



# On the Anonymity of Banknotes

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#### **Motivation**



- Euro banknotes to embed RFID-chip by 2005?
  - Reading serial numbers without optical contact
  - Makes tracking easier
  - Improves blacklisting
- Our work does not depend on such RFID-chips
  - Required "technology" is already available/installed



#### **Attack Scenario**



- Attacker: Bank as "Local Passive Adversary"
  - Observes withdrawals & deposits
  - Stores serial numbers
    - OCR or RFID
  - Not unrealistic in the real world...
- Goal: Deanonymization of some low value payments



# **Traceability of Banknotes**



- Token based payment system
  - Unique serial number
  - Unforgeable: difficult to copy
- Level of Anonymity?
  - Handing on banknotes is unobservable





# **Intermediary Chains**

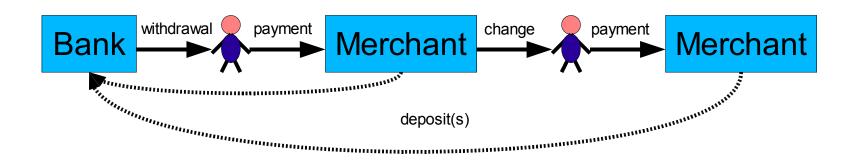


### Withdrawer Anonymity

- Blackmailing
- Money theft (Bank robbery)

## Depositor Anonymity

- Money laundering





# **Criminal Investigation**

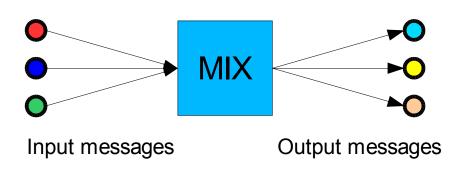


- Restricting Withdrawer Anonymity
  - "Perfect Crime" based on untraceable (electronic) cash
  - Limited traceability (blacklisting) required
  - RFIDs may simplify blacklisting
- Restricting Depositor Anonymity
  - Strong traceability required?



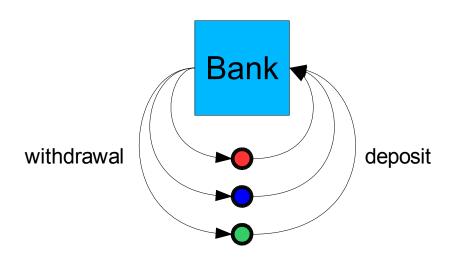
#### **Relation to MIX-Networks**





#### Linkability:

- Intersection Attacks
- Deanonymization over time



#### Linkablility:

- Sets of Banknotes
- Deanoymization possible?



#### **Linked Banknotes**



- Set of linked banknotes
  - Banknotes that a person has withdrawn recently
- Bank sets up a database
  - Store serial numbers at withdrawal
  - Check for sets of linked banknotes at deposit

Basic Idea: Use linked sets to find short intermediary chains



#### Model



#### Merchants

- Cash Desk Model
- Last in first out
- Return small subset as change to customer
- Keep sets at deposit

#### Customers

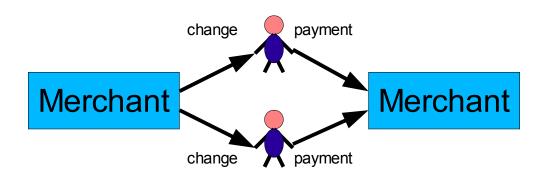
- Wallet Model
- Random selection
- Valid for low denominated banknotes



#### **Limitations of the Model**



- Customer to Customer transactions (Pocket Money)
- Merchant to Merchant transactions
- Even more complicated cases:





# **Deanonymization**



- The bank receives a set of linked banknotes from Merchant M
  - A: Withdrawer spent those banknotes at M
  - B: Withdrawer spent those banknotes at N, another customer received them as change and spent them at M
- Probability of Event B ???
  - Reject hypothesis (A), if P(B) > t



#### **Wallet Model**



- X: # linked banknotes used for a payment
- Y: # linked banknotes in the customer's wallet
- U: total # banknotes used for a payment
- V: total # banknotes in the customer's wallet

Probability to pay with i linked banknotes:

$$P(X=i|Y=j\cap U=n\cap V=t) = \frac{\binom{j}{i}\binom{t-j}{n-i}}{\binom{t}{n}}$$



#### Cash Desk Model



- Observation: Only a small number of (linked)
   banknotes are returned to the customer as change
  - E(Y) = c empirically determined
  - Independent of the merchant

Probability to receive j linked banknotes as change:

$$P(Y=j) = \frac{c^{j}}{j!} \exp^{-c}$$



# **Probability of Event B**



- s: # of linked banknotes in deposit
- m: max. # of banknotes returned as change
- c: average # of banknotes returned as change

Probability of event B:

$$P(s \leqslant X \leqslant n \cap Y \leqslant m | U = n \cap V = t) = \sum_{i=s}^{n} \sum_{j=i}^{m} \frac{\binom{t-j}{n-i}}{\binom{t}{n}} \frac{c^{j}}{i!(j-i)!} \exp^{-c}$$



# **Deanonymization**



- Intuitively: a deposited linked set of size > 2 is not anonymous
- Example
  - Change: avg. 2, max. 5
  - Deposited set of size 3

total wallet	total payment	P(B)
6	5	0.22
5	5	0.48
5	4	0.27

$$P(V=t|Y=j\cap U=n)=?$$



# How to Use Banknotes Correctly



- Avoid using sets of linked banknotes for payments
  - Withdrawal:
    - Single high denominated banknote
    - Use for one (non-anonymous) low value payment
    - Change is anonymous
  - Payments with non-anonymous banknotes:
    - Use as few banknotes as possible
    - Avoid recurring payments at the same (or a related) merchant



#### Conclusion



- On the negative side:
  - Banknotes are more traceable than one would expect
  - Deanonymization can be circumvented
- On the positive side:
  - Powerful tool for criminal investigation?
  - Difficult to circumvent deanonymization