Supplementary Material: SQL queries for CFD^{*p*}s

Shuai Ma, Liang Duan, Wenfei Fan, Chunming Hu, and Wenguang Chen

Below we show how the SQL queries Q_i^c and Q_i^v are generated for validating CFD^{*p*}s in $\Sigma_{cfd^p}^i$, which is an extension of the SQL techniques for CFDs and eCFDs discussed in [?] and [?], respectively.

The queries Q_i^c and Q_i^v for the violations of $\Sigma_{\mathsf{cfd}^p}^i$ are given as follows, which capitalize on the data table enc_L , enc_R and enc_{\neq} that encode CFD^p s in $\Sigma_{\mathsf{cfd}^p}^i$.

- $\begin{array}{l} Q_i^c \text{: select } R_i.* \text{ from } R_i, \operatorname{enc}_L L, \operatorname{enc}_R R, \operatorname{enc}_{\neq} N \\ \text{ where } L. \operatorname{cid} = R. \operatorname{cid} \text{ and } R_i.X \asymp L \text{ and } R_i.X \asymp N \text{ and} \\ \text{ not } (R_i.Y \asymp R \text{ and } R_i.Y \asymp N) \end{array}$
- Q_i^v : select distinct X_L
- from (select *L*.cid as cid, *X_L*, *Y_R* from *R_i*, enc_{*L*} *L*, enc_{*R*} *R*, enc_{\neq} *N* where *L*.cid = *R*.cid and *R_i*.*X* \asymp *L* and *R_i*.*X* \asymp *N* and *R*.*Y* =' _') as *M* group by cid, *X_L* having count (distinct *Y_R*)> 1

Here (1) $X = \{A_1, \ldots, A_{m1}\}$ and $Y = \{B_1, \ldots, B_{m2}\}$ are the sets of attributes in LHS and RHS of $\Sigma^i_{cfd^p}$ respectively; (2) $R_i X \times L$ is the conjunction of

 $\begin{array}{l} L.A_j \text{ is null or } R_i.A_j = L.A_j \text{ or } (L.A_j = `_' \\ \text{ and } (L.A_{j>} \text{ is null or } R_i.A_j > L.A_{j>}) \\ \text{ and } (L.A_{j\geq} \text{ is null or } R_i.A_j \geq L.A_{j\geq}) \\ \text{ and } (L.A_{j<} \text{ is null or } R_i.A_j < L.A_{j<}) \\ \text{ and } (L.A_{j<} \text{ is null or } R_i.A_j < L.A_{j<}) \\ \text{ and } (L.A_{j\leq} \text{ is null or } R_i.A_j \leq L.A_{j\leq})) \end{array}$

for each $j \in [1, m_1]$; (3) $R_i \cdot Y \simeq R$ is defined similarly for attributes in *Y*; (4) $R_i \cdot X \simeq N$ is the conjunction of

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not exists (select * from N
where L.cid = N.cid and N.pos = 'LHS' and
N.att = 'A_j' and R_i.A_j = N.val)
```

for each $j \in [1, m_1]$; (5) $R_i Y \simeq N$ is defined similarly, but with *N*.pos =' RHS'; (6) X_L is the set of following attributes

(case when $L.A_j$ is not null then $R_i.A_j$ end) as A_{Lj}

for each $j \in [1, m_1]$; (7) Similarly, Y_R is the set of

(case when $R.B_k$ is not null then $R_i.B_k$ end) as B_{Rk}

for each $k \in [1, m_2]$; (8) $R.Y = '_'$ is the disjunction of $R.B_k = '_'$ for each $k \in [1, m_2]$.

Intuitively, detecting violations of CFD^ps is a two-step process. First, query Q_i^c detects single-tuple violations, *i.e.*,

- S. Ma, L. Duan and C. Hu are with the SKLSDE lab, School of Computer Science and Engineering, Beihang University, China. E-mail: {mashuai, duanl, hucm}@act.buaa.edu.cn.
- W. Fan is with the RCBD center, Beihang University, China and the School of Informatics, Edinburgh University, UK. E-mail: wenfei@inf.ed.ac.uk.
- W. Chen is with the Department of Information Management, Peking University, China.

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E-mail: chenwg@pku.edu.cn.
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the tuples t in I_i that match the LHS of a CFD^p in $\Sigma^i_{cfd^p}$, but do not match its RHS. Second, query Q^v_i finds multi-tuple violations, *i.e.*, the tuples t in I_i such that (a) there exists another tuple t' in I_i , t and t' match and agree on the LHS of a CFD^p in $\Sigma^i_{cfd^p}$, but do not agree on the RHS of the CFD^p.

Example 1: Using the coding of Fig. 4, two SQL queries for checking CFD^{*p*}s φ_2 , φ_3 and φ_4 of Fig. 2 are given as follows:

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Q_1^c: select R_1.* from item R_1, enc<sub>L</sub> L, enc<sub>R</sub> R, enc<sub>\not</sub> N
    where L.cid = R.cid and
            (L.sale is null or R_1.sale = L.sale or L.sale =' _' ) and
            not exists (select * from N
                  where N.cid = L.cid and N.pos =' LHS' and
                  N.\mathsf{att} =' \mathit{sale'} \ \mathsf{and} \ R_1.\mathsf{sale} = N.\mathsf{val} ) and
            (L.price is null or R_1.price = L.price or (L.price = '_' and
            (L.price_{>} is null or R_1.price_{>} L.price_{>}) and
            (L.price \leq is null or R_1.price \leq L.price \leq ))) and
            not exists ( select * from N
                  where N.cid = L.cid and N.pos =' LHS' and
                  N.att =' price' \text{ and } R_1.price = N.val) and
            not ((R.shipping is null or R_1.shipping = R.shipping or
            R.shipping = ' _' ) and
            not exists ( select * from N
                  where N.cid = R.cid and N.pos =' RHS' and
                  N.\mathsf{att} =' shipping' \text{ and } R_1.\mathsf{shipping} = N.\mathsf{val}) and
            (R.price is null or R_1.price = R.price or (R.price = ' \_' and
            (R.price_{\geq} is null or R_1.price_{\geq} R.price_{\geq}) and
            (R.price < is null or R_1.price < R.price < i)) and
            not exists ( select * from N
                  where N.cid = R.cid and N.pos =' RHS' and
                  N.att =' price' \text{ and } R_1.price = N.val ))
```

 Q_1^v : select distinct sale_L, price_L from (

select L.cid as cid, (case when L.sale is not null then R_1 .sale end) as sale_L, (case when L price is not null then R_1 price end) as price_L, (case when R.shipping is not null then R_1 .shipping end) as shipping_R, (case when R.price is not null then R_1 .price end) as price_R **from** item R_1 , enc_L L, enc_R R, enc_{\neq} N where L.cid = R.cid and (*L*.sale is null or R_1 .sale = *L*.sale or *L*.sale =' _') and not exists (select * from Nwhere N.cid = L.cid and N.pos =' LHS' and $N.\mathsf{att} =' sale' \text{ and } R_1.\mathsf{sale} = N.\mathsf{val})$ and (*L*.price is null or R_1 .price = *L*.price or (*L*.price =' _' and $(L.price_{>} is null or R_1.price_{>} L.price_{>})$ and $(L.price \leq is null or R_1.price \leq L.price \leq)))$ and not exists (select * from Nwhere N.cid = L.cid and N.pos =' LHS' and $N.\mathsf{att} =' price' \text{ and } R_1.\mathsf{price} = N.\mathsf{val})$ and (*R*.shipping =' _' or *R*.price =' _')) as Mgroup by cid, sale_, price_

having count (distinct shipping_R, price_R)> 1

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Shuai Ma is a professor at the School of Computer Science and Engineering, Beihang University. He obtained his PhD degrees from University of Edinburgh in 2010, and from Peking University in 2004, respectively. He was a postdoctoral research fellow in the database group, University of Edinburgh, a summer intern at Bell labs, Murray Hill, USA, in the summer of 2008, and a visiting researcher of MRSA in 2012. He is a recipient of the Best Paper Award for VLDB 2010 and the Best Challenge Paper Award for

WISE 2013. His current research interests include database theory and systems, social data analysis and data intensive computing.



Liang Duan is a PhD student in the School of Computer Science and Engineering, Beihang University, co-supervised by Prof. Jinpeng Huai and Prof. Shuai Ma. He received his MS degree in computer software and theory from Yunnan University in 2014, and BS degree in computer science and technology from Beihang University in 2009. His current research interests include databases and social data analysis.



Wenfei Fan is Professor (Chair) of Web Data Management in the School of Informatics, University of Edinburgh, UK. He is a Fellow of ACM, a Fellow of the Royal Society of Edinburgh, UK, a National Professor of the Thousand-Talent Program and a Yangtze River Scholar, China. He received his PhD degree from the University of Pennsylvania. He is a recipient of the Runnerup for Best Paper Award of ICDE 2014, the Alberto O. Mendelzon Test-of-Time Award of ACM PODS 2010, the Best Paper Award for VLDB

2010, the Roger Needham Award in 2008 (UK), the Best Paper Award for ICDE 2007, the Best Paper of the Year Award for Computer Networks in 2002, and the Career Award in 2001 (USA). His current research interests include database theory and systems.



Chunming Hu is an associate professor at the School of Computer Science and Engineering, Beihang University. He received his PhD degree from Beihang University in 2006. His current research interests include distributed systems, system virtualization, large scale data management and processing systems.



Wenguang Chen is an associate professor at the Department of Computer Science, Peking University. He obtained his PhD degree from Peking University in 2009. He was a visiting scholar at University of Alberta from 2011 to 2012 and at University of Hawaii at Manoa in from 2012 to 2013. His current research interests include data management, data quality and intelligent HCI.