

# Construção de dataset para histórico de *in-game currencies*

# Moedas e economias virtuais



Gold



Keys e outros

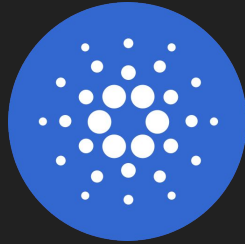


Itens

# Criptomoedas



Bitcoin

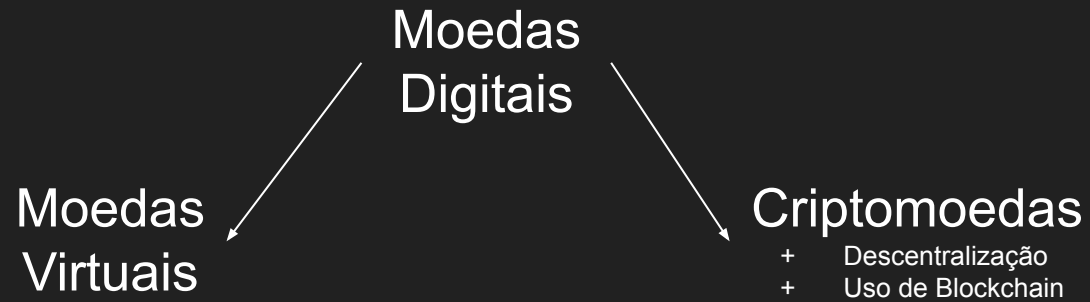


Altcoins

???



NFTs



# Pesquisas Existentes Sobre o Tema

## An Analysis of Virtual Currencies in Online Games

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### Abstract

In virtual worlds of MMORPGs (Massively Multiplayer Online Role-Playing Games), we observe that many players purchase virtual items by using real currencies, which is so-called eBaying. Extending the model developed by Castronova (2001), I analyze the value of virtual items in the virtual and real markets. The analysis reveals that incentive for eBaying is inherent to the game design. In addition, I classify the virtual currencies as a Local Exchange Trading Systems (LETS) because they are used in limited communities, not under control of money supply by the central banks, and subject to interest rates. Since these currencies are not subject to geographical boundaries, they can potentially be global LETS. The eBaying effectively means that the virtual currencies have exchange rates with real currencies, and thus have become meaningful for our economy. The online virtual worlds increase its importance for our life, and so does the virtual currencies.

### 1. Introduction

This paper aims to analyze the economic and monetary system of MMORPGs (massively multiplayer online role-playing games), and to discuss its implications on our real economy.

Economies of virtual worlds in MMORPGs were first analyzed from academic perspective by Edward Castronova. [1] analyzed the economic activity in the virtual world in an online game "Everquest". In the game, players (avatars) purchase various items required by using the virtual currency called PP (platinum piece). Players acquire items by the activities in the game, or purchase the items by trades among avatars using PP<sup>1</sup>. However, some (if not many) American players, despite the forbid in the game, trade the items in the real world using real currency through auction sites of the Internet, such as eBay.

[1] understood such a phenomenon that there emerged an exchange rate between real and virtual currencies based on purchasing power parity. For example, suppose that an item in Everquest is 100 PP.

<sup>1</sup> In some MMORPGs, game companies charges fees based on items that players purchase. In cases of such item-based fee system, the prices of the items are directly connected to real money.

If the same item is traded in the real world at US\$1, we can calculate that  $1PP = 1$  cent.

### 2. Economic analysis of virtual worlds

There are dearth of economic research on virtual worlds, except for [1], [2], and [3] by Castronova, and [4] by Bartle. To discuss and analyze the currencies in virtual worlds, we need to clarify what the economic activities in virtual world are like. I extend Analysis in [3] by specifying the properties of the utility function, which were not present in [3].

### 2.1. "Castronovan" utility function

In ordinary economics, we do not think of Nostrath as if it were a real country. Nevertheless, many economists have noticed that economic principles were functional also in this virtual world. In-game virtual worlds can provide valuable opportunities to observe economies under somewhat controlled environment.

[3] proposed a new type of utility function that suits analysis of the virtual worlds. In ordinary utility functions, as in the panel (a) of the Figure 1, economic agents maximize their utility by adjusting the consumption of goods, subject to the corresponding budget constraint. In contrast, "Castronovan" utility function assumes that an economic agent is considered



### RESEARCH ARTICLE

## The Predecessors of Bitcoin and Their Implications for the Prospect of Virtual Currencies

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### Abstract

To examine whether the recent price patterns and transaction costs of Bitcoin represent a general characteristic of decentralized virtual currencies, we analyze virtual currencies in online games that have been voluntarily managed by individuals since 1990s. We find that matured game currencies have price stability similar to that of small size equities or gold, and their transaction costs are sometimes lower than real currencies. Assuming that virtual currencies with a longer history can provide an estimate for Bitcoin's prospects, we project that Bitcoin will be less influenced by speculative trades and become a low cost alternative to real currencies.

### OPEN ACCESS

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**Data Availability Statement:** The price data of game currencies in this paper are acquired from [www.merchants.com](http://www.merchants.com) and [go.com](http://go.com). Bitcoin prices are obtained from [www.coinbase.com](http://www.coinbase.com) and the exchange rates of real currencies are acquired from [www.federalreserve.gov](http://www.federalreserve.gov). Gold pricing data comes from the Federal Reserve Bank of St. Louis website. Stock prices are acquired from the Center for Research in Security Prices (CRSP) at the University of Chicago.

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**Competing Interests:** The authors have declared that no competing interests exist.

### Introduction

Throughout history, the management of currency has been a responsibility and a right of a central authority. The recent debut of virtual currencies, such as Bitcoin, however, challenges this tradition. Electronic currencies are unique as the creation and management of these currencies are done by non-government entities. Further, there is an ongoing debate regarding whether these decentralized currencies are capable of serving as a substitute for the role of real currencies. In his letter to the Senate in 2013, Bernanke, the Federal Reserve Board chairman, states that cyber currencies "may have long-term promise". On the other hand, Krugman [1] criticizes virtual currencies because they are used primarily for speculation rather than as a method of transaction.

It has been only a few years since Bitcoin received much public attention, and it is difficult to determine whether the current observations from Bitcoin represent general characteristics of decentralized virtual currencies or are Bitcoin-specific. To acquire a more general understanding about virtual currencies, we examine a similar type of virtual currency that has been voluntarily traded and managed by individuals since the 1990s. The first cash payments between players for a virtual item occurred in 1987 (Heeks [2]). The purpose of our analysis is to obtain the prospects of Bitcoin from other similar virtual currencies with a longer history.



### RESEARCH ARTICLE

## Virtual World Currency Value Fluctuation Prediction System Based on User Sentiment Analysis

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### Abstract

In this paper, we present a method for predicting the value of virtual currencies used in virtual gaming environments that support multiple users, such as massively multiplayer online role-playing games (MMORPGs). Predicting virtual currency values in a virtual gaming environment has rarely been explored. It is difficult to apply real-world methods for predicting fluctuating currency values or shares to the virtual gaming world on account of differences in domains between the two worlds. To address this issue, we herein predict virtual currency value fluctuations by collecting user opinion data from a virtual community and analyzing user sentiments or emotions from the opinion data. The proposed method is straightforward and applicable to predicting virtual currencies as well as to gaming environments, including MMORPGs. We test the proposed method using large-scale MMORPGs and demonstrate that virtual currencies can be effectively and efficiently predicted with it.

### OPEN ACCESS

**Citation:** Kim YB, Lee SH, Kang SJ, Choi MJ, Lee J, Kim CH (2015) Virtual World Currency Value Fluctuation Prediction System Based on User Sentiment Analysis. PLoS ONE 10(4): e0123044. doi:10.1371/journal.pone.0123044

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**Data Availability Statement:** All relevant data are within the paper and its Supporting Information files.

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### Introduction

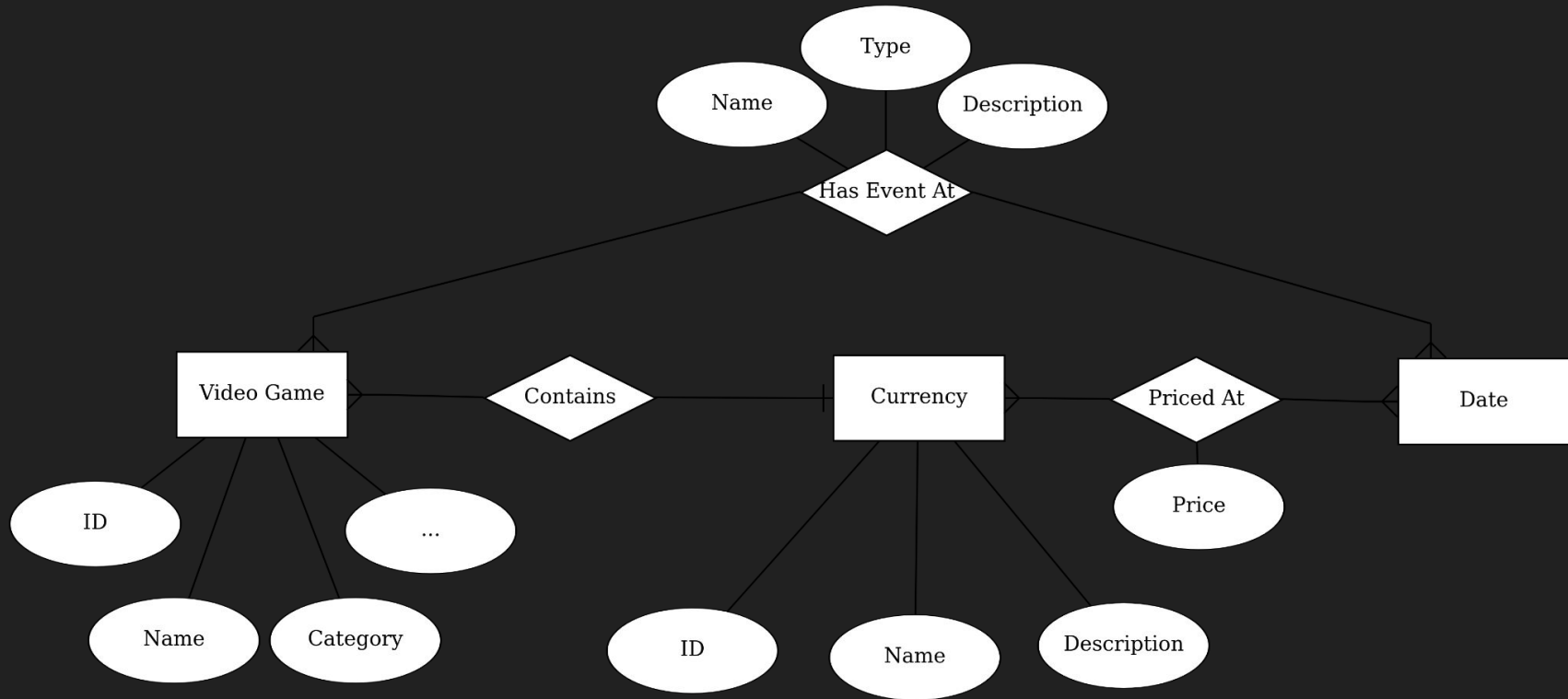
Virtual economies have emerged through interactions among users in virtual worlds. A virtual economy is primarily intended to foster users' increased enjoyment of the virtual environment. In some cases, the virtual economy lends itself to real economic purposes [1, 2]. Virtual economies have been evident in virtual reality social services or generally in multiplayer virtual reality games in which multiple users interact with one another. For example, in the virtual world of Second Life, a virtual currency called Linden Dollars is used. This currency is used within the virtual environment for buying and selling of houses, clothes, and other items made by users. In the gaming environment of World of Warcraft, which is a massively multiplayer online role-playing game (MMORPG), the virtual currency referred to as Gold is used to buy items for gaming and for other transactions among users.

In addition, the trend of exchanging real money for virtual currencies has been increasing [3]. Several users in Second Life have been trading Linden Dollars for real money or the Bitcoin

# Problemas

- Pesquisas mais recentes são de 2015
- Foco quase exclusivo em MMORPGs
- Ausência de datasets públicos facilmente acessíveis para o tema
  - Dados das pesquisas obtidos por web scraping, para um pequeno conjunto de moedas.

# Modelo Conceitual - Esboço



# Possíveis Modelos Lógicos

- Maior parte contida em formato relacional (SQL ou arquivo CSV), pela necessidade de tabelas de datas e preços.
- “Video Games” pode possuir um número variado de propriedades, como “Currencies” e dados específicos do jogo. Ao mesmo tempo, assim que inseridos, esses dados não serão modificados. Assim, armazená-los em formato JSON ou XML pode ser uma escolha mais adequada.
- ...Porém, armazená-los em formato de redes permite o acesso mais fácil a conjuntos de jogos conectados pela mesma propriedade, como gênero, ou moedas pertencentes ao mesmo jogo sem saber o mesmo de antemão.



# Questões iniciais

- Como o comportamento dessas moedas virtuais se compara com o de moedas tradicionais?
- Similarmente, como seu comportamento se compara com o de criptomoedas?
- Como, e em que grau, elas são afetadas por eventos internos (como updates) e externos (como quedas no mercado)
- É possível prever seu comportamento com uso de algoritmos? (mais adequada para pesquisas de machine learning)

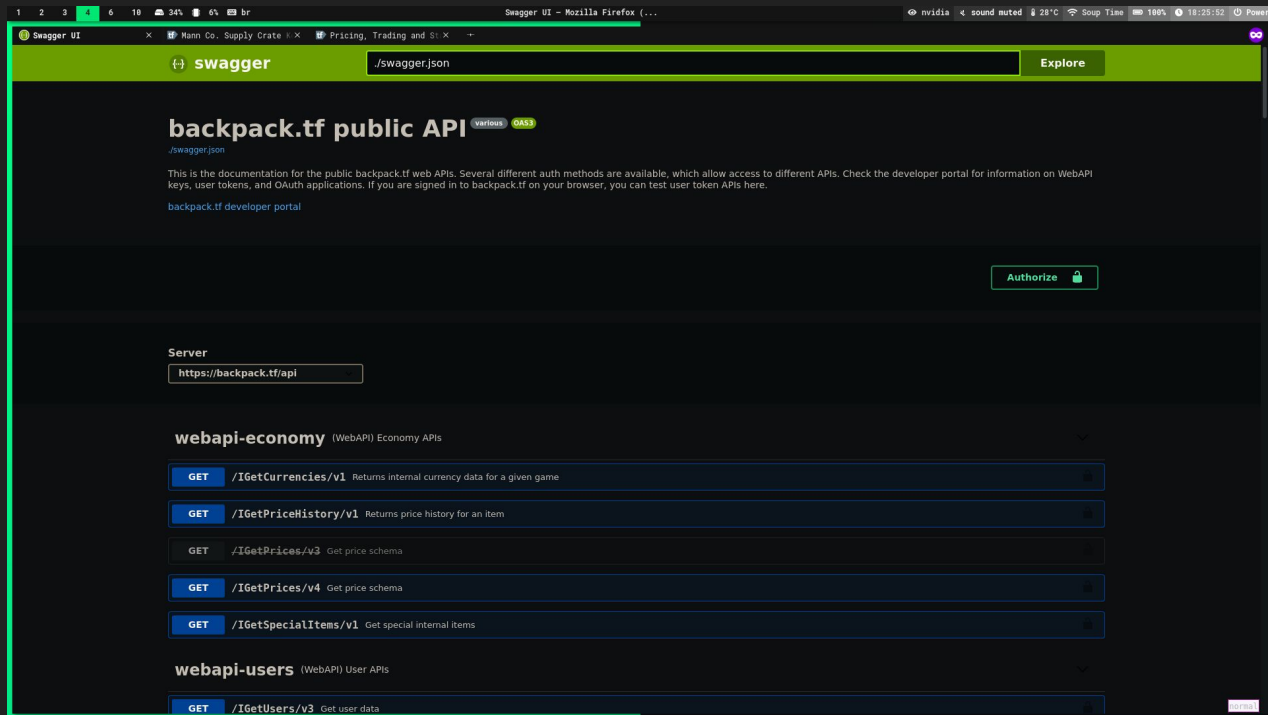
# Possíveis Fontes de Dados



backpack<sub>tf</sub>  
backpack<sub>dt</sub>

# Possíveis Formas de Obtenção de Dados

- Agregação por APIs públicas



# Possíveis Formas de Obtenção de Dados

- Extração por Web Scraping de gráficos



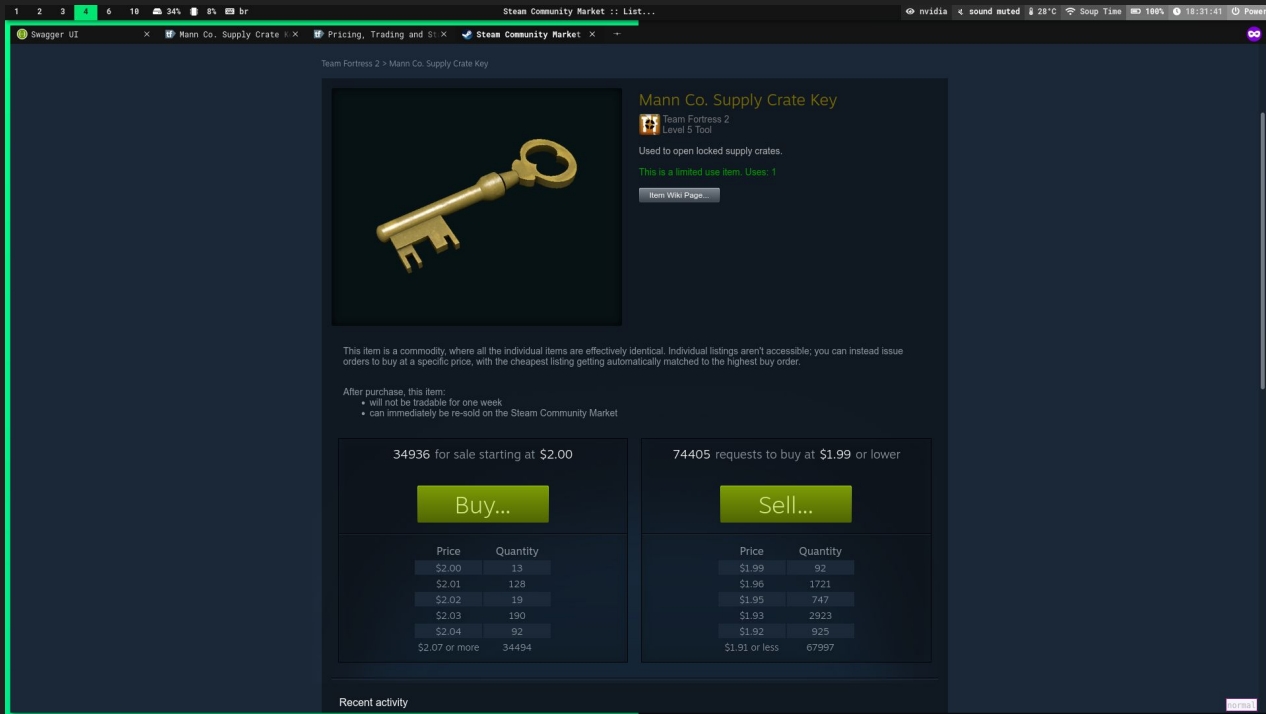
# Possíveis Formas de Obtenção de Dados

- Extração por Web Scraping usando Wayback Machine



# Possíveis Formas de Obtenção de Dados - Etapas Extras

- Ausência de valor único. Necessidade de tratamento antes de inserção



The screenshot shows the Steam Community Market interface for the Mann Co. Supply Crate Key. The key is a golden, ornate key. The listing is for Team Fortress 2, Level 5 Tool. It is described as a limited use item with 1 use. The item is a commodity, meaning all individual items are effectively identical. The listing shows 34936 items for sale starting at \$2.00 and 74405 requests to buy at \$1.99 or lower. The 'Buy...' button is highlighted in green. Below the button are two tables showing price and quantity data.

**Mann Co. Supply Crate Key**  
Team Fortress 2  
Level 5 Tool  
Used to open locked supply crates.  
This is a limited use item. Uses: 1  
[Item Wiki Page...](#)

This item is a commodity, where all the individual items are effectively identical. Individual listings aren't accessible; you can instead issue orders to buy at a specific price, with the cheapest listing getting automatically matched to the highest buy order.

After purchase, this item:

- will not be tradable for one week
- can immediately be re-sold on the Steam Community Market

34936 for sale starting at \$2.00

**Buy...**

Price	Quantity
\$2.00	13
\$2.01	128
\$2.02	19
\$2.03	190
\$2.04	92
\$2.07 or more	34494

74405 requests to buy at \$1.99 or lower

**Sell...**

Price	Quantity
\$1.99	92
\$1.96	1721
\$1.95	747
\$1.93	2923
\$1.92	925
\$1.91 or less	67997

Recent activity

# Possíveis Formas de Obtenção de Dados - Etapas Extras

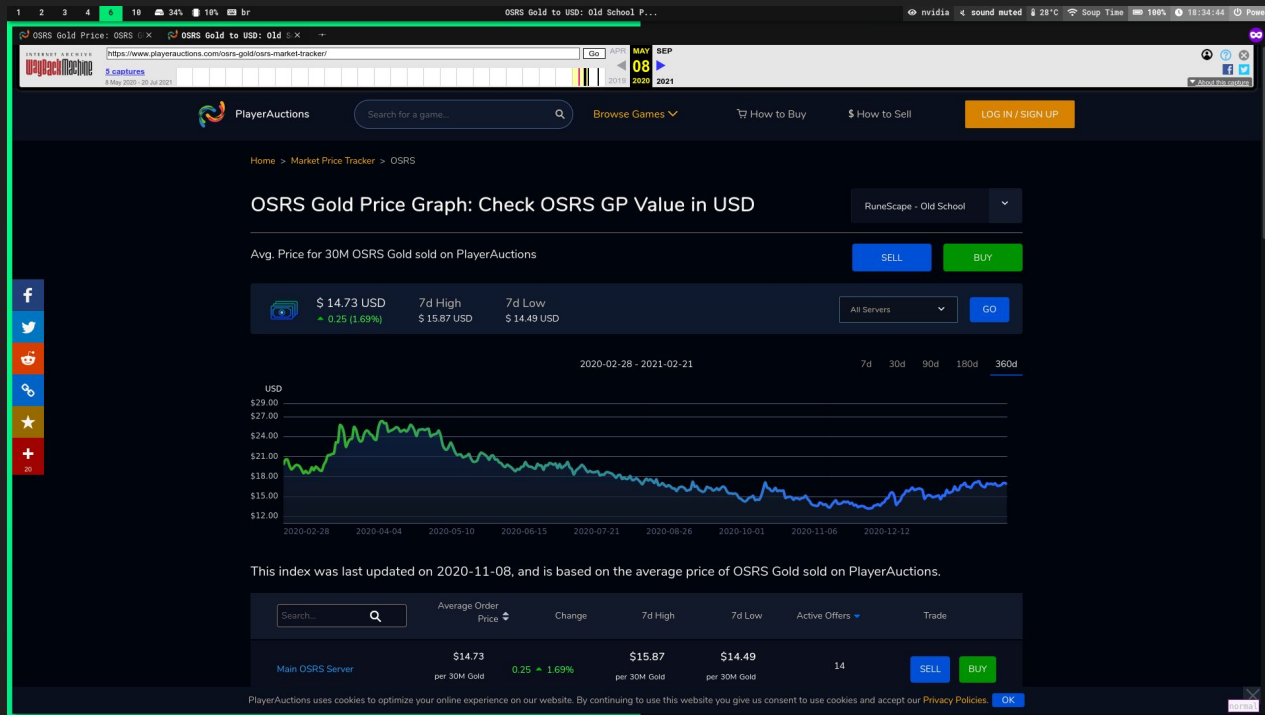
- Combinação de métodos para melhores resultados



Utilizando a página do PlayerAuctions atual, só é possível obter o valor da moeda entre 05/10/2020 e 29/09/2021

# Possíveis Formas de Extração - Etapas Extras

- Combinação de métodos para melhores resultados



Utilizando a versão arquivada mais antiga da página no Wayback Machine, é possível obter os valores no intervalo entre 28/02/2020 e 21/02/2021, adicionando mais de 6 meses de dados.



# Conclusão

