



Irreversible Fingerprint Template

using Minutiae Relation Code with Bloom
Filter

Northwestern

Presenters:

Haikun Liu

hlg483

Ke Wang

kwp862

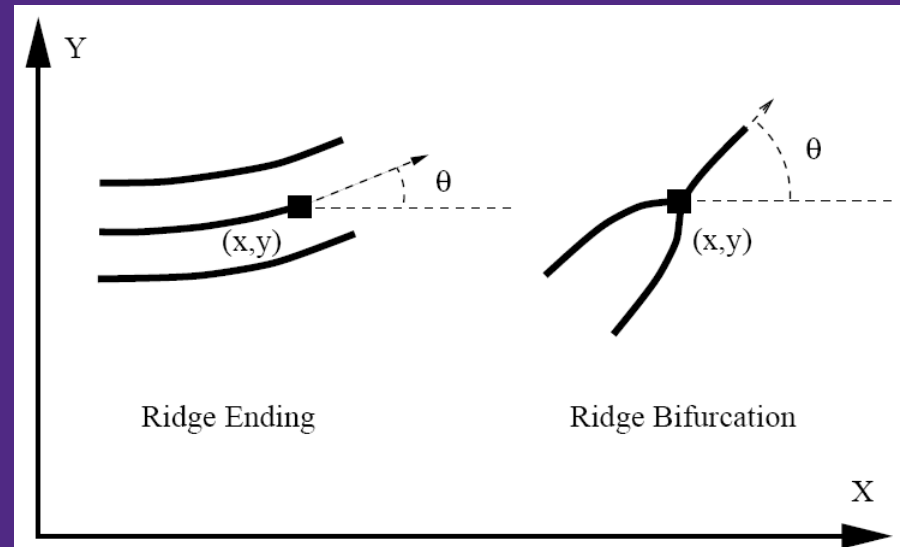
Weishen Chu

wci004

What is minutiae



- Minutiae:
 - Local ridge characteristics
 - Ridge ending and ridge bifurcation



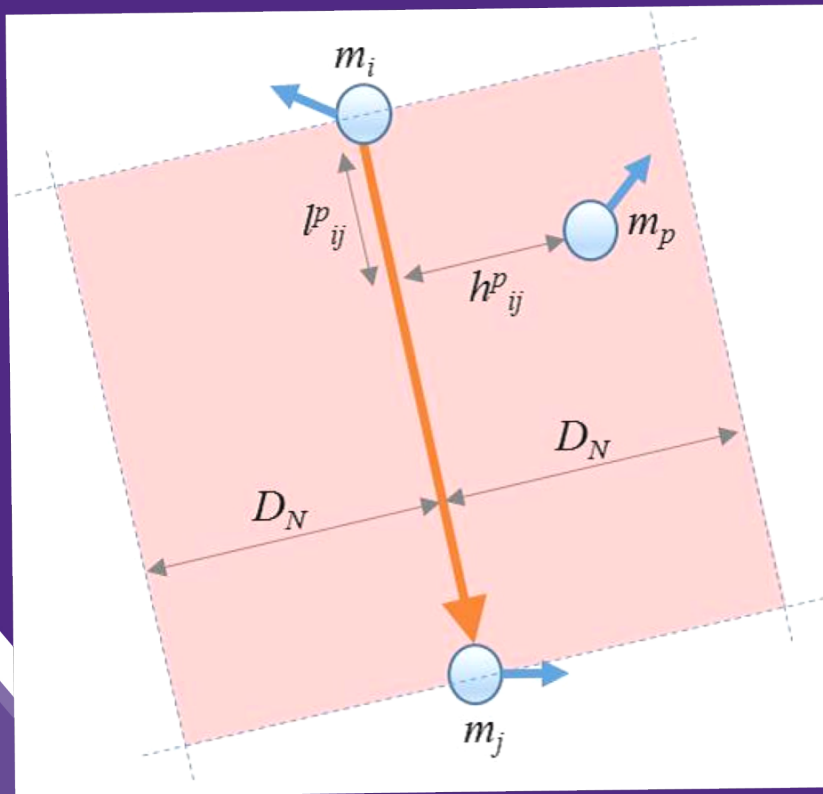
Irreversible template creation technique

- Minutiae Relation Code(MRC)
 - Describe the minutiae information efficiently
- Bloom Filter
 - realize the irreversibility feature

Irreversible template creation technique

- MRC consists of a set of vector-represented relation information between arbitrary minutiae, which enables to create a useful fingerprint template by handling boarder minutiae and isolated minutiae efficiently

How to construct MRC



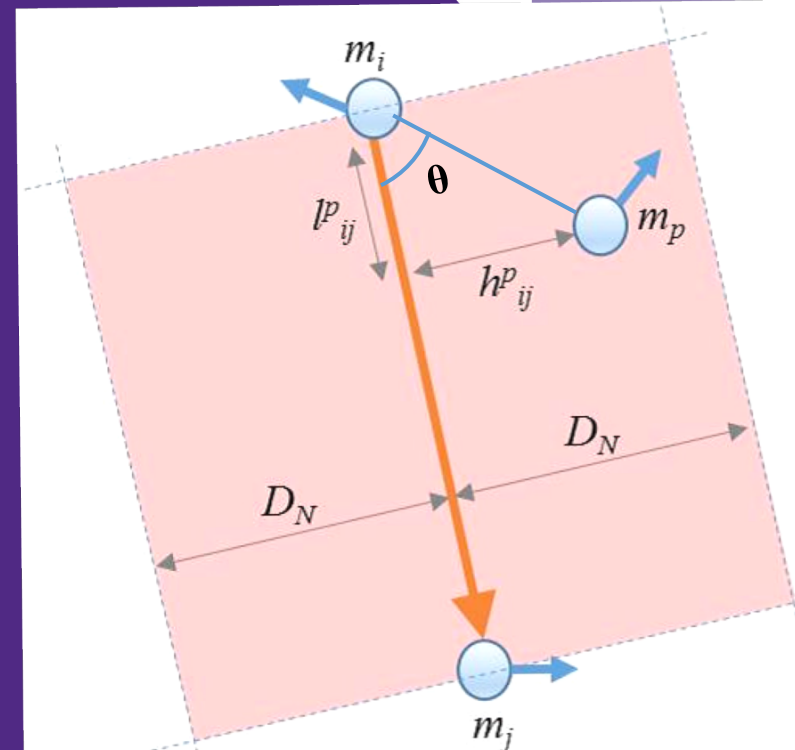
$$m_i = (x_i, y_i, \theta_i)$$

$$h_{ij}^p = \frac{|\mathbf{v}_{ip} \times \mathbf{v}_{ij}|}{L_{ij}}$$

$$l_{ij}^p = \sqrt{L_{ij}^2 - h_{ij}^p{}^2}$$

How to construct MRC

- h_{ij}^p and l_{ij}^p
- N_S – the number of divided space information
- N_D – the number of divided direction information
- S_{nm}^l — a set of neighbor minutiae on the left
- S_{nm}^r — a set of neighbor minutiae on the right
- MRC represents an $N_S \times N_D$ matrix



$$lMRC_{ij}(s, t) = \sum_{p \in S_{nm}^l} f(s, l_{ij}^p, \sigma_S) \cdot f(t, h_{ij}^p, \sigma_D)$$

$$rMRC_{ij}(s, t) = \sum_{p \in S_{nm}^r} f(s, l_{ij}^p, \sigma_S) \cdot f(t, h_{ij}^p, \sigma_D)$$

$$f(x, c, \sigma) = \exp\left(-\frac{(x - c)^2}{2\sigma^2}\right)$$

$$0 \leq s < N_S, 0 \leq t < N_D$$

How to construct MRC

- C_{energy} – summation value of MRC_{ij}
- N_{norm} – normalization factor
- th – bit-quantization threshold

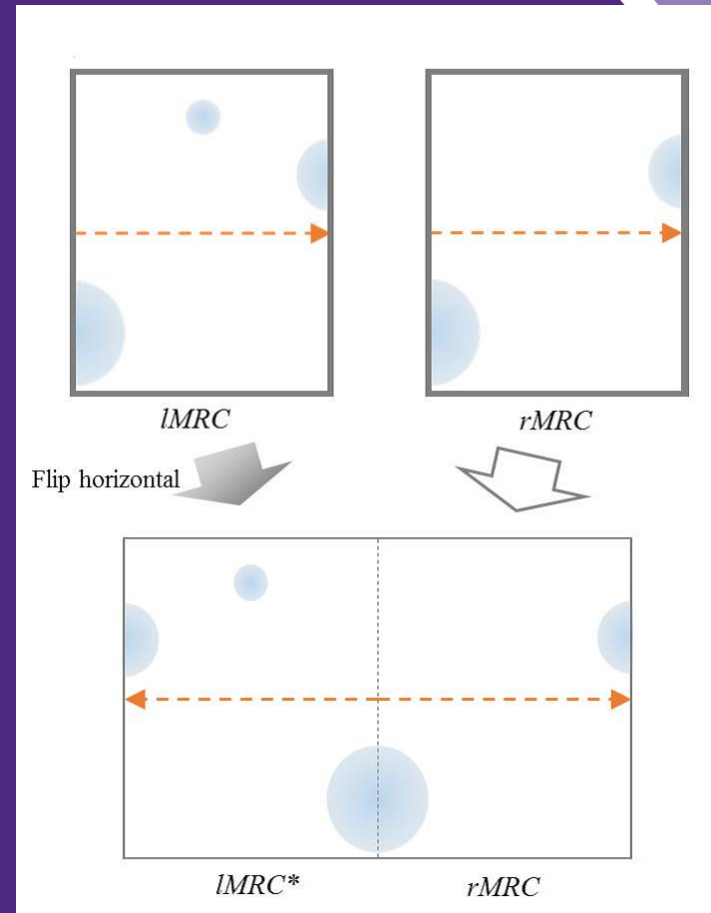
$$bMRC_{ij} = \begin{cases} 1 & MRC_{ij} \cdot N_{norm} / C_{energy} > th \\ 0 & MRC_{ij} \cdot N_{norm} / C_{energy} \leq th \end{cases}$$

- In order to avoid ambiguous relations
- Introduce the limitation on the distance between a minutiae pair

$$A = \{(i, j) | L_{min} < L_{ij} < L_{max}\}$$

- A template T of the image I can be described by the following:

$$T = \{i, j, L_{ij}, MRC_{ij}\}_{i,j \in A}$$



$$MRC_{ij} = [lMRC^*_{ij} | rMRC_{ij}]$$

How to calculate similarity between MRCs

- $F_{fd}(MRC_{ij}, MRC_{uv})$
 $= \sum_{s=1}^{N_S} \sum_{D=1}^{N_D} |MRC_{ij}(s, t) - MRC_{uv}(s, t)|$
- *vote_score_table(vst)*
 - Tabulate voting counts
 - $N_S \times N_D$
- *feature_score_table(fst)*
 - Store the minimum MRC distance
 - $N_S \times N_D$

Algorithm 1 Calculate a *vote_score_table* and a *feature_score_table*

```
vst  $\leftarrow$  0
fst  $\leftarrow$  max_value
for all  $i, j, u, v$  such  $abs(L_{ij}^1 - L_{uv}^2) < D_R$  do
     $[i, j, u, v] \leftarrow [i, j, u, v | \min(F_{fd}(MRC_{ij}^1, MRC_{uv}^2))]$ 
    min_score  $\leftarrow F_{fd}(MRC_{ij}^1, MRC_{uv}^2)$ 
    vst( $i, u$ )  $\leftarrow$  vst( $i, u$ ) + 1
    vst( $j, v$ )  $\leftarrow$  vst( $j, v$ ) + 1
    fst( $i, u$ )  $\leftarrow$  min(fst( $i, u$ ), min_score)
    fst( $j, v$ )  $\leftarrow$  min(fst( $j, v$ ), min_score)
end for
```

How to calculate similarity between MRCs

- vst_k – sort vst with respect to vote scores
- fst_k – consist of feature scores related to minutiae pairs with the smallest distance

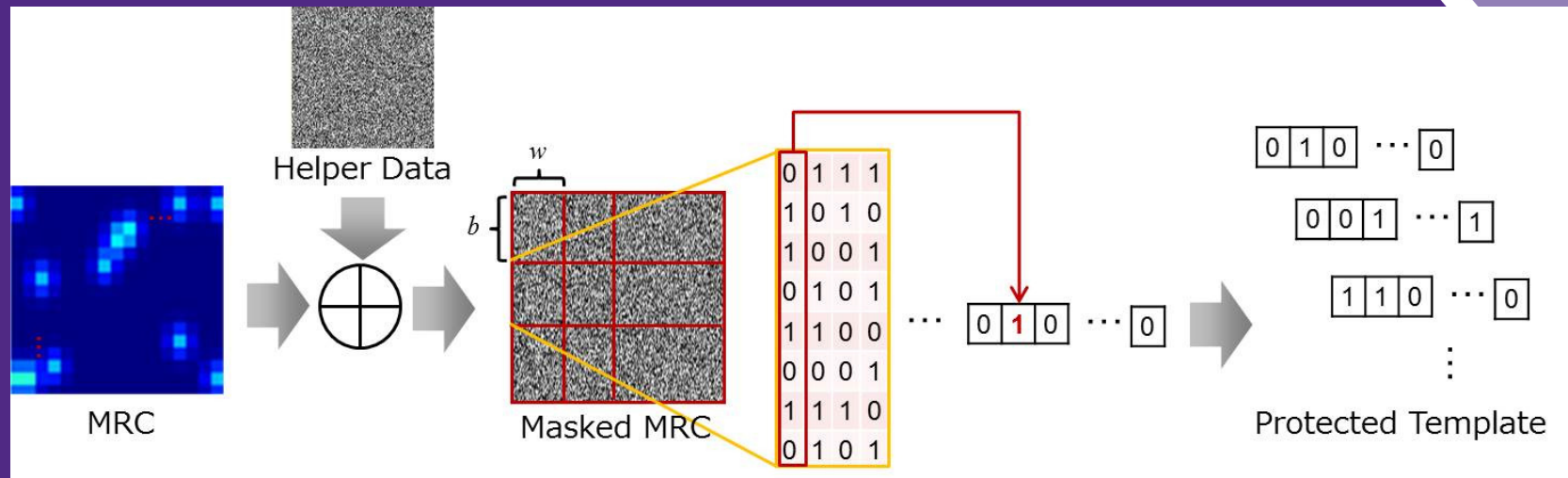
- $$vs = \frac{\sum_{k=1}^K vst_k}{n_v K} \quad fs = \frac{\sum_{k=1}^K fst_k}{n_f K}$$

- Where n_v and n_f represent normalization factors
- K – security factor
 - K becomes greater, the number of minutiae pairs between a template and an input data must be large for an appropriate authentication
 - value K is too small, the number of minutiae pairs is not enough for an authentication which may cause a false acceptance
- $$raw_score = \alpha \cdot vs + (1 - \alpha) \cdot fs$$
- Where α is a weight to adjust the combination of vs and fs , raw score is lower if the two templates are similar with each other

Bloom Filter

- Contributes to the irreversibility of proposed scheme
- Has dimension reduction scheme to project an item to a probabilistic data structure
- Be used as a detector of the existence of the item in the data structure

Bloom Filter



1. Create a $N_D \times 2N_s$ random matrix as helper data
2. Calculate XOR between the helper data and the original MRC as Masked MRC
3. Divide into local blocks whose size is $b \times w$
4. Each column bits(b bits) are converted to a decimal number(0 to 2^b), and set 1 to the corresponding bit in the projection structure
5. The conversion is conducted w times in each block
6. Generate $\frac{N_D}{b} \times \frac{2N_s}{w}$ converted codes
7. Store the converted codes as a protected template

Evaluations and future works

- Evaluate the authentication and security performance of MRC with Bloom Filter
 - Use public fingerprint databases: FVC2002 and FVC2004
 - The proposed method can achieve 1.8% EER in FVC2002 DB2 with 2^{49} attack possibilities
- Future works
 - Keep looking into improvements regarding the authentication accuracy of MRC, and evaluate the other aspects like the unlinkability as a template protection scheme



Thank you

Q and A

Northwestern