         |         |         |         |         | 3           | 9           | 1       |         | 4            |
| E6            |         |         |             |         |         |         | 3       |           |           | 3       |         |         |         |         |         | 1       | 3       | 3       |         |         |             |             |         |         | 2            |
| E7            |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         | 3       | 1       |             |             |         |         | 3            |
| E8            |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         | 9           | 9           | 1       |         | 3            |
| E9            |         |         | 3           |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         | 3           |             | 3       | 3       | 3            |
| E10           |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         |             | 3           |         |         | 4            |
| E11           |         |         |             |         |         |         |         |           |           |         |         |         | 3       |         |         |         |         |         |         |         |             |             |         |         | 3            |
| E12           |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         |             |             |         |         | 3            |
| E13           |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         |             |             |         |         | 2            |
| E14           |         |         | 3           |         |         |         |         |           | 3         |         |         |         |         |         |         |         |         |         |         |         |             |             |         |         | 3            |
| E15           |         |         |             |         |         | 1       |         |           | 1         | 3       |         |         |         |         |         |         |         | 3       |         |         |             |             |         |         | 3            |
| E16           |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         |             |             |         |         | 2            |
| E17           | 3       |         |             | 3       |         | 1       |         |           |           |         |         |         | 3       | 3       |         | 3       |         | 1       |         |         | 1           | 3           |         |         | 4            |
| E18           |         |         |             |         |         |         |         |           |           |         |         |         | 3       | 3       |         |         |         |         |         |         | 3           | 3           |         |         | 4            |
| E19           |         |         |             |         |         |         |         |           |           |         |         |         |         |         | 1       |         |         |         |         |         |             |             |         |         | 3            |
| E20           |         |         |             |         |         |         |         |           |           |         |         |         |         |         | 1       |         |         |         |         |         |             |             |         |         | 2            |
| E21           |         |         |             |         |         |         |         |           |           |         |         |         |         |         |         |         |         |         |         |         |             |             |         |         | 3            |
| Occurr        | 1       | 1       | 3           | 3       | 2       | 4       | 3       | 2         | 2         | 3       | 2       | 1       | 2       | 2       | 1       | 1       | 2       | 2       | 2       | 1       | 2           | 1           | 2       | 1       |              |
| ence          | 1       | 1       | າ           | 3       | 2       | 4       | ٦       | 4         | 2         | า       | 4       | 1       | 2       | 2       | 1       | 1       | 4       | 2       | 4       | 1       | 2           | 1           | ۷       | 1       |              |
| ARP           | 5<br>1  | 2       | 1<br>8<br>9 | 7 2     | 8       | 7<br>6  | 3 6     | 4         | 5<br>4    | 6       | 3<br>6  | 9       | 9       | 7 2     | 2 4     | 1<br>4  | 1 2     | 3 8     | 1<br>8  | 3       | 1<br>5<br>8 | 1<br>0<br>5 | 3 6     | 2       |              |
| Rank          | 2 0     | 3       | 1           | 1<br>1  | 4<br>5  | 1<br>0  | 2 5     | 4<br>7    | 1<br>8    | 1 3     | 2 5     | 4 3     | 8       | 1<br>1  | 3<br>0  | 3<br>8  | 4<br>0  | 2<br>4  | 3<br>6  | 4<br>8  | 2           | 4           | 2<br>5  | 3       |              |
| %             | 2.<br>2 | 0.<br>9 | 8.<br>0     | 3.<br>1 | 0.<br>3 | 3.<br>2 | 1.<br>5 | 0.<br>2   | 2.<br>3   | 2.<br>7 | 1.<br>5 | 0.<br>4 | 3.<br>8 | 3.<br>1 | 1.<br>0 | 0.<br>6 | 0.<br>5 | 1.<br>6 | 0.<br>8 | 0.<br>1 | 6.<br>7     | 4.<br>5     | 1.<br>5 | 0.<br>9 |              |

Table 10: Continuation of Matrix HOR

| Risk  |     |     |     |     |     |     |     |     | ioic . |     |     |     | Ager |     |     |     |     |     |     |     |     |     |     |     | Seve |
|-------|-----|-----|-----|-----|-----|-----|-----|-----|--------|-----|-----|-----|------|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|------|
| Event | A25 | A26 | A27 | A28 | A29 | A30 | A31 | A32 | A33    | A34 | A35 | A36 | A37  | A38 | A39 | A40 | A41 | A42 | A43 | A44 | A45 | A46 | A47 | A48 | rity |
| E1    |     |     |     |     |     |     |     |     |        |     |     |     |      |     |     | 1   |     |     | 3   | 3   | 3   |     |     |     | 3    |
| E2    |     |     |     |     |     |     |     |     |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 4    |
| E3    |     |     |     |     |     |     |     |     |        |     |     |     |      |     |     |     |     |     |     | 3   |     |     |     |     | 2    |
| E4    |     |     |     |     | 1   |     |     |     |        |     |     |     |      |     |     |     |     |     |     |     | 1   |     |     |     | 2    |
| E5    |     |     |     | 3   |     |     |     |     |        |     |     |     |      |     | 3   | 3   | 3   | 3   |     |     |     |     |     |     | 4    |
| E6    |     | 3   |     |     | 1   | 1   |     |     |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 2    |
| E7    |     |     |     |     | 1   | 3   |     |     |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 3    |
| E8    |     |     | 3   |     |     |     |     |     |        |     |     |     |      |     |     |     |     | 3   |     |     |     |     |     |     | 3    |
| E9    |     |     |     |     |     |     |     |     |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 3    |
| E10   | 3   | 1   | 9   |     |     |     |     |     |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 4    |
| E11   |     |     |     | 3   |     |     |     |     |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 3    |
| E12   |     |     |     |     | 1   | 3   |     | 3   |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 3    |
| E13   |     |     | 1   |     |     |     | 9   | 3   |        |     |     |     |      |     |     |     |     |     |     |     |     |     |     |     | 2    |
| E14   |     |     |     |     |     |     |     |     | 3      | 3   |     |     |      |     |     |     |     |     |     |     |     |     | 3   | 3   | 3    |
| E15   |     |     |     |     |     |     |     | 3   |        |     | 3   | 3   |      |     |     |     |     |     |     |     |     |     |     |     | 3    |
| E16   | 1   |     |     |     |     |     |     |     |        | 1   |     |     | 3    | 9   |     |     |     |     |     |     |     |     |     |     | 2    |
| E17   | 1   | 1   |     | 1   |     |     | 3   |     |        |     |     | 3   |      |     | 9   | 3   |     | 3   |     |     | 3   |     |     |     | 4    |
| E18   | 3   |     | 3   |     |     |     |     |     |        |     |     |     |      |     |     | 3   | 9   | 9   |     |     |     |     |     |     | 4    |
| E19   |     |     |     |     |     |     |     |     |        |     |     |     |      |     |     |     |     |     | 3   | 9   |     |     |     |     | 3    |
| E20   |     |     |     |     |     |     |     |     |        |     |     |     |      |     |     |     |     |     |     | 3   | 3   | 3   |     |     | 2    |

| E21            |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |         |             |         |         |         |         | 3       | 1       | 3 |
|----------------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|-------------|---------|---------|---------|---------|---------|---------|---|
| Occurr<br>ence | 2       | 1       | 1       | 2       | 1       | 1       | 2       | 2       | 2       | 2       | 1       | 2       | 1       | 2       | 2       | 2       | 2       | 2           | 3       | 2       | 2       | 2       | 2       | 2       |   |
| ARP            | 6       | 1<br>4  | 5<br>9  | 5<br>0  | 1 0     | 2 0     | 6<br>0  | 4 8     | 1 8     | 2 2     | 9       | 4 2     | 6       | 3<br>6  | 9<br>6  | 7<br>8  | 9<br>6  | 1<br>3<br>8 | 5<br>4  | 9<br>6  | 5<br>8  | 1 2     | 3 6     | 2 4     |   |
| Rank           | 1<br>4  | 3<br>8  | 1<br>6  | 2       | 4 2     | 3<br>5  | 1 4     | 2<br>2  | 3<br>6  | 3 2     | 4 3     | 2 3     | 4<br>6  | 2<br>5  | 5       | 9       | 5       | 3           | 1<br>8  | 5       | 1<br>7  | 4       | 2<br>5  | 3       |   |
| %              | 2.<br>6 | 0.<br>6 | 2.<br>5 | 2.<br>1 | 0.<br>4 | 0.<br>9 | 2.<br>6 | 2.<br>0 | 0.<br>8 | 0.<br>9 | 0.<br>4 | 1.<br>8 | 0.<br>3 | 1.<br>5 | 4.<br>1 | 3.<br>3 | 4.<br>1 | 5.<br>9     | 2.<br>3 | 4.<br>1 | 2.<br>5 | 0.<br>5 | 1.<br>5 | 1.<br>0 |   |

According to the Pareto diagram concept, risk sources are mapped based on an 80:20 composition, which means that as many as 80% of other risk sources can be prevented by

prioritizing taking action against the 20% largest risk sources. The following Fig. 1 below is the result of the Pareto diagram analysis of ARP value.

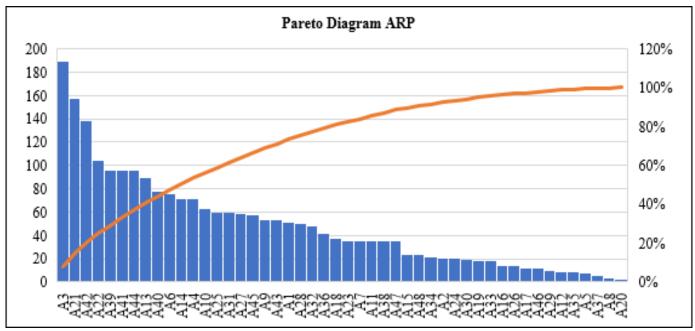


Fig 1: Pareto Diagram ARP

Based on the results of the Pareto diagram above, it has shown that there are 23 Risk Agents that dominantly influence the research, with the three largest ARP values, namely an increase in order volume or high workload on the logistics side (A3) by 8.04%, poor handling during the delivery process (A21) by 6.72% and dissatisfaction with the quality of the product received (A42)was 5.87% and 20 other Risk Agents with a percentage range of 4.5% - 1.79%.

## V. CONCLUSION

The results of House of Risk Matrix that have been done, it shown that there are 21 risk events which have been adapted from risk indicators that have been validated by experts which are divided into seven risk dimensions (Distribution, Financial, Product, Privacy, Platform, Sales and Inventory, and Macro/Other Factors) along with 48 Risk Agents who cause the risks that occur. Based on the ARP value, there are 23 risk agents that cause the main risk of COD payments in E-commerce. The highest ARP value is increased order volume or high workload of logistics (A3) 8.04% from distribution factor, poor handling during the delivery process (A21) 6.72% from product factor and

dissatisfaction with the quality of the product received (A42) and 5.87% of sales and inventory factor.

This research constrained that, the focus solely on the identification, classification, and validation of risks associated with the Cash on Delivery payment system in Indonesia. Further research can be carried out by determined the root cause of priority risk and the preventive action or strategies which aim to mitigate the priority risk of cash on delivery (COD).

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