Prime Match: A Privacy Preserving Inventory Matching System

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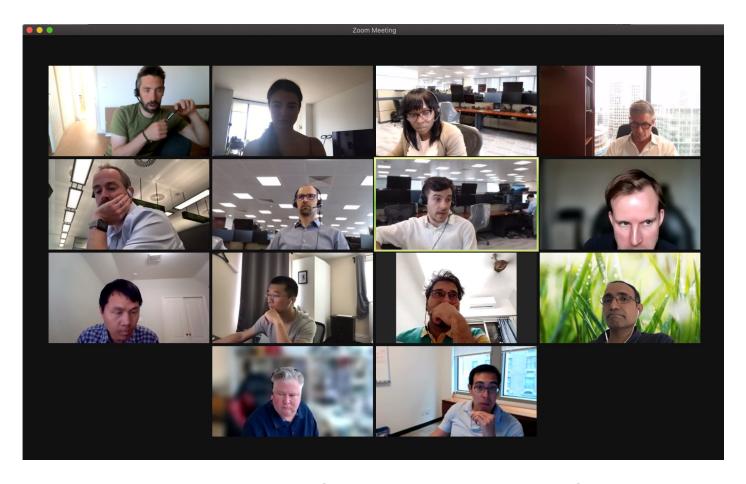
(J.P. Morgan Al Research & AlgoCRYPT CoE)

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AlgoCRYPT CoE

AI Research



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Motivation

- First one-time application of MPC (electronic double auction): Sugar bit auction [Bogetof et al. 2008]
- MPC Dashboard



- Identify a real-world problem for MPC in the traditional financial world
- Academic work on privacy preserving darkpools [CSA19, BPV20, CSA20, MDPB23]
- Prime Match is the first MPC auction running live in the traditional financial world.

Outline

- Prime Match Problem Statement & Motivation
- Cryptographic Contributions in Prime Match
- From Proof of Concept (PoC) to Product
 - Pre-production and Production challenges
- Cryptographic Solution
- o Demo



Starting point: Inventory Matching without Privacy

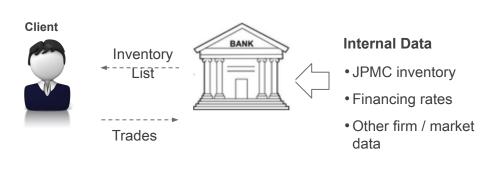
Inventory Matching Process:

- JPMC Prime Brokerage desk publishes daily a list of inventory at a discount to clients
- Inventory includes a list of symbols, sides, volumes, rates for trades

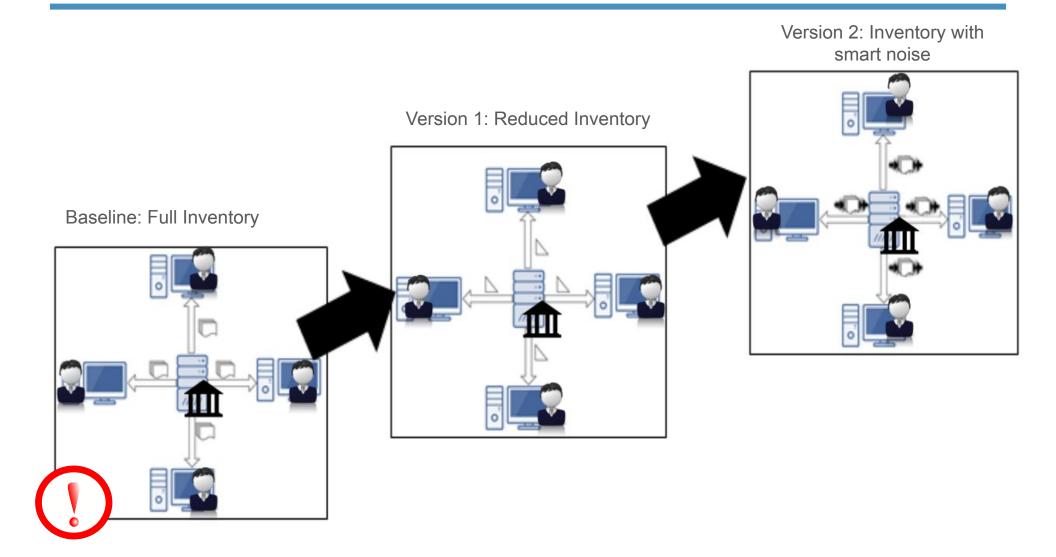
Toy Inventory List Example:

Symbol	Side	Vol.
AAPL	Long	800
MSFT	Short	200
GOOG	Long	300

 JPMC processes incoming trades chosen from the list by clients



Starting point: Inventory Matching without Privacy

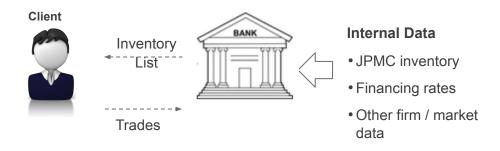


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Starting point: Inventory Matching without Privacy

Inventory Matching Process:



Problems with Inventory Matching:

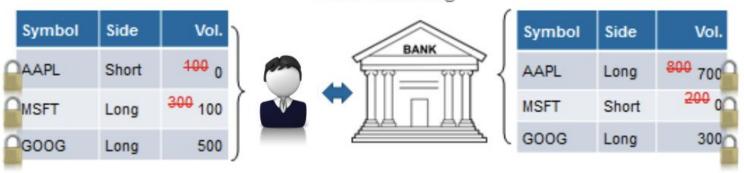
- o JPM reveals a large portion of its inventory list
- Clients raised concerns about potential leakage of their past trades included in the list
- Reduced inventory list available for matching
- o Clients do not send to JPMC their inventory!

Prime Match: Inventory Matching with Privacy

Before Matching



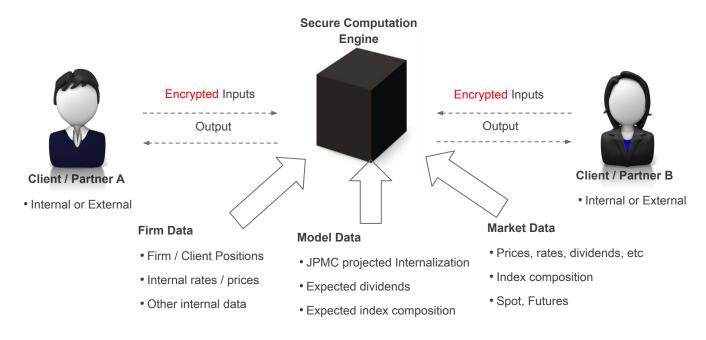
After Matching



Solution based on Secure Multiparty Computation

Overview of Secure Multi-Party Computation (MPC)

- Enables different organizations / parties / entities to perform a joint computation over their inputs (i.e. trade lists) while keeping it private
- Encryption ≠ Secure Multiparty Computation:
 - Encryption: Parties trust each other, but do not trust some external that might eavesdrop to the conversation
 - Secure Computation: Parties do not trust each other or cannot share their data, but still want to compute on their joint private inputs
- Feasibility [Yao82,GMW87,BGW88,CCD88]: every distributed computation can be computed privately



Prime Match: Inventory Matching with Privacy

Before Matching



After Matching

Symbol	Side	Vol.)	BANK	Symbol	Side	Vol.
OAAPL	Short	100 0		THE THE THE	AAPL	Long	800 700
MSFT	Long	300 100			MSFT	Short	200 00
Goog	Long	500			GOOG	Long	300

Main ingredient: New secure comparison protocol for computing the minimum between two values such as min(100,800)

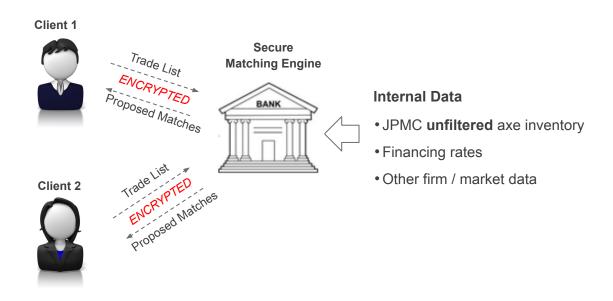
Prime Match: Privacy-Preserving Inventory Matching with 2PC

Proposed Service (via Secure Two-Party Computation)

- Client sends over their encrypted trade list
- Secure engine provides list of matching trades against its *full* inventory list

Benefits:

- More tailored trades matching exact needs of clients; increased inventory availability
- JPM is not exposed to client's trade list unless there is a match; privacy is preserved:
 - No risk of information leakage to JPMC.
 - Unmatched positions are not revealed.



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Prime Match: Privacy-Preserving Inventory Matching with MPC

Proposed Service (via Secure Multi-Party Computation)

- Client sends over their encrypted trade list
- Secure engine provides list of matching trades against its full inventory list
- Support provided to match trades against other clients

Benefits:

- More tailored trades matching exact needs of clients with the ability to internalize across multiple clients; significantly increased inventory availability
- JPM is not exposed to client's trade list unless there is a match; privacy is preserved:
 - No risk of information leakage to JPMC.
 - No risk of information leakage to other clients.
 - Unmatched positions are not revealed.

Toy Example:

Symbol	Side	Vol.
AAPL	Short	100







Symbol	Side	Vol.
AAPL	Long	0
AAPL	Short	0

Symbol	Side	Vol.
AAPL	Long	500

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Prime Match: Privacy-Preserving Inventory Matching with MPC

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Toy Example:

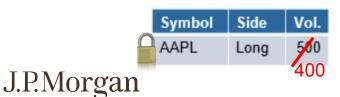
Side	Vol.
Short	100







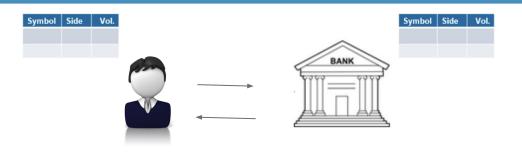
Symbol	Side	Vol.
AAPL	Long	0
AAPL	Short	0







Two-Party Secure comparison:



Three-Party Secure comparison with a third party acting as the facilitator:



New two-round secure linear comparison protocol for computing the minimum between two values with one malicious corruption; no preprocessing

Prior works: non-linear; log #round

Improved version of SecureNN [WaghGuptaChandran19]

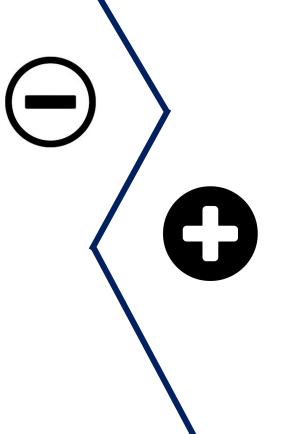
Prime Match: Pre Production and Production challenges



No financial institution had taken the initiative to implement privacy preserving auctions

Prior to Prime Match,

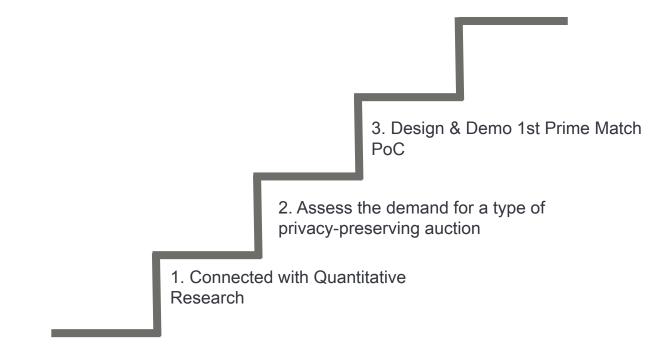
No financial institution had
ever utilized Multi-Party
Computation (MPC)
technology.



The bank **has** long-standing clients

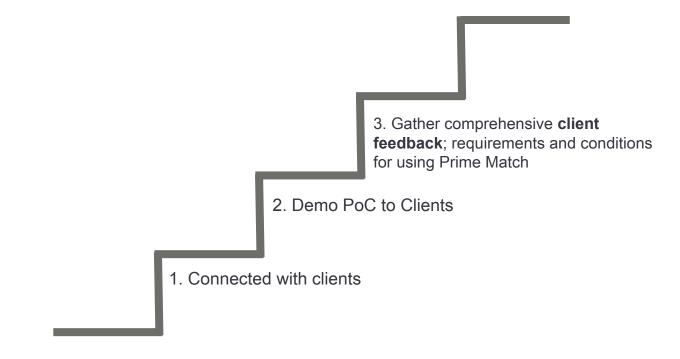
Prime Match: Proof of Concept (PoC) Challenges





Prime Match: Pre-Production Challenges

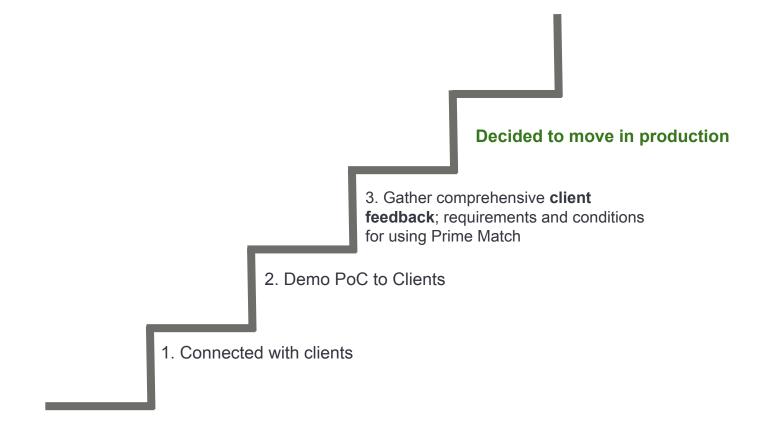




Prime Match: Pre-Production Challenges



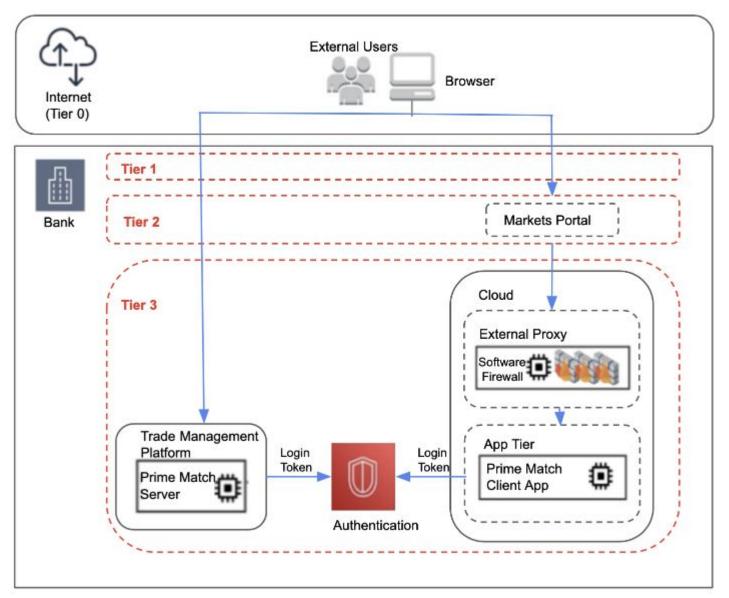
Given the innovative nature of the product, the green light for production was given after a long process



Prime Match: Client Requirements

- No communication with other clients, only communication with the bank
- No heavy installation of code on client's machines a web-based application was required
- Client computation should be minimal
- No resources for preprocessing data
- Stronger security guarantees than semi-honest security
- Peer review of the solution
- Frequent auctions

Prime Match: Tech Challenges - Architecture

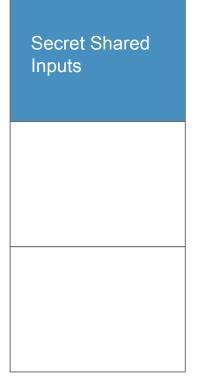


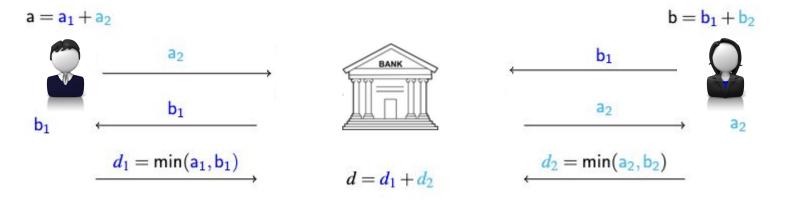
Prime Match: Cryptographic Solution

Three-Party Secure comparison with a third party acting as the facilitator:



Three parallel executions



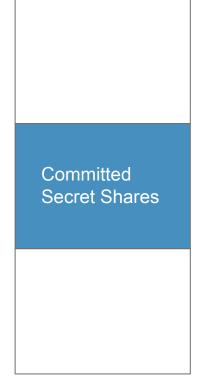


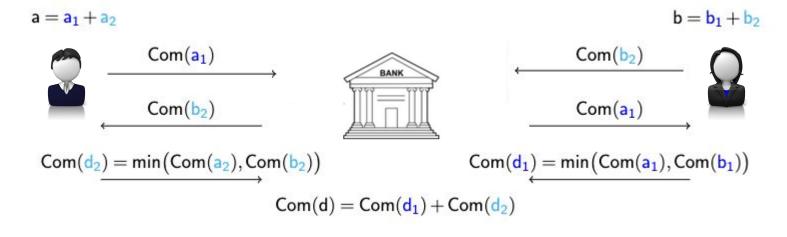
New **two-round** secure **linear** comparison protocol

Three-Party Secure comparison with a third party acting as the facilitator:



Three parallel executions





New **two-round** secure **linear** comparison protocol

Three-Party Secure comparison with a third party acting as the facilitator:



Registration phase + Three parallel executions

Openings of Committed Shares

New **two-round** secure **linear** comparison protocol

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Prime Match: High Level Solution

Registration Phase: Need for committed computation

Matching Phase: web based support → low round complexity and communication

Improved version of SecureNN [WaghGuptaChandran19]

High level of Comparison (min) circuit: (output 1 if any di=0)

 \Box P_0 , P_1 compute shares of:

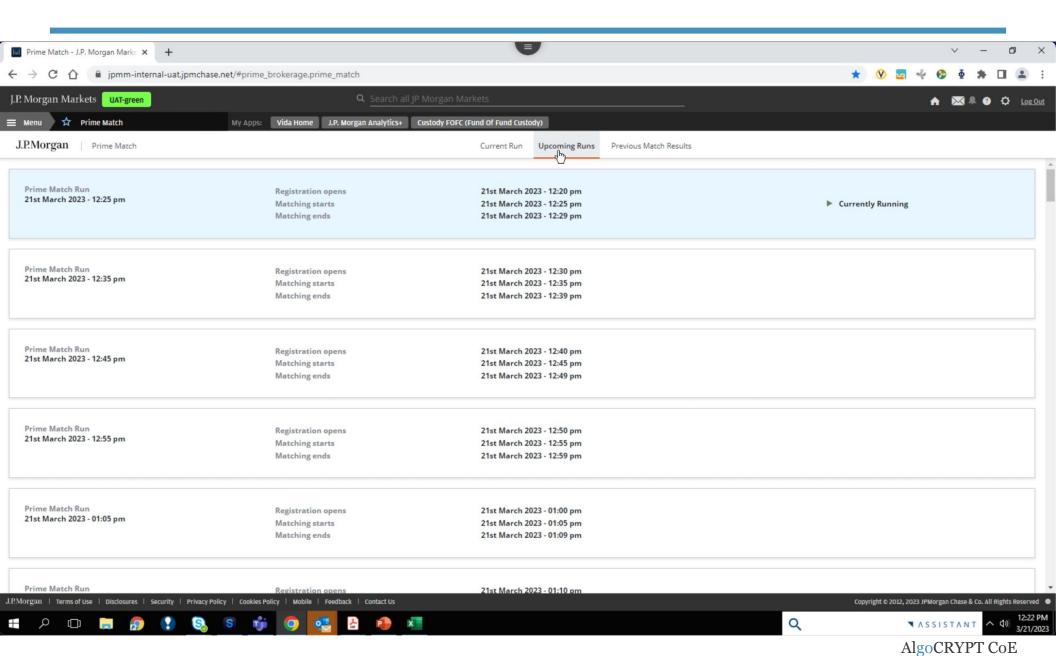
$$c_i = 1 - a_i + b_i + \sum_{j>i} r_j (a_j - b_j)$$

- P_0 , P_1 send to bank shares of $s_i * c_i$
 - Bank reconstructs $\frac{d}{d} = s_i^* c_i$ and outputs 1 (a>b) if any $s_i^* c_i = 0$

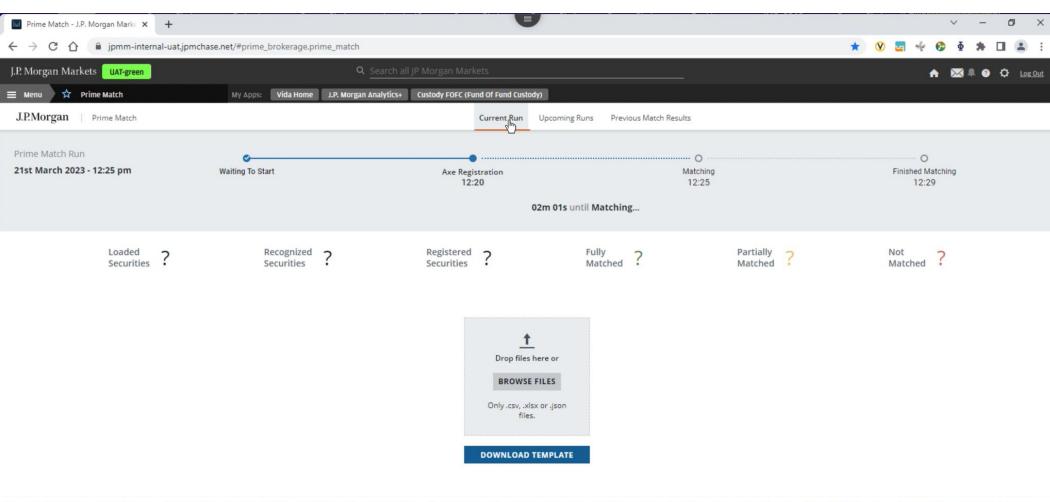
Demo

Prime Match Demo: Auction Runs

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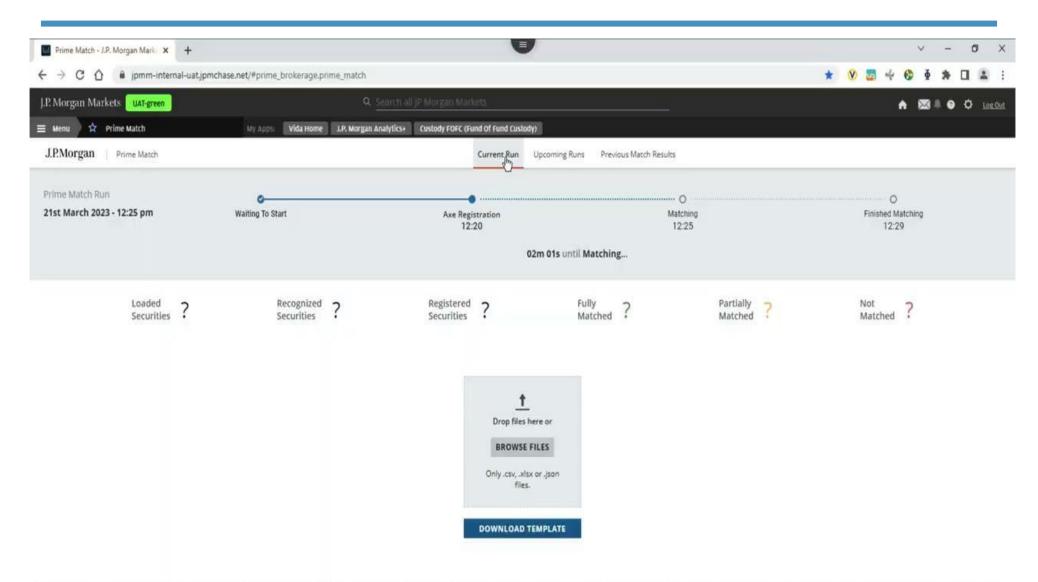


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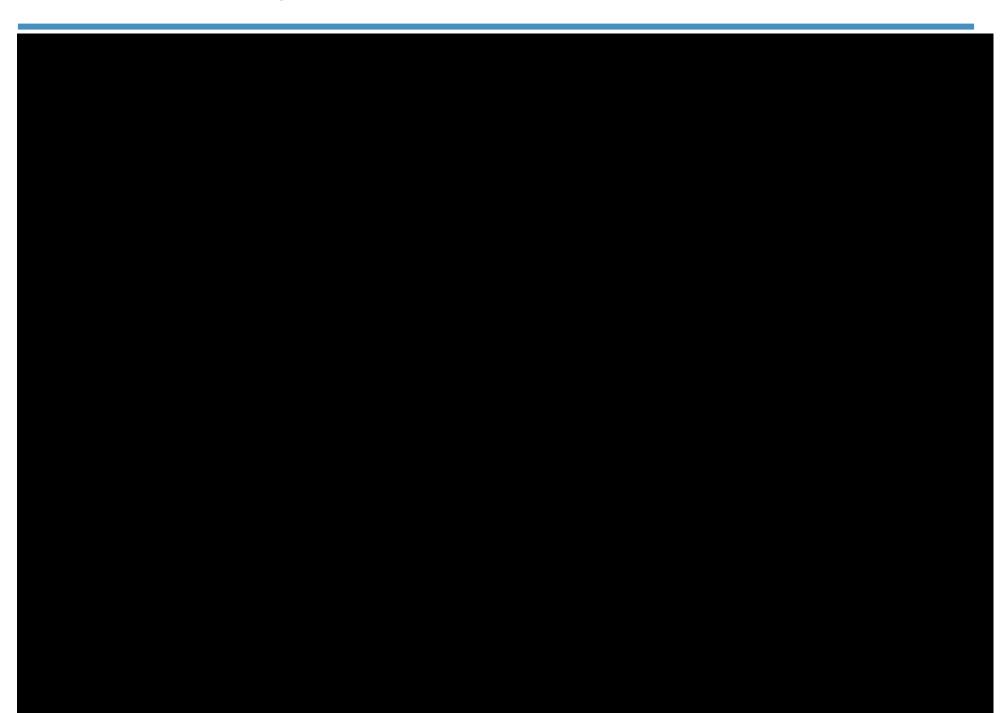
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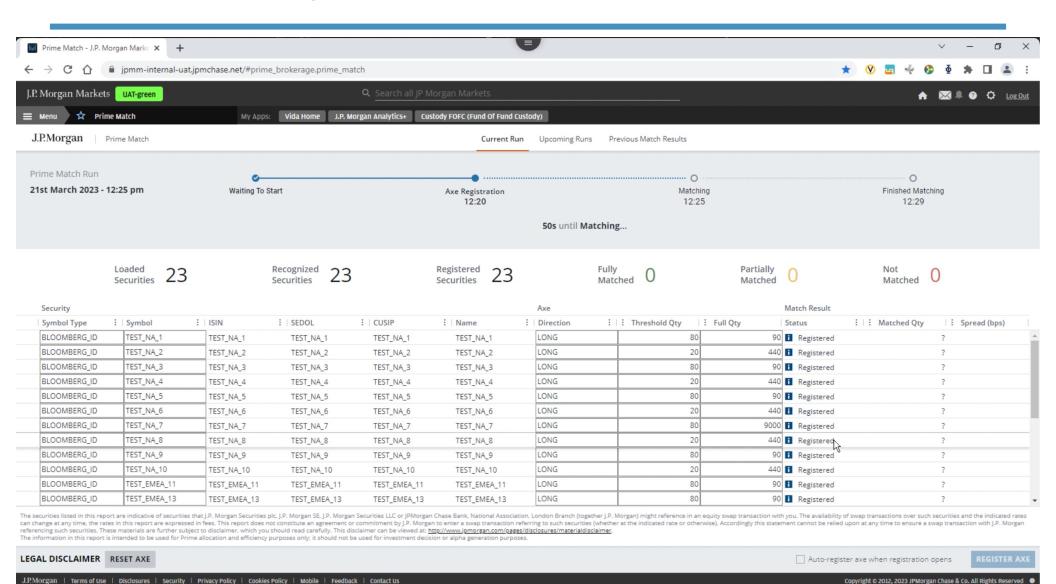




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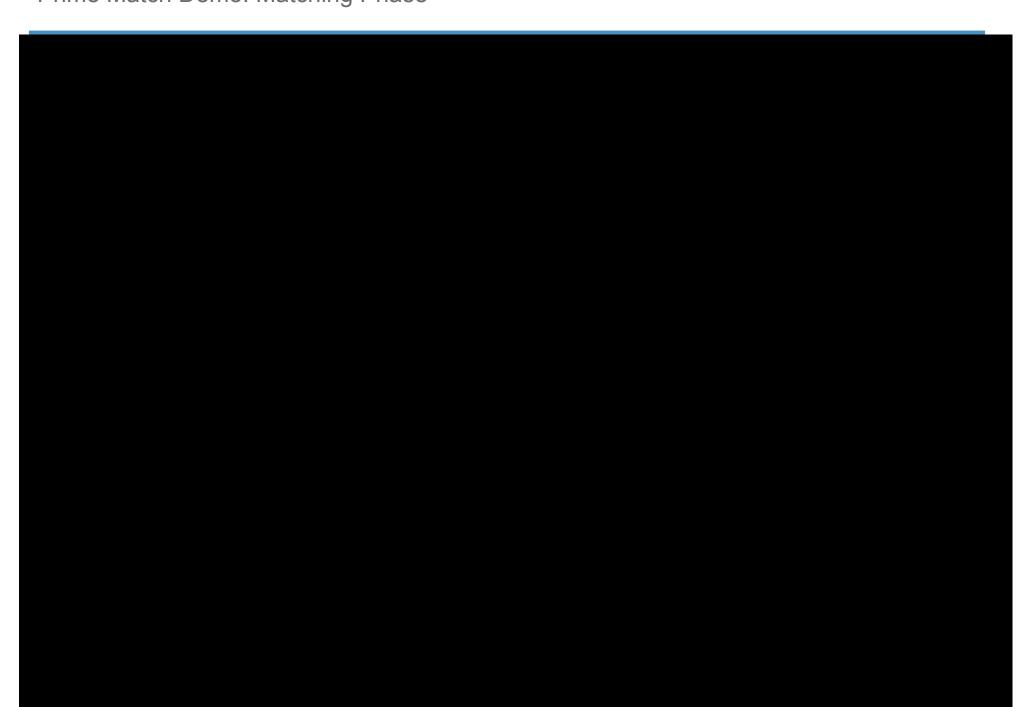


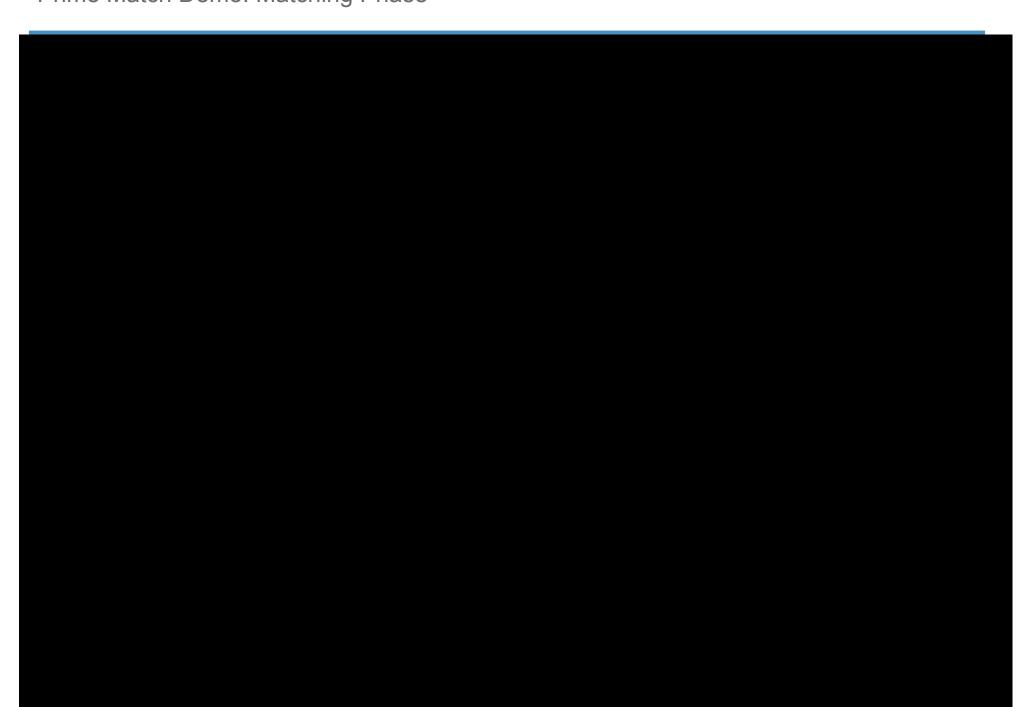
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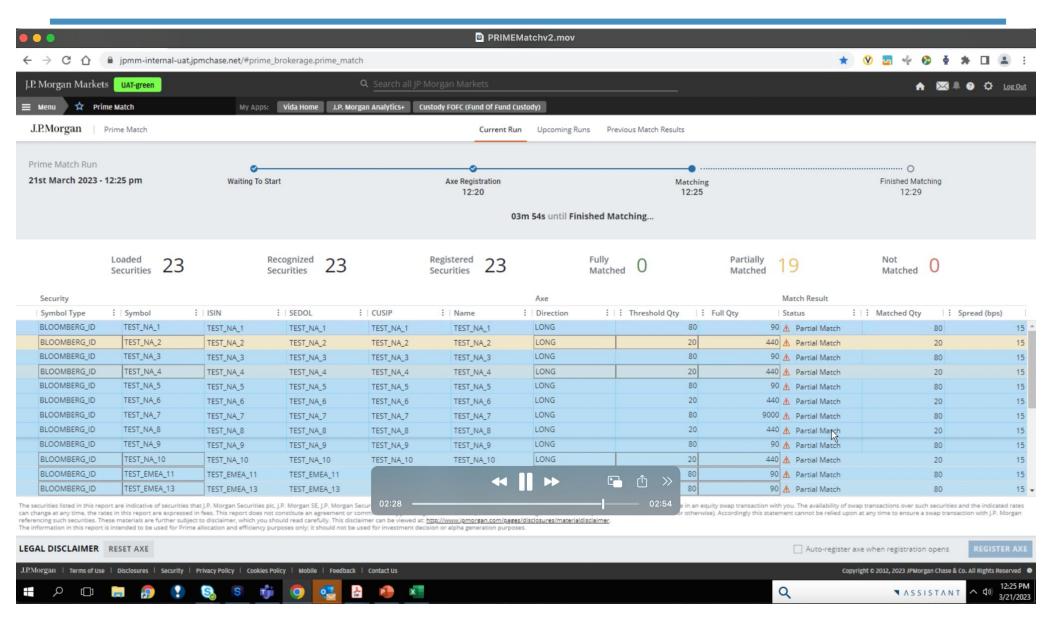
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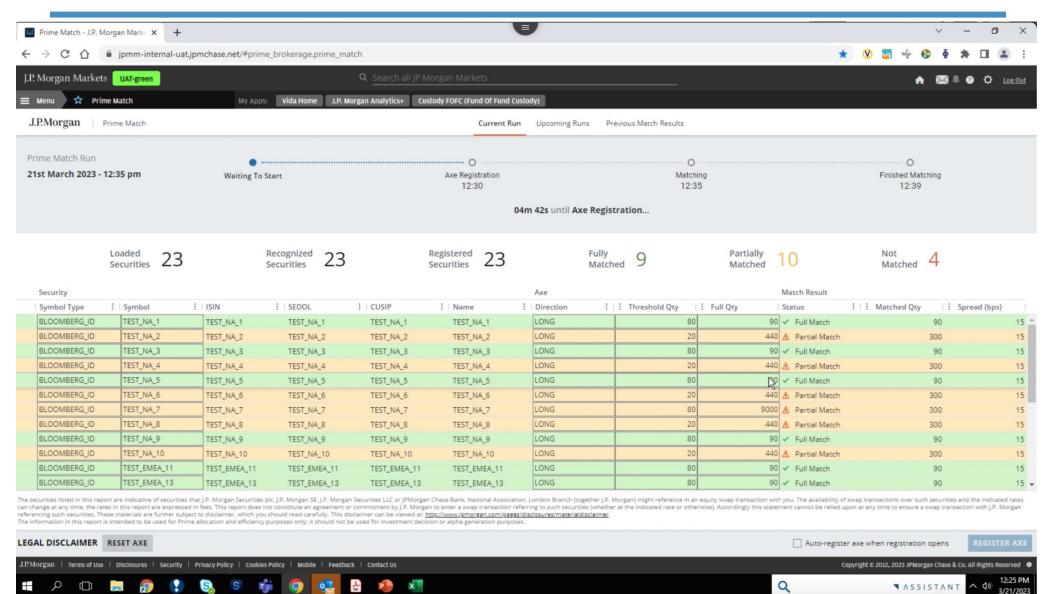






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Conclusion

- Identified a real-world problem for MPC in which the privacy of the previous inventory matching procedure can be significantly enhanced
- Prime Match protocols—bank-to-client inventory matching and client-to-client inventory matching—completely replace the current method which not only leaks information but also fails to identify potential matches
 - Our protocols are novel and customized to the particular use case being addressed (privacy preserving auctions)
- At the core of our matching engine lies a new two-round comparison protocol that minimizes interaction and requires only linear operations.
- Prime Match protocols are implemented and run live for the first time, in production, by a major bank in the US – J.P. Morgan.

Conclusion and Future Work

Future work:

- 1. **Fair matching t**hat ensures no single client can monopolize the majority of the inventory.
- 2. Extend MPC for:
 - 1. Privacy preserving darkpools
 - 2. Privacy preserving portfolio optimization

Prime Match: A Privacy Preserving Inventory Matching System





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Thank you!

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antigoni.polychroniadou@jpmorgan.com antigonipoly@gmail.com RWC 2023 video:

