

MIT Sloan School of Management

MIT Sloan Working Paper 4557-05 CISL Working Paper 2005-07 August 2005

A case study of Electronic Bill Presentment and Payment (EBPP) integration using the COIN mediation technology

Sajindra Jayasena, Stéphane Bressan, Stuart Madnick

© 2005 by Sajindra Jayasena, Stéphane Bressan, Stuart Madnick. All rights reserved. Short sections of text, not to exceed two paragraphs, may be quoted without explicit permission, provided that full credit including © notice is given to the source.

> This paper also can be downloaded without charge from the Social Science Research Network Electronic Paper Collection: <u>http://ssrn.com/abstract=825625</u>

A case study of Electronic Bill Presentment and Payment (EBPP) integration using the COIN mediation technology

Sajindra Jayasena, Stéphane Bressan, Stuart Madnick

Working Paper CISL# 2005-07

August 2005

Composite Information Systems Laboratory (CISL) Sloan School of Management, Room E53-320 Massachusetts Institute of Technology Cambridge, MA 02142

A case study of Electronic Bill Presentment and Payment (EBPP) integration using the COIN mediation technology

Sajindra Jayasena¹, Stéphane Bressan², Stuart Madnick³

¹Singapore-MIT Alliance ,²School of Computing, National University of Singapore ³Sloan School of Management, Massachusetts Institute of Technology ¹Sajindra@mit.edu, ²steph@nus.edu.sg, ³smadnick@mit.edu

Abstract

There is no such monopoly as '*The World Wide Bank*' that manages the databases of all possible financial activities. Such a concept makes neither technical nor business sense. Each player in the financial industry, each bank, stock exchange, government agency, or insurance company, operates its own internal financial information systems.

By its very nature, financial information, like the money that it represents, changes hands. Therefore the interoperation of financial information systems is the cornerstone of the financial services they support. Naturally the critical economic role and the complexity of financial information led to the development of standards for its management and interchange. Yet standards are not the panacea: different groups of players use different standards or versions of a standard's implementation.

In this paper we illustrate the nature of the problem in the *Electronic Bill Presentment and Payment* industry. In particular, we describe and analyze the difficulty of the integration of services using four different formats: IFX, OFX and SWIFT standards, and an example proprietary format. We then propose an improved way to accomplish this integration using the COntext INterchange (COIN) framework.

Main Body

Introduction

Effective, efficient and transparent interoperability is vital for the profitability and sustainability of the financial Industry. Merely adhering to a standard does not pay rich dividends when multiple institutions and geographical segments utilize different standards. Even when within one standard, one often finds different possible interpretations originating in the practices and cultural background of the various players.

Typically, a Financial Institution (FI) that is involved in the *Electronic Bill Presentment and Payment* Industry is faced with a multitude of standards such as IFX (Interactive Financial Exchange protocol)[10], OFX (Open Financial Exchange Protocol)[9] and the world wide inter-bank messaging protocol, SWIFT [11]. Making matters worse, the FI may have its own semantics for its internal systems that represent the same business domain but in a different context. In the rest of this paper we would be referring to the IFX, OFX and SWIFT *standards* in EBPP point of view as IFX, OFX and SWIFT *context* and the Internal financial system of a Financial Institution as an *internal context*.

The *Price* and *Invoice* concepts may be represented in different ways, e.g., excluding tax, with tax and fees, and even with inter-bank charges, resulting in definitional conflict due to contextual differences [1]. Interoperability of such definitional conflicts is vital in distinguishing intra-bank and inter-bank payment across borders. Further, different contextual heterogeneities exist on the *currency*, where in certain contexts like IFX and OFX; it is implicitly based on where the funds are directed to. As a result of different *Account types* and BANK/*BRANCH code*, financial institution would need to maintain complex mappings between different contexts. In addition, there can be data level heterogeneities like date formats and representations. Examples of possible conflicts are summarized in table 1. The columns in the table related to OFX, IFX, and SWIFT represents actual real-life conflicts and similarities that exists between those standards while the conflicts addressed under the internal schema refers to an hypothetical but realistic, financial system utilized by a Financial system that would interact between OFX, IFX and SWIFT standards.

Property	Internal Schema	OFX	IFX	SWIFT 103/103+
Price	1000 EUR	1000 USD + 1000 *	1000 USD + 1000 *	1000 USD + 1000* 5% + 10
	(Euros)	5%	5%	USD (inter-bank charge if outside EU)
Currency	FFR	Currency of country of incorporation of payee bank i.e. USD	Currency of country of incorporation of payee bank i.e. USD	Specified in message – can be the payee or payer's currency
Account types	CHK,SVG, MNYMRT	CHECKING, SAVINGS	DDA,SDA	N/A
Bank and branch code	Internal ID	Dependent on the country i.e. clearing #,sort #	Dependent on the country i.e. clearing #,sort #	BIC / BEI (branch ID + bank Id)
Invoice	Net	Net + fees + tax	Net + fees + tax	Included in Amount – N/A
Due date	23022002	20020223	2002-03-23	030223

Table 1: Some conflicts in different financial standards

The objective of this paper is to analyze how the COIN mediation technology [2, 3, and 8] could be applied to provide a declarative, transparent yet effective mediation solution to the potential sources of heterogeneity and conflicts that exist within and among the existing financial standards

Case Study

Electronic Bill Presentment and Payment domain

The 'Electronic Bill Presentment any Payment - (EBPP)' domain is a rich subset of the financial services messaging frameworks and it has a considerable amount of heterogeneities. The main standards are OFX, IFX for intra-bank payment schemes and SWIFT for inter-bank payment and funds transfer. These standards may interact in various ways, as depicted in Figure 1.

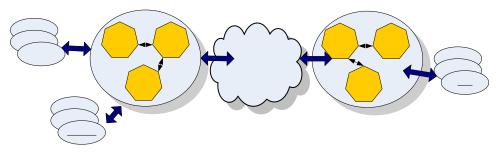


Fig. 1. Some interfaces in EBPP

For brevity, in order to depict the usage of COIN in EBPP mediation in a practical scenario, we have broken down the analysis to three main areas that spans from a customer initiating a Bill payment and its subsequent verification by the Biller. The conflict analysis and mediation with the diverse financial standards have been analyzed with respect to the hypothetical internal system of a Financial Institution which could be an in-house developed system or third-party (off the shelf) system. This internal system is represented by the term 'internal context'. Following are the three main areas analyzed in the case study.

- Mediation between an internal context and OFX context.
- Mediation between an internal context and IFX context.
- Mediation between an internal context and SWIFT context.

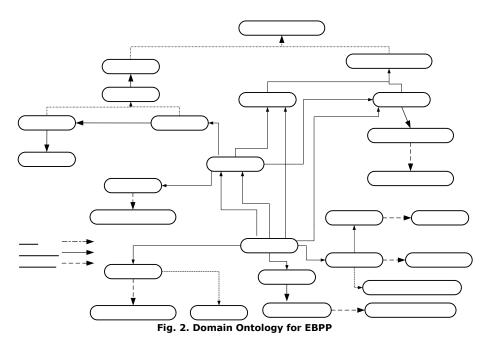
The IFX, OFX and SWIFT contexts represent the semantics and definitions adopted by IFX, OFX and SWIFT messaging frameworks respectively. SWIFT distinguishes intra European Union (EU) fund transfer and outside EU fund transfers for accounting for inter-bank charges.

Figure 2 represents the context independent, COIN domain ontology for the EBPP domain denoting the concepts used by IFX, OFX, SWIFT and financial institution's own internal schema. This was constructed by exploring the business domain in EBPP and the relevant message handling semantics used in these diverse standards. The semantic types (entities) represent the business entities that encompass the main functionalities in EBPP Industry. The semantic types denote the entities and their relationships in the EBPP domain like *Payment*, *Account* etc. *is-a* relation denotes a inheritance relationship between semantic types. Attribute lines represents attributes a certain semantic type possesses (payment has payee, payer accounts, amount etc). Further the entities that constitute conflicts in these contexts are modeled through modifiers. As an example, the *paymentAmount* can include/exclude various taxes in different contextual representations and in SWIFT it would incur an additional inter-bank service charge. These are represented by COIN modifiers *paymentScheme*, *includesInterBankCharge* respectively. Further all monetary amounts would have conflict in different currency usage. This is modeled using the *currency* modifier for the supersemantic type moneyAmount. This represents how COIN models inheritance of contextual knowledge for context different entities.



IF Cont

OFX



The mediations that we focus in this section resemble some actual real life scenarios that are faced while attempting heterogeneous systems integration. In this exercise these heterogeneities were extracted by analyzing the standards documentation of SWIFT, IFX and OFX as well as from the conflicts we introduced in the internal context which is hypothetical yet resembles a real life internal EBPP system of a Financial Institution. In an actual scenario, the heterogeneities and mappings for the different mediation could be analyzed and formulated by a business analyst or a person in that caliber working for the respective Financial Institution. Following sections addresses each one of them separately.

Internal Schema vs. OFX

First we will look at the mediations attempted between OFX and an internal schem**Bankthoot** institution. Table 2 summarizes the heterogeneities identified in the two schemas. As denoted in COIN's mediation strategy, the modifiers and relevant conversion functions are the main ingredients in facilitating the mediation for a particular heterogeneity exiting between two different contexts. As shown in the table, there are different types of heterogeneities between the two contexts. The significant conflicts are payment amount, currency type and Account code reference identifiers. They are discussed below.

			-
Conflict	Internal Ontology	OFX Ontology	Mapped modifier (refer Fig 2)
Payment amount	Net amount without tax	Net + tax amount	PaymentScheme
Account Location Identifier – BANK reference	Bank identifier represented in the internal scheme	Bank Identifier depends on the Bank's country of Incorporation.	BankLoc
Account Location Identifier – BANK BRANCH reference	Branch identifier of the account	Branch Identifier dependent on the bank's country of incorporation.	BranchLoc
Payment due date format	European format	US format	DateFormat
Payment due date Style	dd/mm/yyyy 03/03/2003	Yyyymmdd 20030303	DateStyle
Account type code	CHECKING, SAVINGS etc	CHK,SVG etc	AccountCodeScheme
Currency type (Exchange rate)	"EUR"	Currency of country of incorporation of payee bank	Currency
Phone number format	415.445.4345	1-415-445-4345	PhoneNumberScheme

Table 2: Conflicts in Internal and OFX contexts that were mediated usin regimetry Name	Table 2: Conflicts in	Internal and OFX	contexts that	were mediated	usin r GQIN n	tryNama
--	-----------------------	------------------	---------------	---------------	----------------------	---------

Attribute₅ Modifier Α

Payment amount - The mediation strategy for payment amount is as follows. The mediator needs to apply two conversion functions in order to obtain the mediated payment amount, namely the currency conversion inherited from the *moneyAmount* super semantic type, and the tax adjustment for the payment. For simplicity let's assume that in both schemas the currency is denoted in three letter ISO 4217 format (i.e. USD, GBP, and EUR etc).

Assume that the query '*select AMOUNT from PAYMENT*' is called in *OFX* context; First, payment amount is adjusted for the tax inclusion. For simplicity let's assume that the applicable tax is 'GST'. Then;

Payment $_{OFX}$ = (payment $_{INTERNAL}$ + \sum GST amount for payment $_{OFX}$ * payment $_{INTERNAL}$) (1) * Exchange Rate ("EUR", OFF_CUR, DATE_OF_TRANSACTION)

In the COIN framework, the mediation formulas are translated into logical expressions of the COIN theoretical model [1]. Later these expressions are evaluated by a Prolog-based abduction engine [13]. The following describes the logical representation of the formula (1) for this example.

The formula¹ below describes a non-commutative mediation of *paymentType* object depending on its modifier *paymentScheme*, in this case hold the values "*noTax*" and "*withTax*". The *Ctxt* defines the destination context. The conversion in simple terms would be to retrieve the Rate for the tax "GST" from the elevated relation '*OFX_TAX_TYPES_p*' which is an elevation mapped to relation '*OFX_TAX_TYPES*' under *OFX* Context (The destination context in this case) and utilizes in the tax calculation. The *value* predicate in the formula defines a value of a particular semantic object under a certain context.

```
cvt(noncommutative,paymentAmt,_0,paymentScheme,Ctxt,"notax",Vs,"withtax"
,Vt) 
value(TaxName,Ctxt,"GST"),'OFX_TAX_TYPES_p'(TaxName,_,Rate),
value(Rate,Ctxt,RR),
(Vtemp is RR * Vs),
(Vt is Vs + Vtemp).
```

Further, this resembles an *Equational ontological heterogeneity* addressed in [5], which is a clear example of differences in the two ontologies for OFX and internal contexts. But the ontological conflict has been transformed into a contextual heterogeneity by way of matching the definitional equations as in [5]. Then, this tax adjusted payment needs to be mediate to the currency of *OFX* context. This requires a *dynamic modifier* to determine the currency value depending on the official currency in the incorporated country of the payee's bank as given below.

```
OFF\_CUR_{OFX} = Currency_{OFX} (payment) \iff AID = Payee Account of Payment_{INTERNAL} (2)

BRANCH_{OFX} \iff Branch of Account AID_{OFX}

BANK_{OFX} \iff Bank of BRANCH_{OFX}

COUNTRY_{OFX} \iff country of Incorporation of BANK_{OFX}

OFF\_CUR_{OFX} \iff official currency of COUNTRY_{OFX}
```

The following logical representation describes how the value of modifier *currency* for *paymentAmount* is obtained for *OFX* context dynamically through the relationships between semantic objects.

¹ Although this paper shows much of the internal notations used within COIN, the system administrators, developers, and users need never see these since "user friendly"interfaces exist for providing and maintaining the context knowledge.

For example the predicate *attr (Payment, payeeAct, Account)* defines the attribute relationship '*payeeAct*' between the *Payment* and *Account* semantic objects. This relation can be mapped to underlying relationships in different contexts as shown in the following logical representation.

The two statements correspond to how the attribute relation *payeAcct* has been elevated to two elevation relations with their attributes, mapped in *INTERNAL* and *OFX* contexts.

Account type code - This is represented as heterogeneity in enumerated data types in defining the account type codes in the three contexts. The following summarizes the enumerated data mapping in the three contexts. Since there can be more than two types of financial standards, rather than having mappings between each standard , we adopt a 'Indirect conversion with ontology inference' strategy [13] where we represent the different account types in the ontology itself and providing mapping between the context independent ontology's enumerated type and the context sensitive type codes. The context model would then map each security type context construct into its corresponding security type ontology construct.

Therefore usage the above mapping from INTERNAL to OFX would be,

 $\begin{aligned} Account_type_{OFX}(Account_type_{INTERNAL}(`CHK')) & \leftarrow ONTOLOGY_TYPE_{INTERNAL} = `CHKA' [table INTERNAL] & (3) \\ ONTOLOGY_TYPE_{NONE} & = 'CHKA' [table Ontology] \\ ONTOLOGY_TYPE_{OFX} & = 'CHKA' [table OFX] \\ OWN_TYPE (`CHK')_{OFX} & = `CHECKING' [table OFX] \end{aligned}$

Tab	r : Account types le Ontology		Internal and Ontology
ONTOLOGY_TYPE	Description	ONTOLOGY TYPE	OWN TYPE
СНКА	Checking account	СНКА	СНК
SVGA	Savings account		
MNYMRTA	Money Market Account	SVGA	SVG
CRLINEA	Credit Line Account	MNYMRTA	MNYMRT
CREINER	eredit Ellie Account	CRLINEA	CRLINE
Mapping between OFX and Ontology - Table OFX			n IFX and Ontology ble IFX
	Table OFX	- Ta	
	Table OFX OWN_TYPE	- Ta ONTOLOGY_TYPE	OWN_TYPE
ONTOLOGY_TYPE			
ONTOLOGY_TYPE CHKA	OWN_TYPE	ONTOLOGY_TYPE	OWN_TYPE
	OWN_TYPE CHECKING	ONTOLOGY_TYPE CHKA	OWN_TYPE DDA

Internal Schema vs. IFX

After looking at some of the interoperability issues between internal context and OFX, now we would delve into the newer standard, IFX, which has more features and detailed representations. Table 3 shows the different types of heterogeneities.

Both IFX and OFX handle complex business payment transactions for business customers. This requires incorporating multiple invoice details attached to the payment aggregates when both the biller and customer are business entities. The older OFX provides a basic mechanism of incorporating invoice details like invoice discounts, line items in invoices etc. But the newer IFX extends this by providing more elaborate aggregates constituting different tax schemes as well as fees (late fees, FoRex fees, etc.) that are applicable to invoice.

Mediating Invoice Amount

Each payment can have at least one invoice aggregate that represent the different invoices paid through a particular invoice. In an internal schema the invoice amount might be represented as the net amount, where the taxes and fees would be aggregated when the bill is presented or invoiced. But in the IFX context, the Invoice amount constitute of the various taxes and fees that could be added to the net amount.

Table 3: Conflicts between Internal and IFX contexts that were mediated using COIN				
Conflict	Internal Ontology	IFX Ontology	Mapped modifier (Refer Fig 2)	
Payment amount	Net amount	Net + \sum tax amount + \sum Fees	PaymentScheme	
Payment due date format	European format	US format	DateFormat	
Payment due date Style	dd/mm/yyyy 03/03/2003	Yyyy-mm-dd 2003-03-03	DateStyle	
Account type code	SVG,MNYMRT,CRLINE, CHK etc	SDA,MMA,CCA,DDA etc	AccountCodeScheme	
Invoice Amount	Net amount	Net + \sum tax amount + \sum Fees	InvoicePaymentScheme	
Currency type (Exchange rate)	"GBP"	Currency of country of incorporation of payee bank	Currency	
Phone number format	415.445.4345	1-415-4454345	PhoneNumberScheme	

The mediation between the two invoice amounts represents an equational ontological conflict (EOC) [5] that would be resolved similar to the previous example.

Some readers may have so far considered that identifying and resolving semantic heterogeneity is a small matter of handling date formats, currency exchange, and other accounting conventions. We observe now that the net effect and accumulation of such small matters makes the programmer's task impossible. A programmer not equipped with the COIN mediation system must devise and create complex conversion programs and queries. A programmer using the COIN mediation system can type the original query: 'select INVOICE_AMOUNT from INTERNAL_INVOICE' in IFX context and rely on COIN to automatically mediate the query. On the other hand the query generated by COIN, (which the developer would have had to code in the absence of COIN) is shown below.

```
select
```

```
(internal_invoice.INVOICE_AMOUNT+(((internal_invoice.INVOICE_AMOUNT*ifx_tax_types.AMOUNT))
+(internal_invoice.INVOICE_AMOUNT*ifx_tax_types2.AMOUNT))+(ifx_fees_types.AMOUNT+(interna
l_invoice.INVOICE_AMOUNT*ifx_fees_types2.AMOUNT))))
  from
           (select
                     'GST', TYPE, AMOUNT from
                                                    ifx_tax_types
            where TAX_NAME='GST') ifx_tax_types,
           (select 'IMPORT', TYPE, AMOUNT from ifx_
where TAX_NAME='IMPORT') ifx_tax_types2,
                                                        'ifx_tax_types
                     'LATE', TYPE, AMOUNT from
           (select
                                                      ifx_fees_types
                    FEES_NAME='LATE') ifx_fees_types,
            where
                     'DELIVERY', INVOICE_NO from
           (select
                                                         ifx_invoice_fees
                     FEE_NAME='DELIVERY') ifx_invoice_fees,
            where
           (select
                     'LATE', INVOICE_NO from
                                                    ifx_invoice_fees
                     FEE_NAME='LATE') ifx_invoice_fees2,
            where
                     'IMPORT', INVOICE_NO from
                                                       ifx_invoice_taxes
           (select
                    TAX_NAME='IMPORT') ifx_invoice_taxes,
            where
                     'GST', INVOICE_NO from
                                                  ifx_invoice taxes
           (select
           where TAX_NAME='GST') ifx_invoice_taxes2,
(select INVOICE_NO, PAYMENT_ID, INVOICE_AMOUNT, DESCR, INVOICE_DATE,
            DISCOUNT RATE, DISCOUNT DESC from
                                                      internal_invoice) internal_invoice,
           (select 'DELIVERY', TYPE, AMOUNT rom ifx_fees_types
where FEES_NAME='DELIVERY') ifx_fees_types2
where ifx_invoice_fees.INVOICE_NO = ifx_invoice_fees2.INVOICE_NO
                      ifx_invoice_fees2.INVOICE_NO = ifx_invoice_taxes.INVOICE_NO
ifx_invoice_taxes.INVOICE_NO = ifx_invoice_taxes2.INVOICE_NO
              and
              and
              and
                      ifx_invoice_taxes2.INVOICE_NO = internal_invoice.INVOICE_NO
```

It's evident that the application gains in clarity of design and code, as well as in scalability. The sharing of domain knowledge, context descriptions, and conversion functions improve the knowledge independence of the programs and their maintainability.

Internal Schema vs. SWIFT context

The SWIFT protocol is mainly involved in inter-bank cross border transactions. Under *SWIFT* context, depending on whether the transaction is between financial institutions inside the EU or outside, a bank handling fee is credited to the payment amount. This can be modeled using the *sub context* concept of COIN. A sub context derives all the super context based modifier values while having specialized modifier values for extended features. The following logical formulas denote how this can be modeled in COIN

```
is_a(swift_intraEU, swift)
```

is_a(swift_outsideEU,swift)

Then a query like '*select AMOUNT from PAYMENT*' in *outsideEU* context called on a relation defined for internal context is resolved by adding the handling charges on top of the local applicable tax (inherited from *SWIFT* context) as denoted in the following mediated datalog.

```
answer('V15'):-

'INTERNAL_PAYMENT'('V14', 'V13', 'V12', 'V11', 'V10', 'V9', 'V8', 'V7'),

'TAX_TYPES'("GST", 'V6', 'V5'), 'V4' is 'V5' * 'V12',

'V3' is 'V12' + 'V4', 'SWIFT_CHARGE_TYPES'("outsideEU", 'V2', 'V1'),

'V15' is 'V1' + 'V3'.
```

It is important to remember that although datalog and prolog representations are used internally within COIN and shown in this paper, the actual COIN system provides a user-friendly interface so that a user need not know anything about these internal representations.

Conclusion

We identified different semantic, ontological heterogeneities that exist in different financial messaging standards and showed that mediation between these is not a trivial task, yet are critical and important to the globalization of the financial industry. We show that an effective answer is to have a mediation service that provides automatic and a transparent mediation without requiring the generation and regulation of a new single universally enforced standard.

The COIN approach is capable of mediating the different heterogeneities that exist in different financial standards and internal contexts of Financial Institutions. Our approach in modeling a business domain and mapping different contextual representations and values through a declarative manner demonstrates the extensibility and flexibility of the COIN framework.

References:

- [1] A.Firat."Information Integration using Contextual Knowledge and Ontology Merging", PhD Thesis, MIT,2003
- [2] C.H. Goh, S.Bressan.S.Madnick, M.Siegel, "Context Interchange :New Features and Formalisms for the Intelligent Integration of Information", ACM TOIS, vol. 17, pp 270-293, 1999.
- [3] A.Bressan, C.H. Goh, "Answering Queries In Context", Proceedings of "Flexible Query Answering Systems". Third International Conference, FQAS, 1998, Roskild, Denmark.
- [4] S.Madnick, A.Moulton, M.Siegel, "Semantic Interoperability in the Fixed Income Securities Industry: A Knowledge Representation Architecture for dynamic integration of Web-based information", HICSS, Hawai, 2003
- [5] S.Madnick, A.Firat, B.Grosof, "Knowledge Integration to overcome Ontological Heterogeneity: Challenges from Financial Information Systems", pp. 183-194, ICIS, Barcelona, Spain, 2002
- [6] S.Madnick, A.Moulton, M.Siegel, "Context Interchange Mediation for Semantic Interoperability and Dynamic Integration of Autonomous Information Sources in the Fixed Income Securities Industry", (WITS), Barcelona, Spain, December 14-15, 2002, pp.61-66
- [7] S.Madnick,S. Bressan, C.H. Goh, T. Lee, and M. Siegel "A Procedure for Mediation of Queries to Sources in Disparate Context", Proceedings of the International Logic Programming Symposium, October 1997
- [8] S.Madnick, S. Bressan, C. Goh, N. Levina, A. Shah, M. Siegel, "Context Knowledge Representation and Reasoning in the Context Interchange System", *Applied Intelligence: The International Journal of Artificial Intelligence, Neutral Networks, and Complex Problem-Solving Technologies*, Vol 12, Number 2, September 2000, pp. 165-179
- [9] Open Financial Exchange Specification OFX 2.0.2, Open Financial Exchange, http://www.ofx.net/ofx/de_spec.asp
- [10]Interactive Financial Exchange –IFX version 1.5, IFX Forum, Inc, http://www.ifxforum.org/ifxforum.org/standards/standard.cfm
- [11] Society for Worldwide Interbank Financial Telecommunication (S.W.I.F.T), Standard Release 2003, http://www.swift.com/index.cfm?item_id=5029

- [12] S.Madnick, A. Firat and M. Siegel, "The Caméléon Web Wrapper Engine", Proceedings of the VLDB2000 Workshop on Technologies for E-Services, September 14-15, 2000
- [13] S.Madnick, A. Moulton and M. Siegel "Semantic Interoperability in the Securities Industry: Context Interchange Mediation of Semantic Differences in Enumerated Data Types", *Proceedings of the Second International Workshop* on Electronic Business Hubs: XML, Metadata, Ontologies, and Business Knowledge on the Web (WEBH2002), Aix En Provence, France, September 6, 2002
- [14] Goh, C. H. (1997), "Representing and Reasoning about Semantic Conflicts in Heterogeneous Information Systems, MIT Ph.D. Thesis.