

#### Introduction: What Does FinTech Do?

## Raise your hand if you don't have PayPal account

- Is it a Pmt Processor (buyer-seller)?
- Is it banking?
- Is it lending?
- Mobile platform?
- Merchant/Mktplace Integrator?
  ... Blockchain?

- ... P2P Payments?
  - ... Global / Cross-border?
  - ... Multi-Brand?
  - ... Social Media?

The answer depends on Product, Brand, Jurisdiction/Geo...







Braintree

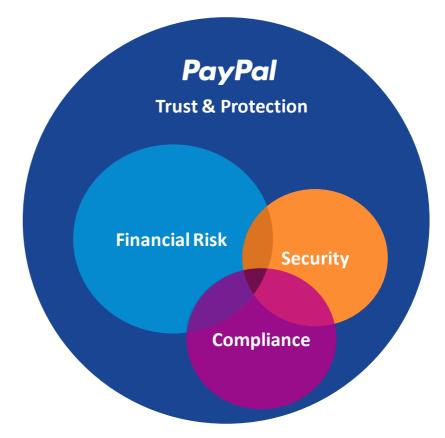






## User Experience (UX) Defines FinTech Success

- Block fraud...
- ...with low False Positives (don't block good folks!)
- Buyer and Seller Protections
- Customer financial data not shared with merchants
- Regulatory Compliance => Customer Safety
- > PayPal brand promise starts with trust...
- Customer intent
- Sentiment
- Reduce friction:
  - Customer support and conflict resolutions
  - Account opening enrollment
  - Offers that make sense
- And enhances UX from acceptance to delight



## Consumers Trust PayPal to Help Protect Their Information and Transactions

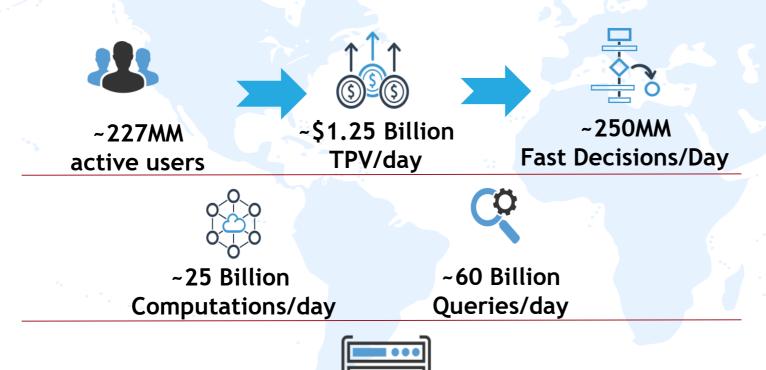
Sources: Nielsen, Dept of Commerce, JP Morgan; PayPal & IPSOS Study Feb 2015; Symantec, Gemalto, LexisNexis





## UX Delivered with Velocity and Scale

## Supported by multi-billion dollar decisions everyday



#### Facts and numbers:

- PayPal in more than 200 countries and regions.
- Secure Payments: \$451 Billion global transaction volume in 2017
- Incoming fraud pressure markedly exceeds company revenues
- Sophistication of the modern day hacker attacks: distributed; highvelocity
- Compliance and Privacy: AML,
  Prevention of prohibited activities,
  KYC, PII protection





~150 PB Data

## Automated Decisioning is PayPal's Competitive Advantage

**Key Differentiating Capabilities** UX Amazing Customer Experiences Story-based data analytics Top-notch data

Risk Big Data (100 of 150 PB)

sciences practice

Our homegrown E2E platform





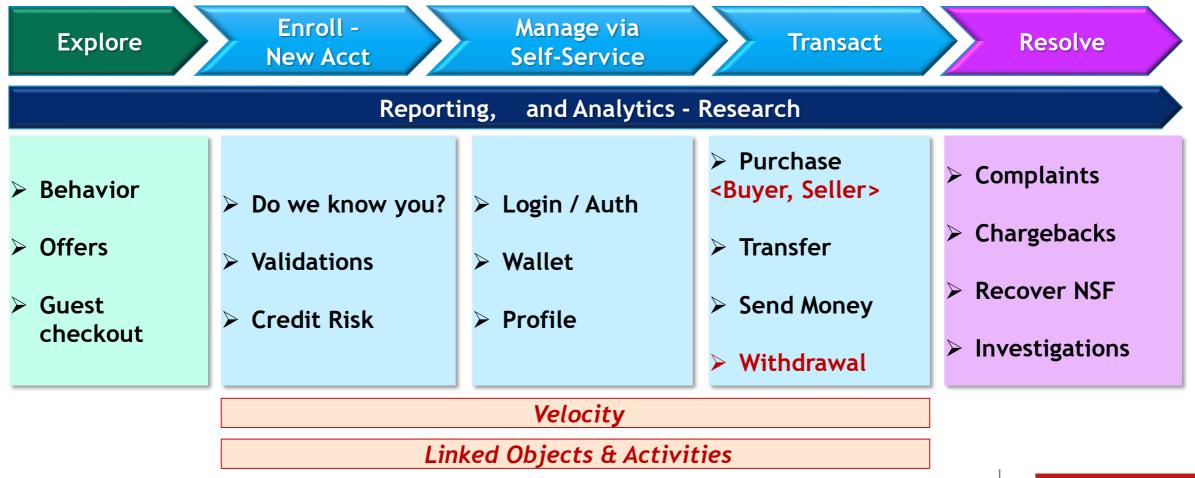
# Use Cases: ML for Fraud Prevention





## Carrying Risk of Transactions: Decisions at Checkpoints

Each payment transaction is a customer's story







#### Merchants: a World of Additional Checks

#### Representative Merchant Evaluation Criteria

- Merchant -Business Solvency
- Customer satisfaction Items Not Received; Significantly Not As Described
- > True Industry; Prohibited Goods Merchant Category Codes MCC
- Revenue rate of change:  $\frac{d Revenue}{dt}$ ; fast growth / wild fluctuations?
- Linking; Compliance AML (collusion)
- Partnership / Marketplace specific





#### What Data Do We Process?

#### Types of data affect choice of modeling methods and frameworks

Manage via Enroll -**Explore Transact** Resolve Self-Service **New Acct** Structured data... Numbers Dates Strings • Geo, ... |Features| + Unstructured data Voice - IVR Text - emails, customer interaction records *Images* ChatBot Social media





## **Production Platform: Real-Time Inference At Scale**

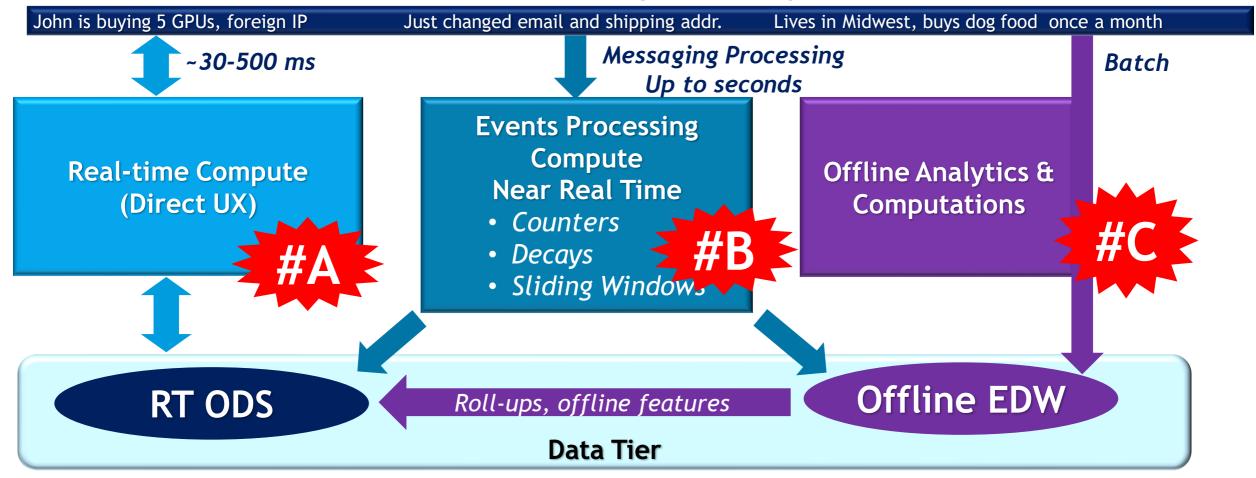




#### Three Velocities of the Data Flows

## ML: DEPLOY ANYWHERE

#### Choice of flow to execute ML models (inference) – in #A, or #B, or #C







## A Story of a Payment: Serving Decisions at Checkpoints



Y/N, or Action Decision for a Checkpoint ~75% calls at < 50ms; deep inspections can be ~500ms

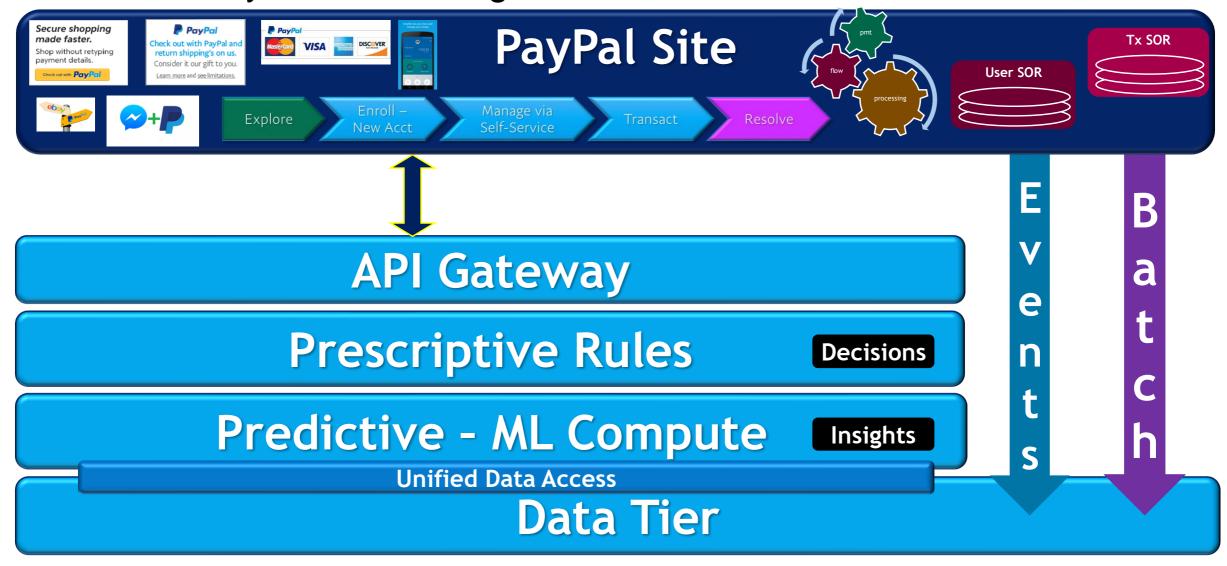
## **Decisioning Platform**

Fail-Open or Fail-Close? - ask Biz & Compliance





## The Anatomy of Decisioning







## **How to Manage Data?**





#### **Data Tier**

#### Types of data stores

Real-time ODS

ORACLE

∢EROSPIKE

#### Data Stores

Near-Real Time Streaming; Big Data NoSQL







**Enterprise Data Warehouse** 





- ~1% data volume (1PB)
- NoSQL in-mem: < 1ms at 95%; < 4ms</li> at 99th. Not real ACID, not SOR => rigor to restore readiness and redundancy
- Oracle: 24 nodes main cluster -ACID, RDBMS
- ~30 billion queries/day (Decisioning)

- **Emerging needs for Big** Data at (relatively) fast speed (e.g. raw event history).
- Considerations:
  - Key space
  - Read or Write optimized?

- ~99+% data volume
- 5 billion messages/day through Kafka (online to offline data flow), which is 100 to 150 TB of data
- ~100pb data in DW

Cloud Appeal, but Beware of Compliance, Privacy.

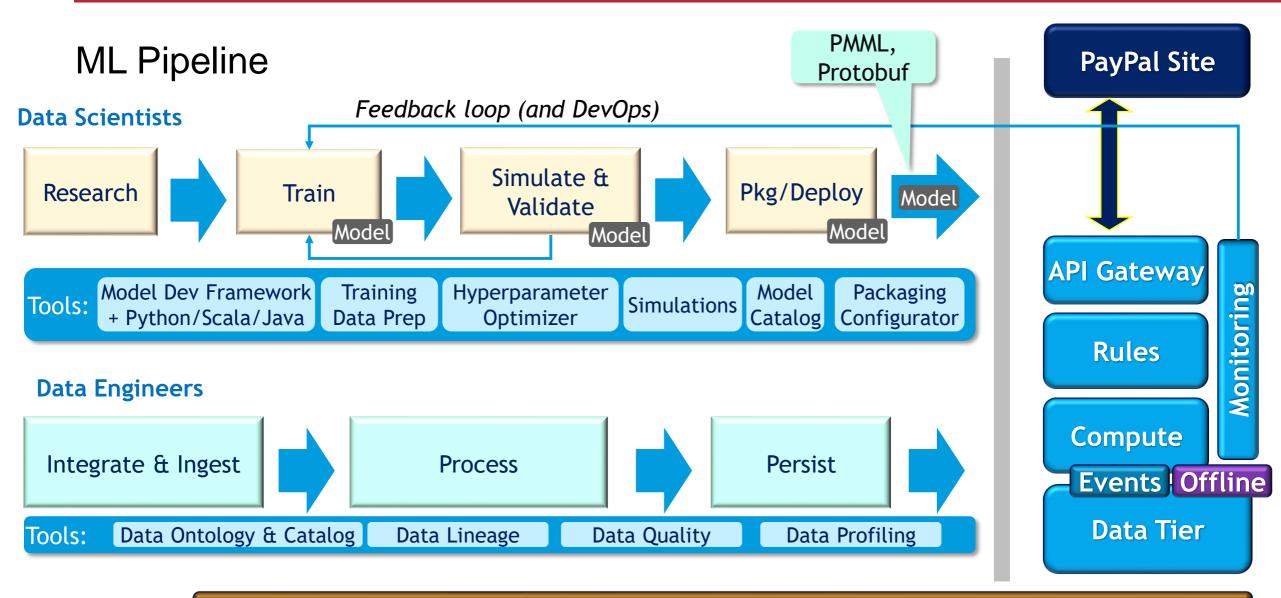




#### **Model Development Process and Roles**







**Infra Engineers** 

Elastic Intelligent Infrastructure: GPU, TPU; large RAM





#### **Conclusion**





## **Takeaways**

- Decide on type of modeling. Define business metrics
- Architect for end-to-end, agile model lifecycle
  - Agnostic to Framework/Language/Product
- Know (and manage) your data
- Decide in which flow to conduct ML inference
- Automate! And offer self-service

The journey continues ...





## **Thank You!**

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