

# Predicting Performance in Large-Scale Identification Systems by Score Resampling

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### **Problem Statement**

#### **Test system**

Number of users: 
$$G_T = 100$$

$$x(1)$$
  $y_1(1)$   $y_2(1)$  ...  $y_{G_T}(1)$ 

$$x(2)$$
  $y_1(2)$   $y_2(2)$  ...  $y_{G_T}(2)$ 

··· i-th test identification trial  $(x(i) \quad y_1(i) \quad y_2(i) \quad \dots \quad y_{G_T}(i))$ **Genuine Scores Impostor Scores** 

#### **Predicted system**

$$G = 3000$$

$$x(j)$$
  $y_1(j)$   $y_2(j)$  ...  $y_G(j)$ 

Need to estimate <u>correct identification rate</u>:

$$CIR = P(x(j) > \max_{1 \le k \le G} y_k(j)) = ?$$

- Predicting performance in *closed set identification systems*
- NIST BSSR1 score set used in experiments



## **Analysis of previous approaches**

• Score Mixing Effect

Action: 
$$x(i) \quad y_1(i) \quad y_2(i) \quad \dots \quad y_{G_T}(i)$$

$$x(k) \quad y_1(k) \quad y_2(k) \quad \dots \quad y_{G_T}(k)$$

Mix scores from different test identification trials during prediction (e.g. to estimate impostor score density)

Effect:

- assumption of iid genuine and impostor score from different trials (usually not true)
- underestimation of CIR
- Binomial Approximation Effect

Action: try to approximate

$$CIR = \int_{-\infty}^{+\infty} N^{G}(t) m(t) dt$$

cumulative distribution function of impostor scores

density of genuine scores

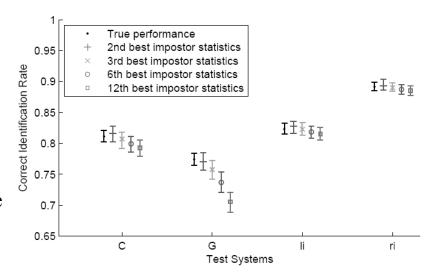
Effect:

- small errors in estimating N(t) lead to large errors in  $N^G(t)$
- overestimation of CIR



## **Proposed approach**

- Score Resampling
  - basic simulation of larger identification system workflow
  - genuine and impostor scores are chosen from available test scores
- No binomial approximation effect
- Able to control score mixing effect
  - significantly less score mixing is needed than for binomial approximations
  - mix scores only from similar test identification trials
  - determine similarity of identification trials by properly chosen statistics
  - -nth order statistics seems to be appropriate for most matchers





- Simple approach for predicting identification system performance
- Lesser requirements on test data than for binomial approximation based methods
- Theoretically justified (larger version of the paper)
- Precise (depending on properly chosen statistics for score mixing)
- Easily extended for predicting performance in open set identification systems