



Information Integration Data Quality

23.1.2020
Felix Naumann

Overview

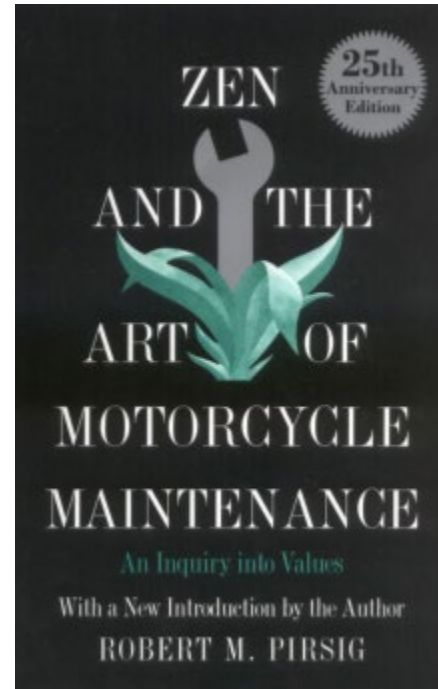
- 1. Information quality**
2. IQ criteria
3. IQ assessment
4. Cleansing tasks
5. IQ anecdotes



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*“Even though quality
cannot be defined, you
know what it is.”*

Robert Pirsig



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Zooming into Information Quality



Fitness for use

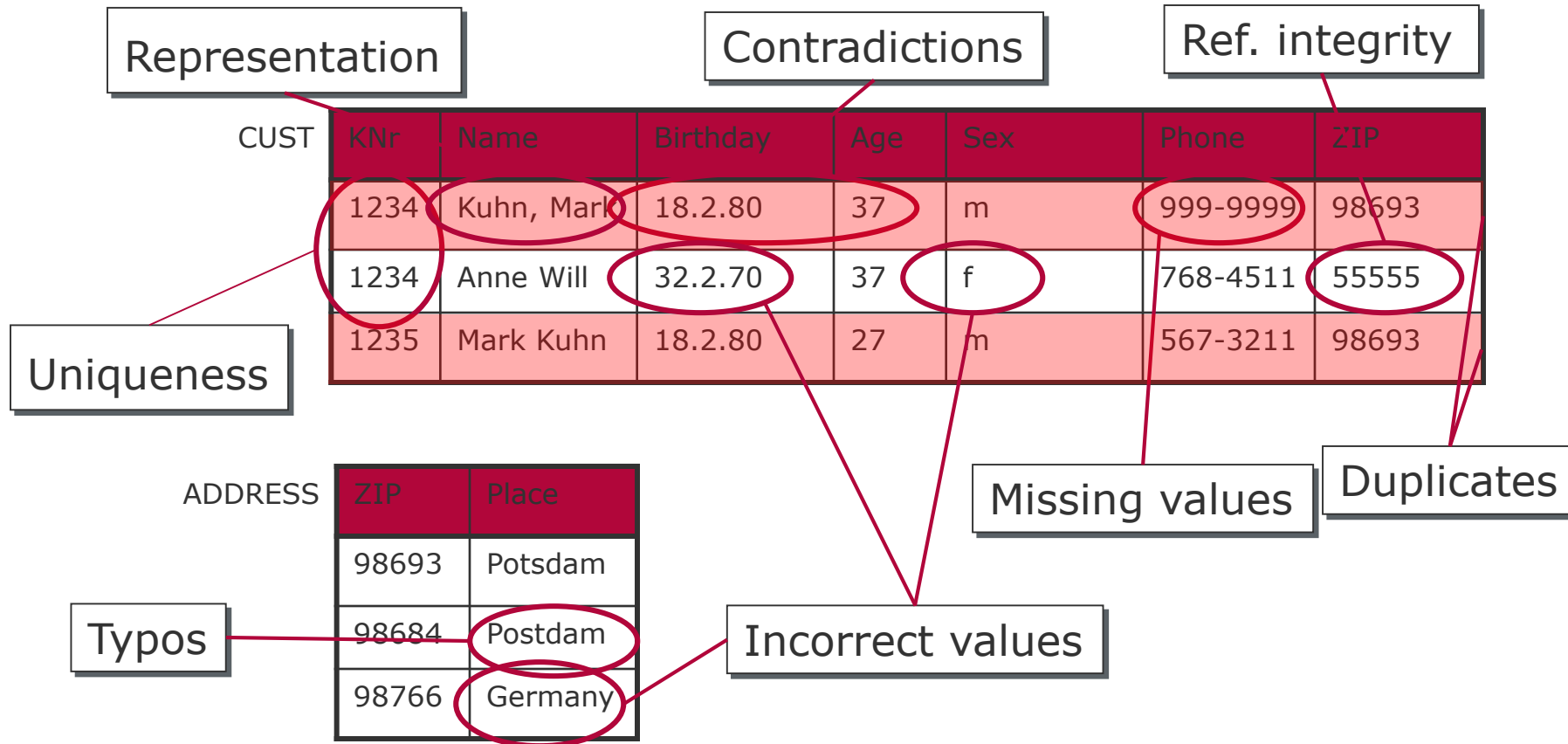
Accuracy, Objectivity, Believability, Reputation, Accessibility, Security, Relevance, Value-Added, Timeliness, Completeness, Amount of Data, Interpretability, Understandability, Consistency, Concise Representation

179 Dimensions

Ability to be Joined With	Ability to Download	Ability to Identify Errors	Ability to Upload	Extensibility	Extern	Finalization	Flawlessness
Acceptability	Access by Comparison	Accessibility	Accuracy	Flexibility	Form of Presentation	Format	Irregularity
Adaptability	Adequate Detail	Adequate Volume	Amount of Data	Friendliness	Generality	Habit	Historical
Age	Aggregability	Availability	Believability	Importance	Inconsistencies	Integration	Occurrence
Auditable	Authority	Centred Data	Clarity	Interactivity	Interesting	Level of Abstraction	Originality
Breadth of Data	Browser	Charm	Consistency	Localized	Logically Connected	Meets Requirements	Permanence
Clarity of Origin	Cost of Data	Completeness	Continuity	Modularity	Narrowly Defined	No last information	Normality
Competition	Completeness	Confidentiality	Continuity	Novelty	Objectivity	Optimality	Orderliness
Consistency	Content	Cost	Cost	Origin	Parity	Partitionability	Past Experience
Convenience	Correctness	Cost	Cost	Progress	Personalized	Portability	Permanence
Cost of Accuracy	Cost of Collection	Cost	Cost	Practicality	Practical	Proprietary Nature	Purpose
Current	Customizability	Cost	Cost	Quantity	Rationality	Redundancy	Regularity of Form
Data Derived	Definability	Dependability	Depth of Data	Reliability	Reliability	Repetitive	Reproducibility
Data	Dual Source	Dependent	Distinguishable	Repetition	Regulation of Graphics	Responsibility	Reliability
Dynamic	Ease of Access	Ease of Comparison	Ease of	Revealing	Revealing	Rigidity	Robustness
Ease of Data Exchange	Ease of Maintenance	Ease of Retrieval	Ease of	Scope of Info	Secrecy	Security	Self-Correcting
Ease of Update	Ease of Use	Easy to Change	Easy to Question	Semantic	Semantics	Size	Source
Efficiency	Encouragement	Enlightening	Ergonomic	Interpretation	Speed	Stability	Storage
Error-Free	Expendability	Expense	Extensibility	Synchronization	Time-Independence	Timeliness	Traceable
				Translatable	Transportability	Unambiguity	Unbiased
				Understandable	Uniqueness	Unorganized	Up-to-Date
				Usable	Usefulness	User-Friendly	Valid
				Value	Variability	Vanity	Variability
				Votability	Well-Documented	Well-Preserved	

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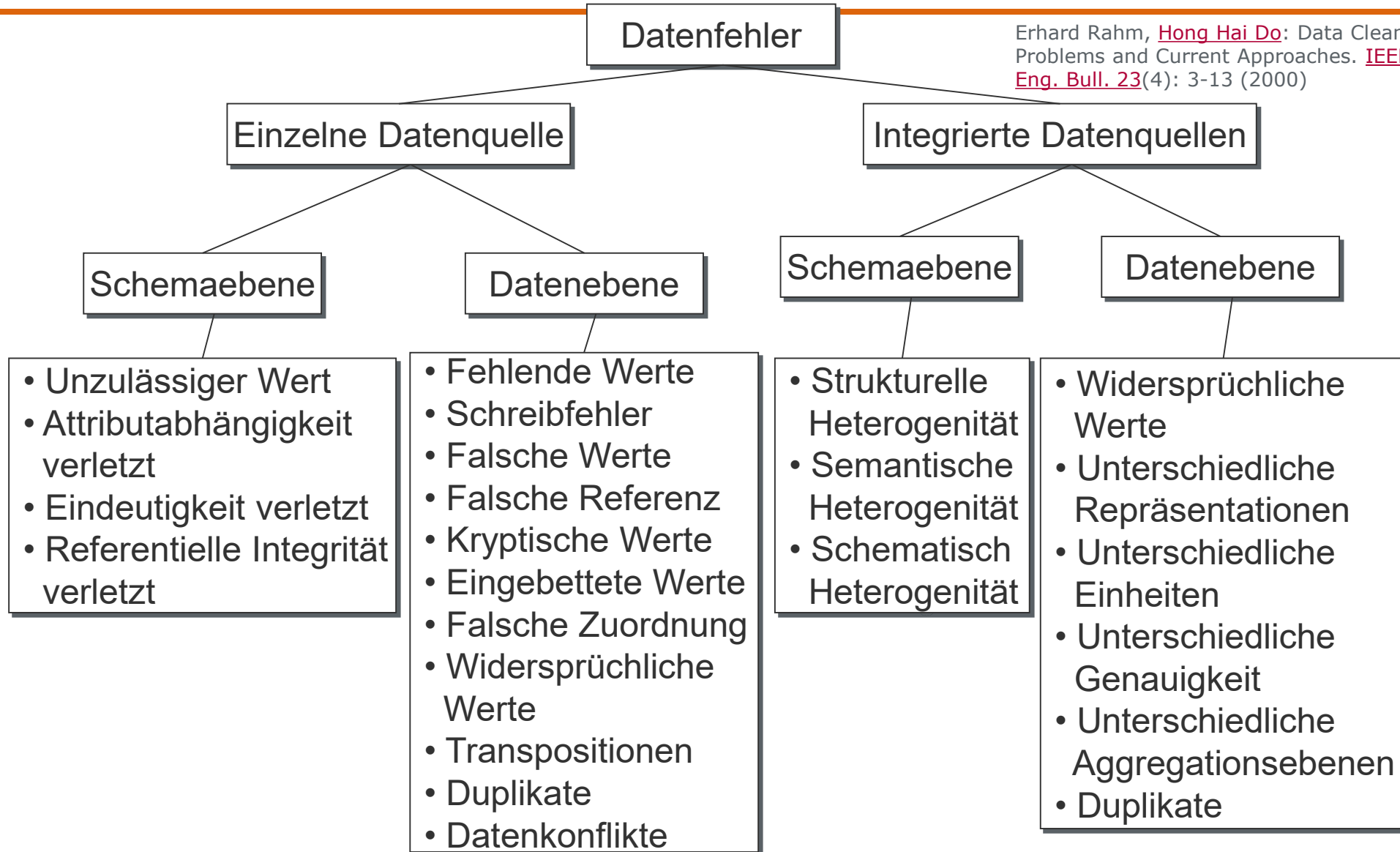
Data Quality: Problems



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Classification of Errors

Erhard Rahm, [Hong Hai Do](#): Data Cleaning: Problems and Current Approaches. [IEEE Data Eng. Bull.](#) 23(4): 3-13 (2000)



DQ-Problems: Effects

- Incorrect prices in inventory retail databases [English 1999]
 - Costs for consumers 2.5 billion \$
 - 80% of barcode-scan-errors to the disadvantage of consumer
- IRS 1992: almost 100,000 tax refunds not deliverable [English 1999]
- 50% to 80% of computerized criminal records in the U.S. were found to be inaccurate, incomplete, or ambiguous. [Strong et al. 1997a]
- US-Postal Service: of 100,000 mass-mailings up to 7,000 undeliverable due to incorrect addresses [Pierce 2004]

**IRS might
be after you
— to mail
you a check**

Incorrect addresses
stall nearly 1,500
Tennessee refunds

By **BONNA de la CRUZ**
Staff Writer

Now that Tilcia L. Meniffee knows that she'll be getting \$500 in a tax refund from Uncle Sam, she can do some Christmas shopping, she said.

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Hidden values / hidden value

	Feld						
Datenelement	Name1	Name2	Name3	Ortsname	Ortsteil	Straße	Summe
Handy-Nummer	41	501	10	0	2677	297	3526
Festnetznummer	15	98	6	0	221	9579	9919
Kostenstelle	283	1112	73	2	87	16	1573
Registriernummer	11	583	1	1	0	3	599
Lieferungsnummer	55	390	9	0	212	15	681
Abteilung	3711	9997	115	60	439	175	14497
Sperrkennzeichen	129	143	2	0	66	9	349
Löschkennzeichen	1028	442	5	36	113	10	1634
Rechtsform	131700	66136	187	6	64	57	198150
Kreditoreninfo	0	100	11	0	18	0	129
Kommissionsinfo	216	352	1	2	36	10	617
Baustelle	2013	3452	42	5	124	222	5858
Abladestelle	2923	3808	94	1503	958	3065	12351
Behörde	13410	12461	172	19	295	7075	33432
Summe	155535	99575	728	1634	5310	20533	

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Source: Joachim Schmid, FUZZY! Informatik AG

Cost of Dirty Data

- A.T. Kearny: 25%-40% of operative costs due to poor DQ.
- Data Warehouse Institute: Industry and administration in US lose 600 billion USD annually.
- SAS study: Only 18% of German companies trust their own data.
- AT&T (70s): 20-30% of all phone lines unused due to poor data.
- 80% of all hospital records contain errors.
- ...

Overview

1. Information quality
- 2. IQ criteria**
3. IQ assessment
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Information Quality (IQ)

- What is information quality ?
 - „Fitness for use“
 - “User satisfaction”
 - Application-dependent

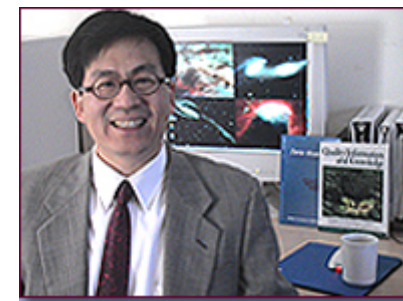
IQ := {Understandability, Reputation,
Reliability, Timeliness,
Availability, Price,
Consistency, Coverage,
Response time, Density,
Completeness, Amount,
Accuracy, Relevancy, ... }

Category	IQ Criteria	TDQM	MBIS	Weikum	DWQ	SCOUG	Chen
Content-related Criteria	Accuracy	Yes	Yes	Yes	Yes	Yes	Yes
	Documentation					Yes	
	Relevancy	Yes	Yes		Yes		Yes
	Value-Added	Yes				Yes	
	Completeness	Yes	Yes	Yes	Yes	Yes	Yes
Technical Criteria	Interpretability	Yes			Yes		
	Timeliness	Yes	Yes	Yes	Yes	Yes	Yes
	Reliability			Yes			
	Latency			Yes			Yes
	Performability			Yes		Yes	
	Response time		Yes	Yes			Yes
	Security	Yes		Yes	Yes		
	Accessibility	Yes	Yes	Yes	Yes	Yes	
	Price		Yes	Yes		Yes	
Intellectual Criteria	Customer Support					Yes	
	Believability	Yes	Yes	Yes	Yes	Yes	
	Reputation	Yes	Yes		Yes		
Instantiation related Criteria	Objectivity	Yes					
	Verifiability			Yes			
	Amount of data	Yes	Yes				Yes
	Understandability	Yes	Yes				
	Consistent represent.	Yes	Yes	Yes	Yes	Yes	
Concise represent.	Yes						

IQ Classification of Wang and Strong

- Intrinsic IQ
 - Believability, Accuracy, Objectivity, Reputation
- Contextual IQ
 - Value-added, Relevancy, Timeliness, Completeness, Amount
- Representational IQ
 - Interpretability, Understandability, Repr. Consistency, Repr. conciseness
- Accessibility IQ
 - Accessibility, Security

Wang, R. Y. & Strong, D. M.
Beyond Accuracy: What data quality means to data consumers
Management of Information Systems, 1996, 12(4), 5-34



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Content-based IQ Criteria

- ...concern the actual data.
- Accuracy
 - is the extent to which data is correct, reliable, and certified free of error. [WS96]
- Completeness
 - is the extent to which data is not missing and is of sufficient breadth, depth, and scope for the task at hand. [WS96]
- Customer support
 - is the amount and usefulness of human help via email or telephone.
- Documentation
 - is the amount and usefulness of documents with metadata.
- Interpretability
 - is the extent to which data is in appropriate languages, symbols, and units, and the definitions are clear. [WS96]
- Relevancy (or relevance)
 - is the extent to which data is applicable and helpful for the task at hand. [WS96]
- Reliability
 - is the degree to which the user can trust the information
- Value-Added
 - is the extent to which data is beneficial and provides advantages from its use. [WS96]

Technical IQ Criteria

- ...concern software and hardware.
- Accessibility (or availability)
 - of a DBMS is the probability that a feasible query is correctly answered in a given time range.
 - Is the extent to which data are available or easily and quickly receivable [WS96].
- Latency
 - is the amount of time in seconds from issuing the query until the first data item reaches the user
- Price (cost effectiveness)
 - is the amount of money a user has to pay for a query.
 - is the extent to which the cost of collecting appropriate data is reasonable [WS96].
- Response time
 - measures the delay in seconds between submission of a query by the user and reception of the complete response from the IS.
- Security
 - is the extent to which access to data is restricted appropriately to maintain its security [WS96].
- Timeliness
 - is the extent to which the age of the data is appropriate for the task at hand [WS96].

Intellectual IQ Criteria

- ...concern subjective aspects.
- Believability
 - is the extent to which data is regarded as true, real, and credible [WS96].
- Objectivity
 - is the extent to which data is unbiased, unprejudiced, and impartial [WS96].
- Reputation
 - is the extent to which data is trusted or highly regarded in terms of its source or content [WS96].

Instantiation-related IQ Criteria

- ...concern the presentation of retrieved data.
- Amount of data
 - is the extent to which the quantity or volume of available data is appropriate [WS96].
- Representational conciseness
 - is the extent to which data is compactly represented without being overwhelming [WS96].
- Representational consistency
 - is the extent to which data is always represented in the same format and are compatible with previous data [WS96].
- Understandability (ease of understanding)
 - is the extent to which data are clear without ambiguity and easily comprehended [WS96].
- Verifiability (traceability, lineage)
 - Is the extent to which data are well documented, verifiable, and easily attributed to a source [WS96].

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Questionnaires

All items are measured on a 0 to 10 scale where 0 is not at all and 10 is completely. Items labels with “(R)” are reverse coded.

Accessibility. (4 items, Cronbach’s Alpha=.92)

- This information is easily retrievable.
- This information is easily accessible.
- This information is easily obtainable.
- This information is quickly accessible when needed.

Appropriate Amount. (4 items, Cronbach’s Alpha=.76)

- This information is of sufficient volume for our needs.
- The amount of information does not match our needs. (R)
- The amount of information is not sufficient for our needs. (R)
- The amount of information is neither too much nor too little.

Believability. (4 items, Cronbach’s Alpha=.89)

- This information is believable.
- This information is of doubtful credibility. (R)
- This information is trustworthy.
- This information is credible.

Completeness. (6 items, Cronbach’s Alpha=.87)

- This information includes all necessary values.
- This information is incomplete. (R)
- This information is complete.
- This information is sufficiently complete for our needs.
- This information covers the needs of our tasks.
- This information has sufficient breadth and depth for our tasks.

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IQ-Assessment – New classification of IQ criteria

Subject



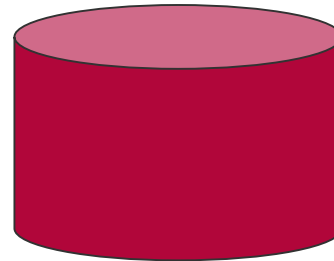
- Relevance
- Trustworthiness
- Understandability
- ...

Process



- Availability
- Response time
- ...

Object



- Completeness
- Timeliness
- ...

Assessment Class	IQ Criterion	Assessment Method
Subject Criteria	Believability	User experience
	Concise representation	User sampling
	Interpretability	User sampling
	Relevancy	Continuous user assessment
	Reputation	User experience
	Understandability	User sampling
	Value-Added	Continuous user assessment
Object Criteria	Completeness	Parsing, sampling
	Customer Support	Parsing, contract
	Documentation	Parsing
	Objectivity	Expert input
	Price	Contract
	Reliability	Continuous assessment
	Security	Parsing
	Timeliness	Parsing
	Verifiability	Expert input
Process Criteria	Accuracy	Sampling, cleansing techniques
	Amount of data	Continuous assessment
	Availability	Continuous assessment
	Consistent representation	Parsing
	Latency	Continuous assessment
	Response time	Continuous assessment

From [NR00]

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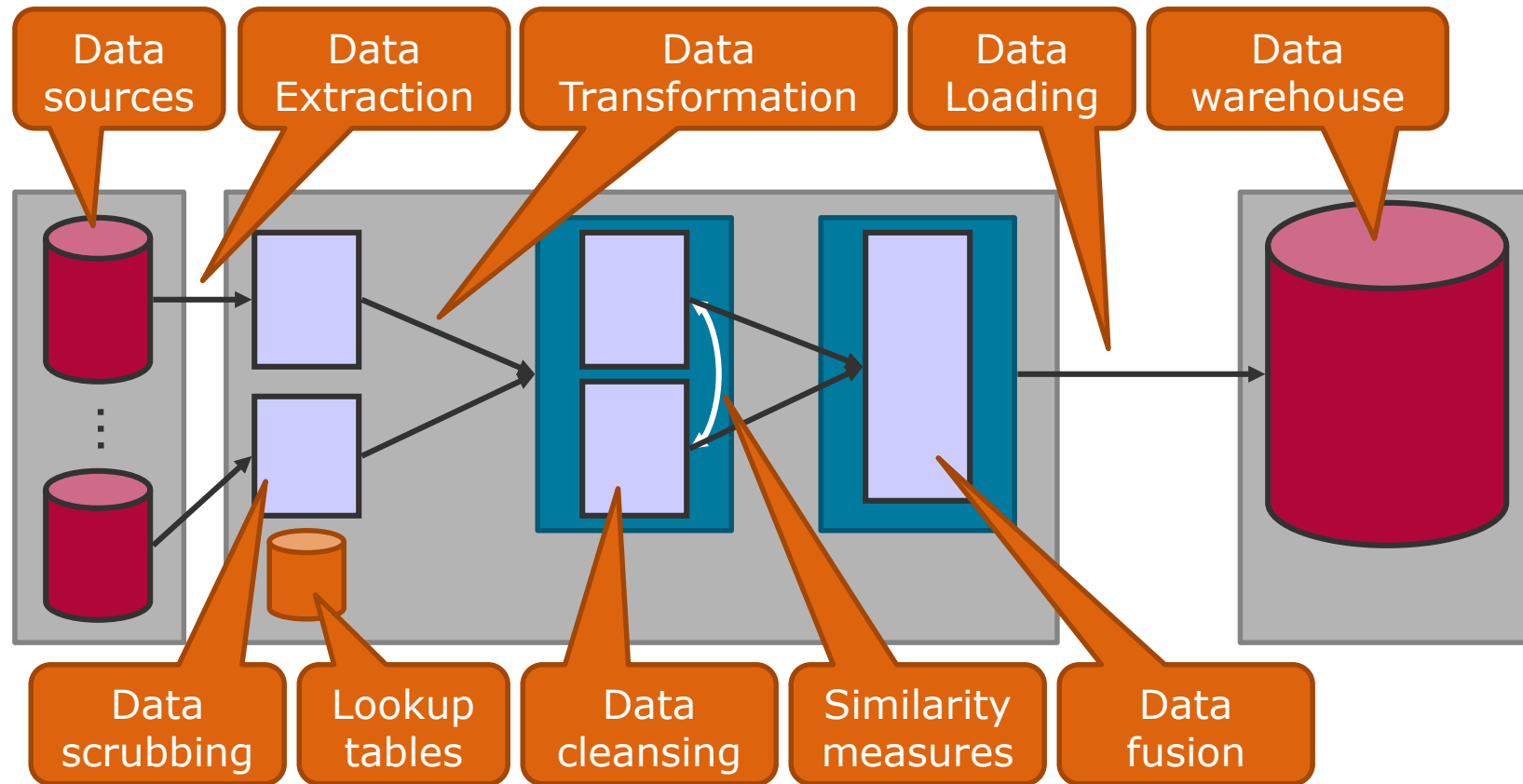
Data Cleansing Tasks – Profiling

- Data source discovery
 - Metadata
 - UDDI / matchmaking
- Schema discovery
 - Schema matching and mapping
 - Profiling for metadata (keys, foreign keys, data types, ...)
- Data discovery
 - Column-level: Null-values, domains, patterns, value distributions / histograms
 - Table-level: Data mining, rules

Data Cleansing Tasks – Cleaning

- Extraction from sources
 - Technical and syntactic obstacles
- Transformation
 - Schematic obstacles
- Standardization
 - Syntactic and semantic obstacles
- Duplicate detection
 - Similarity functions
 - Algorithms
- Data fusion / consolidation
 - Semantic obstacles
- Loading into warehouse / presenting to user

Integration and Cleansing: ETL



Human Interaction is Needed

- Components to implement
 - Wrappers for technical heterogeneity
 - Schema integration based on correspondences
 - Similarity measure for schema elements
 - Similarity measure for records
- Knobs to turn
 - Thresholds for similarity measures
 - Partition size / window size
- Expert guidance
 - Rule selection / rule specification
 - Schema matching
 - Duplicate detection
 - Data fusion

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‘Resurrected,’ but still wallowing in red tape

Government records incorrectly kill off thousands, and there’s no easy fix

By **Alex Johnson and Nancy Amons**

Reporters

MSNBC and NBC News

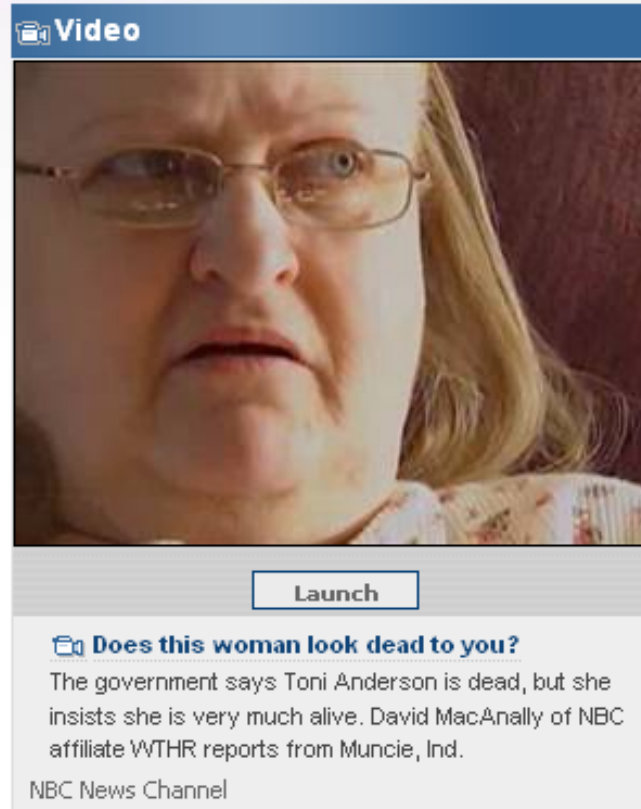
updated 6:21 p.m. ET Feb. 29, 2008

For a dead woman, Laura Todd is awfully articulate.

“I don’t think people realize how difficult it is to be dead when you’re not,” said Todd, who is very much alive and kicking in Nashville, Tenn., even though the federal government has said otherwise for many years.

Todd’s struggle started eight years ago with a typo in government records. The government has reassured her numerous times that it has cleared up the confusion, but the problems keep coming.

[Story continues below ↓](#)



Video

Launch

Does this woman look dead to you?

The government says Toni Anderson is dead, but she insists she is very much alive. David MacAnally of NBC affiliate WTHR reports from Muncie, Ind.

NBC News Channel

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SPIEGEL ONLINE

28. Januar 2008, 11:27 Uhr

FRANKREICH

Telefonkundin erhält Rechnung über 63 Millionen Euro

Als eine Französin aus Lothringen unlängst ihre Telefonrechnung bekam, blieb ihr buchstäblich die Spucke weg: 63 Millionen Euro sollte sie begleichen. Dabei hatte sie ursprünglich nur um Korrektur einer Abrechnung in Höhe von 67 Euro gebeten.

Paris - "Da muss wohl ein Komma verrutscht sein", zitiert "Le Figaro" heute den Vizedirektor der französischen Telefongesellschaft Télé2, Olivier Anstett. Die Kundin aus dem Ort Herserange in der Nähe von Metz hatte sich zunächst über einen ihrer Meinung nach zu hohen Rechnungsbetrag von 67,69 Euro bei der Telefongesellschaft beschwert. Als eine Antwort ausblieb, schickte sie einen zweiten Brief. Daraufhin erhielt sie eine "korrigierte" Rechnung über die Summe 63.280.067,96 Euro.

"Uns bleibt nur, uns bei der Kundin zu entschuldigen und dafür zu sorgen, dass so etwas nie wieder vorkommt", so der lapidare Kommentar des Vizechefs von Télé2.

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Common Sense

Southwest
NEWSPAPER

Published on Chanhassen Villager (<http://www.chanvillager.com>)

Property mistakenly valued at \$189 million

By rcraw
Created 12/03/2007 - 4:46pm

Property mistakenly valued at \$189 million results in tax adjustments in county

An \$18,900 Waconia property that was mistakenly valued at \$189 million is “throwing a wrench” into property tax statements and the Carver County budget. County officials issued a press release Monday detailing the problem that came to light last week.

An error was identified in the estimated market valuations used to calculate Pay 2008 Proposed Property Taxes, according to the release. The County Assessor’s Office placed an incorrect estimated market value on a parcel located in the city of Waconia, apparently resulting in extra zeroes being added to the value.

The mistake results in an imbalance in the amount of property taxes the county was expecting to collect. The mistake added about \$900,000 in expected revenue, according to County Administrator David Hemze.

The county is planning to consider recommendations to cut the 2008 budget by \$900,000 so that proposed property taxes will match tax notices sent to residents in November.

“It kind of threw a wrench into everything,” said Hemze. “It’s unfortunate. It’s a mistake and we’re concentrating on responding to the mistake and trying to ensure that it doesn’t happen again.” If the county does not cut the budget by \$900,000, the county portion of property taxes would go up for all properties in the county. The effect would be greatest in Waconia, but Hemze said the average-valued home outside of Waconia would also experience a \$29 increase on top of the number indicated on the November tax notices.

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Google searches for Britney Spears

Source: <http://www.google.com/jobs/britney.html>

488941 britney spears	29 britent spears	9 brinttany spears	5 brney spears	3 britiy spears	2 brirreny spears
40134 brittany spears	29 brittnany spears	9 britanay spears	5 broitney spears	3 britmeny spears	2 britany spears
36315 brittney spears	29 britttany spears	9 britinany spears	5 brotny spears	3 britneeeey spears	2 britttany spears
24342 britany spears	29 btiney spears	9 britn spears	5 bruteny spears	3 britnehy spears	2 britttney spears
7331 britny spears	26 birttney spears	9 britnew spears	5 btiyney spears	3 britnely spears	2 britain spears
6633 briteny spears	26 breitney spears	9 britneyn spears	5 btrittney spears	3 britnesy spears	2 britane spears
2696 brittney spears	26 brinity spears	9 britney spears	5 gritney spears	3 britnetty spears	2 britaneny spears
1807 briney spears	26 britenay spears	9 brtiny spears	5 spritney spears	3 britnex spears	2 britania spears
1635 brittny spears	26 britneyt spears	9 britttney spears	4 bittny spears	3 britneyxxx spears	2 britann spears
1479 brintey spears	26 brittan spears	9 brtny spears	4 bnritney spears	3 britnity spears	2 britanna spears
1479 britanny spears	26 brittne spears	9 brytny spears	4 brandy spears	3 britntey spears	2 britannie spears
1338 britny spears	26 btittany spears	9 rbitney spears	4 rbritney spears	3 britnyey spears	2 britannt spears
1211 britnet spears	24 beitney spears	8 birtiny spears	4 breatiny spears	3 britterny spears	2 britannu spears
1096 britiney spears	24 birteny spears	8 bithney spears	4 breetney spears	3 brittneey spears	2 britanyl spears
991 britaney spears	24 brightney spears	8 brattany spears	4 bretiney spears	3 britttney spears	2 britanyt spears
991 britnay spears	24 brintiny spears	8 breitny spears	4 brfitney spears	3 britttneyey spears	2 briteeny spears
811 brithney spears	24 britanty spears	8 breteny spears	4 briattany spears	3 brytyen spears	2 britenany spears
811 brtiney spears	24 britenny spears	8 brightny spears	4 brieteny spears	3 bryytney spears	2 britenet spears
664 birtney spears	24 britini spears	8 brintay spears	4 briety spears	3 brltney spears	2 briteni spears
664 brintney spears	24 britnwy spears	8 brinttey spears	4 briitny spears	3 broteny spears	2 britenys spears
664 briteney spears	24 brittnti spears	8 briotney spears	4 briittany spears	3 brtaney spears	2 britianey spears
601 bitney spears	24 brittnie spears	8 britanys spears	4 brinie spears	3 brtiiany spears	2 britin spears
601 brinty spears	21 birtitney spears	8 britley spears	4 brinteny spears	3 brtinay spears	2 britinary spears
544 brittaney spears	21 birtany spears	8 britneyb spears	4 brintne spears	3 brtinney spears	2 britmy spears
544 brittnay spears	21 biteny spears	8 britnrey spears	4 britaby spears	3 brtitany spears	2 britnane spears
364 britey spears	21 bratney spears	8 britnty spears	4 britaey spears	3 brtiteny spears	2 britnat spears
364 brittyny spears	21 britani spears	8 brittner spears	4 britainey spears	3 brtnet spears	2 britnbey spears
329 brtney spears	21 britanie spears	8 brottany spears	4 britinie spears	3 brytiny spears	2 britndy spears
269 bretney spears	21 briteany spears	7 baritney spears	4 britinney spears	3 btney spears	2 britneh spears
269 britneys spears	21 brittay spears	7 birntey spears	4 britmney spears	3 drittney spears	2 britneney spears
244 britne spears	21 brittinay spears	7 biteny spears	4 britnear spears	3 pretney spears	2 britney6 spears
244 brytney spears	21 brtany spears	7 bitiny spears	4 britnat spears	3 rbritney spears	2 britneye spears
220 breatney spears	21 britany spears	7 breateny spears	4 britneuy spears	2 barittany spears	2 britneyh spears
220 britiany spears	19 birney spears	7 brianty spears	4 britnewy spears	2 bbbritney spears	2 britneym spears
199 britnney spears	19 brirtney spears	7 brintye spears	4 britnmey spears	2 bbitney spears	2 britneyyy spears
163 britnry spears	19 britnaey spears	7 britianny spears	4 brittaby spears	2 bbritny spears	2 britnhey spears
147 breatny spears	19 britnee spears	7 britly spears	4 brittery spears	2 bbrittany spears	2 britnjeys spears
147 brittiney spears	19 britony spears	7 britnej spears	4 britthey spears	2 beitany spears	2 britnne spears
147 britty spears	19 brittany spears	7 britneyu spears	4 brittinaey spears	2 beitny spears	2 britnu spears
147 braitney spears	19 britttany spears	7 britniy spears	4 brittnat spears	2 bertany spears	2 britney spears

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Duplicate announcement
in same newspaper on same day

KURZ & KNAPP

**Musikschulfest
in Kleinmachnow**

KLEINMACHNOW | Ein Musikschulfest veranstaltet die Kreismusikschule Potsdam-Mittelmark am Samstag, dem 19. Juni, in ihrem Haus in Kleinmachnow, Am Weinberg 20. Von 14 bis 20 Uhr werden Konzerte der Fachbereiche auf der Freilichtbühne, „Schnupperstunden“ der Schule, das Quiz „Musikalischer Irrgarten“ und vieles mehr geboten.

KURZ & KNAPP

**Musikschule
lädt ein**

KLEINMACHNOW | Die Kreismusikschule „Engelbert Humperdinck“ lädt für den kommenden Samstag, 19. Juni, zum diesjährigen Musikschulfest nach Kleinmachnow ein. Auf einer Freilichtbühne, in der Musikschule (Am Weinberg) und in der Aula des Weinberggymnasiums erwartet die Besucher von 14 bis 18 Uhr ein vielseitiges musikalisches Programm. Orchester, Ensembles, Bands und Solisten zeigen ihr Können. Um 15 Uhr wird „Alte Musik“ vorgestellt, ab 15.30 Uhr geht es um die „Faszination Schlagzeug“. Für das leibliche Wohl ist gesorgt.

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Directmarketing by The Economist

[[[BARCODES AND POSTNET CODES]]]

QWMQ0071368
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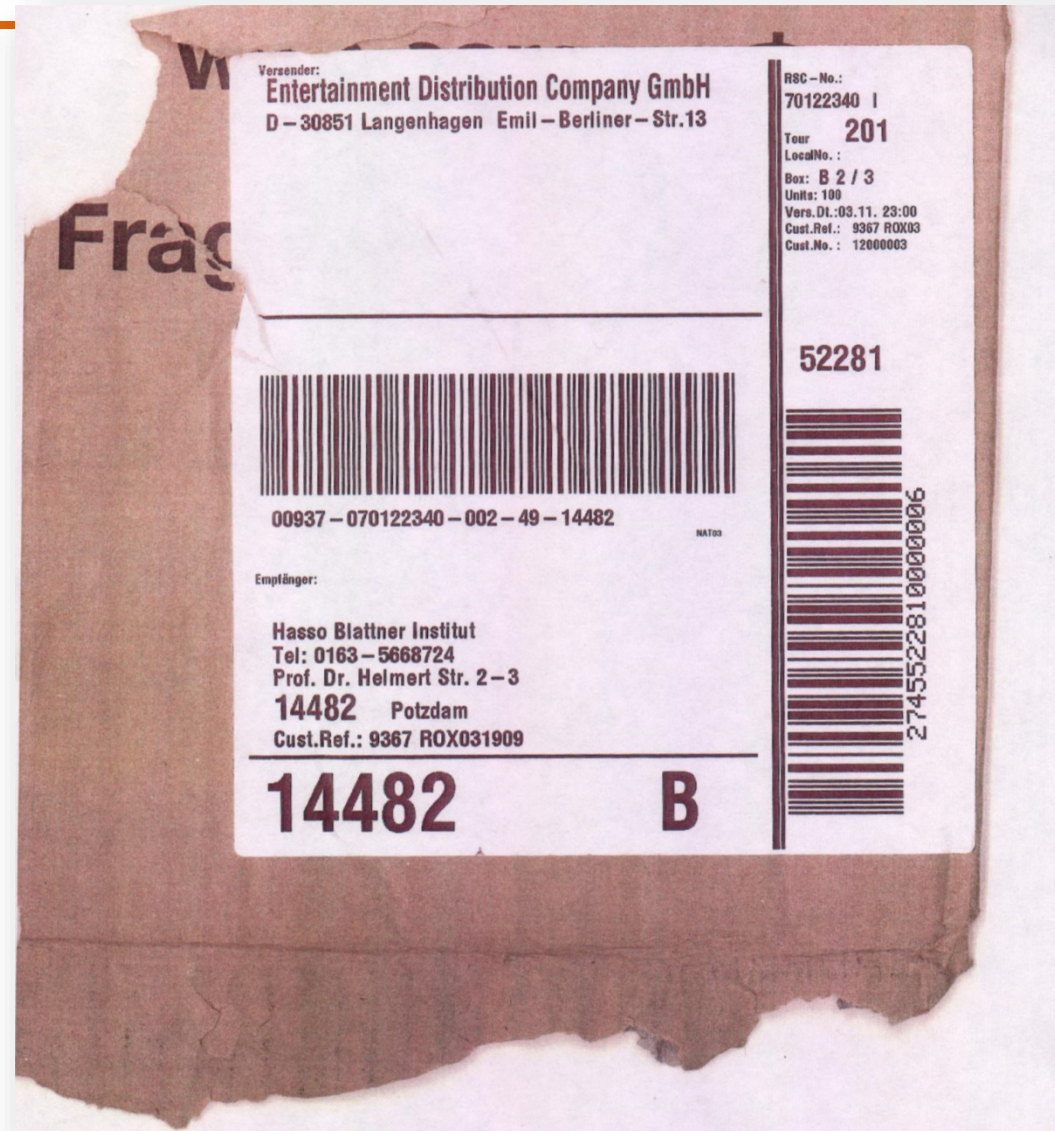
FIFA registration form (2010)

Nationality
Country of Residence
Mother Tongue
Preferred FIFA Language
Secondary FIFA Language
Personal Details
Organisation Name
Organisation Role (Prof)
Notes (Max 2000 chars)

with a public account such as Hotmail or \

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Hasso Blattner Institut, Potsdam



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Fraudulent Transaction Duplicate

29.03	30.03	ELECTRONIC EDUCATIONAL 08779288701 CO	225,08	USD	1,341359	167,80	✓
30.03	30.03	ENTGELT FÜR AUSLANDSEINSATZ				1,67	
29.03	30.03	ELECTRONIC EDUCATIONAL 08779288701 CO	225,08	USD	1,341359	167,80	5 ✓
30.03	30.03	ENTGELT FÜR AUSLANDSEINSATZ				1,67	

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Product Duplicate


1.



Acer P 5370 W DLP-Projektor HD-Ready (Kontrast 2000:1, 3000 ANSI Lumen, WXGA 1280 x 800 Pixel) schwarz von Acer (9. Januar 2009)

Neu kaufen: **EUR 729,00** [23 Angebote](#) ab **EUR 729,00**

Lieferung bis **Dienstag, 5. Januar**: Bestellen Sie innerhalb der nächsten **1 Stunde** per Overnight-Express.

★★★★★ (1) 

Elektronik & Foto: [Alle 6 Artikel ansehen](#)

2.



Acer P5370W HD-Ready Projektor HDMI (WXGA, 1280x800, 3000 ANSI Lumen, 2400 ANSI Lumen Eco-Mode, Kontrast: 2000:1) schwarz von Acer (9. Januar 2009)

Neu kaufen: **EUR 729,00** [2 Angebote](#) ab **EUR 666,40**

Auf Lager.

★★★★★ (2)

Elektronik & Foto: [Alle 6 Artikel ansehen](#)

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CD Duplicate

- 

1. **Dile Al Sol** von La Oreja de Van Gogh (**Audio CD** - 2007)
Neu kaufen: ~~EUR 25,99~~ [20 Angebote](#) ab **EUR 4,95**
Nicht auf Lager. Bestellen Sie jetzt und wir liefern, sobald der Artikel verfügbar ist

- 

2. **Dile Al Sol** von La Oreja de Van Gogh (**Audio CD** - 1999)
[1 Angebote](#) ab **EUR 4,99**
- 

3. **Dile Al Sol** von La Oreja de Van Gogh (**Audio CD** - 2007)
Neu kaufen: ~~EUR 16,99~~ **EUR 15,97** [8 Angebote](#) ab **EUR 6,46**
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Reviewer Complaint (german)



Das neue Filmlexikon 2009 (DVD-ROM)

von [United Soft Media Verlag GmbH](#)

Plattform:  Windows XP / Vista

([1 Kundenrezension](#))

Preis: **EUR 30,95** & kostenlose Lieferung mit **Amazon Prime**.

Auf Lager.

1 von 1 Kunden fanden die folgende Rezension hilfreich:

Redaktionell lieblos erweitert, 22. Januar 2009

Von [Thomas Georg Maria Mainka](#) - [Alle meine Rezensionen ansehen](#)

Zuerst das positive: Gegenüber der 2006er Ausgabe ist die Software deutlich stabiler geworden. Abstürze, die man mit Affengriff und Taskmanager beseitigen muß, kommen glücklicherweise nicht mehr vor.

Ansonsten hat sich an der Software so gut wie nichts geändert.

Redaktionell mußte ich jedoch feststellen, daß die Anzahl an Doubletten (also Doppeleinträge ein und des selben Films mit geringfügigen abweichenden Daten wie Laufzeitunterschiede von 1 Minute, oder 35mm ./.. Video bzw. teilweise unvollständigen Darsteller- bzw. Filmstab-Listen) deutlich zugenommen haben. (Zumindestens ist mir dies bei den Märchenfilmen - meinem privaten Sondersammelgebiet - besonders aufgefallen)

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dblp.uni-trier.de

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- ◆ [Stefan Deßloch](#)
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Michael Ley (ley@uni-trier.de) Thu Jan 31 10:44:06 2008

False Duplicates

Melanie Weis

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2006

- 7 [EE](#) [Sven Puhmann](#), [Melanie Weis](#), [Felix Naumann](#): XML Duplicate Detection Using Sorted Neighborhoods. [EDBT 2006](#): 77
- 6 [EE](#) [Melanie Weis](#), [Felix Naumann](#): Detecting Duplicates in Complex XML Data. [ICDE 2006](#): 109
- 5 [EE](#) [Jan Hegewald](#), [Felix Naumann](#), [Melanie Weis](#): XStruct: Efficient Schema Extraction from Multiple and Large XML Documents

2005

- 4 [EE](#) [Melanie Weis](#), [Felix Naumann](#): DogmatX Tracks down Duplicates in XML. [SIGMOD Conference 2005](#): 431-442
- 3 [EE](#) [Alexander Bilke](#), [Jens Bleiholder](#), [Christoph Böhm](#), [Karsten Draba](#), [Felix Naumann](#), [Melanie Weis](#): Automatic Data Fusion
- 2 [EE](#) [Melanie Weis](#), [S. Müller](#), [Claus-E. Liedtke](#), [Martin Pahl](#): A framework for GIS and imagery data fusion in support of cartography

2004

- 1 [EE](#) [Melanie Weis](#), [Felix Naumann](#): Detecting Duplicate Objects in XML Documents. [IQIS 2004](#): 10-19

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Die doppelte Gabi!



Links Gabi, geboren am 10. August in Osterburg 1957, wohnt jetzt in Dresden, verheiratet, 2 Söhne (25, 27) und rechts Gabi, geboren am 10. August 1957, wohnt in Dresden, verwitwet, 2 Töchter (33, 34)
Foto: Dirk Surow

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Status change
from „booked“ to „Booked“

Gebuchte Einträge


Der Status für diesen Flug hat sich von **gebucht** auf **Gebucht** geändert.
Bitte überprüfen Sie die nachstehenden Änderungen.


Flug: Berlin nach Nürnberg


[zurück](#) ↑


E-Ticket - Der Kauf wurde von der Fluglinie bestätigt. Es werden keine Tickets per Post
zugestellt. Ihr Ticket, welches das herkömmliche Papierticket ersetzt, erhalten Sie am Check-in


Manual Data Fusion


 **Mary:** Hi, my name is Mary. How may I help you?


 **Felix Naumann:** Hi, I am Felix


 **Felix Naumann:** I am area editor of "Information System".


 **Mary:** Hello Felix, how can I help you today?


 **Felix Naumann:** I would like to assign a reviewer to a submission. The reviewer is already registered twice in the system. Once with an old email adress, and once with an incorrect name. The person is Barbara Pernici.


 **Mary:** Ok, did you want me to merge her accounts?


 **Felix Naumann:** Sure, merging her accounts would be a first step. The correct email address is barbara.pernici@polimi.it and of course her name is "Barbara Pernici" and not "Barbara Barbara Pernici".


 **Felix Naumann:** Can you let me know, once the files are corrected. Thank for your help!

 **Mary:** Her name has been corrected and the accounts merged.

 **Mary:** Is there anything else I can help you with?

 **Felix Naumann:** No, perfect. Thanks, Mary.

 **Mary:** You are welcome Felix.

 **Mary:** It was a pleasure assisting you today. If you require any further assistance please contact us again. To close this chat session, please click the Close button in the top corner of this chat window.

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An Ironic Duplicate

Details (Similarity: 0.9683)

▼ Same Attributes Values

Attribute	Value
booktitle	Proc. ACM SIGMOD Int. Conf. on Management of Data
year	2005
type	inproceedings
otherauthors	false

▼ Different Attributes Values

Dong05	Attribute	dong:sigmod05
Xin Dong, Alon Halevy, Jayant Madhavan	author	Xin Dong, Alon Y. Halevy, Jayant Madhavan
Reference reconciliation in complex information spaces	title	Reference Reconciliation in Complex Information Spaces
85–96	pages	85-96

Close

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Translation problems

LIVE BBC NEWS CHANNEL

Page last updated at 11:45 GMT, Thursday, 19 February 2009

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The mystery of Ireland's worst driver

Details of how police in the Irish Republic finally caught up with the country's most reckless driver have emerged, the Irish Times reports.

He had been wanted from counties Cork to Cavan after racking up scores of speeding tickets and parking fines.



Poles are Ireland's largest immigrant population

However, each time the serial offender was stopped he managed to evade justice by giving a different address.

But then his cover was blown.

It was discovered that the man every member of the Irish police's rank and file had been looking for - a Mr Prawo Jazdy - wasn't exactly the sort of prized villain whose apprehension leads to an officer winning an award.

In fact he wasn't even human.

"*Prawo Jazdy* is actually the Polish for driving licence and not the first and surname on the licence," read a letter from June 2007 from an officer working within the Garda's traffic division.

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"Having noticed this, I decided to check and see how many times officers have made this mistake.

"It is quite embarrassing to see that the system has created Prawo Jazdy as a person with over 50 identities."

The officer added that the "mistake" needed to be rectified immediately and asked that a memo be circulated throughout the force.

In a bid to avoid similar mistakes being made in future relevant guidelines were also amended.

And if nothing else is learnt from this driving-related debacle, Irish police officers should now know at least two words of Polish.

As for the seemingly elusive Mr Prawo Jazdy, he has presumably become a cult hero among Ireland's largest immigrant population.



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Skill duplicate

Torsten has endorsed you for new skills and expertise!



Data Integration x

Add To Skip



Felix Naumann [Edit](#)

Professor at Hasso-Plattner-Institute (Potsdam, Germany)

Berlin Area, Germany | Information Technology and Services

Current Qatar Computing Research Institute (QCRI), Hasso-Plattner-Institut

Previous IBM Almaden Research Center, Humboldt-Universität, IBM Almaden Research Center

Education PhD, Computer Science at Humboldt-Universität zu Berlin

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NEW Add sections to highlight achievements and experiences on your profile. [Add sections](#)

Summary [Edit](#)

Specialties
Data quality, data integration, data cleansing (duplicate detection), data profiling



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Two different(!) LDOW 2012 papers

Metadata Statistics for a Large Web Corpus

Peter Mika, Tim Potter
Yahoo! Research
Diagonal 177, Barcelona, Spain
{pmika, tep}@yahoo-inc.com

April 14,

1 Introduction

Embedding metadata inside HTML pages is common on the Web, often preferred by publishers and consumers of structured data, such as publishing data feeds and documents. Publishers prefer this method due to its simplicity: since most webpages are dynamically generated, extending the template that produces the pages is already accustomed to processing HTML and extracting data. The close coupling of the raw

Metadata Statistics for a Large Web Corpus

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Tim Potter
Yahoo! Research
Diagonal 177
Barcelona, Spain
tep@yahoo-inc.com

ABSTRACT

We provide an analysis of the adoption of metadata standards on the Web based on a large crawl of the Web. In particular, we look at what forms of syntax and vocabularies publishers are using to mark up data inside HTML pages. We also describe the process that we have followed and the difficulties involved in web data extraction.

1. INTRODUCTION

Embedding metadata inside HTML pages is one of the ways to publish structured data on the Web, often preferred by publishers and consumers over other methods of exposing structured data, such as publishing data feeds, SPARQL endpoints or RDF/XML documents. Publishers prefer this method due to the ease of implementation and maintenance: since most webpages are dynamically generated, adding markup simply requires extending the template that produces the pages. Consumers such as search engines are already accustomed to processing HTML and extraction

are a number of factors that complicate the comparison of results. First, different studies use different web corpora. Our earlier study used a corpus collected by Yahoo!'s web crawler, while the current study uses a dataset collected by the Bing crawler. Bizer et al. analyze the data collected by <http://www.commoncrawl.org>, which has the obvious advantage that it is publicly available. Second, the extraction methods may differ. For example, there are a multitude of microformats (one for each object type) and although most search engines and extraction libraries support the popular ones, different processors may recognize a different subset. Unlike the specifications of microdata and RDFa published by the RDFa, the microformat specifications are also rather informal and thus different processors may extract different information from the same page. Further, even if the same information is extracted, the conversion of this information to RDF may differ across implementations. Third, different extractors may be lenient in accepting particular mistakes in the markup, leading to more or less information extracted.

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Bewerbung für das Wintersemester 09/10

Angaben zur Person

Nachname: [REDACTED]

Vorname: [REDACTED]

Geschlecht männlich

Titel:

Namenszusatz:

Geburtsdatum: 24.07.1991

Hinweis: Ihr Online-Bewerbungssystem erfordert es, dass ich mich als ein Jahr älter ausbebe, also ich bin ("Das Mindestalter für den Hochschulzugang beträgt: 17"). Mein eigentliches Geburtsdatum ist der 24.7.1992, sodass ich zu Studienbeginn bereits 17 Jahre alt sein werde. Diese Änderung wurde mir durch das Studierendensekretariat empfohlen

Geburtsort: Erlangen

Geburtsname:

Staatsangehörigkeit: Deutschland

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Me – a duplicate

Dear CMT Support,

I noticed that the April/May Revision tracks have two records for meta reviewer, Felix Naumann. I tried to delete them and add him again, but each time the system produced two entries for him. This problem doesn't exist for other tracks. Can you look into the reason? Thank you.

Chen

Felix	Naumann	Felix.Naumann@hpi.uni-potsdam.de	Hasso Plattner Institut Potsdam	Primary: Information Integration\Information Integration Secondary: Information Integration\Data Cleansing and Data Profiling; Information Integration\Heterogeneous and Federated DBMS; Information Integration\Information Filtering and Dissemination; Information Integration\Meta-data Management; Information Integration\Other Integration or Web; Information Integration\Social Systems and Recommendations; Information Integration\Web Data Management; Information Integration\Web Services and Web Service Composition;	No	No	0	[X]	[X]
Felix	Naumann	Felix.Naumann@hpi.uni-potsdam.de	Hasso Plattner Institut Potsdam	Primary: Information Integration\Information Integration Secondary: Information Integration\Data Cleansing and Data Profiling; Information Integration\Heterogeneous and Federated DBMS; Information Integration\Information Filtering and Dissemination; Information Integration\Meta-data Management; Information Integration\Other Integration or	No	No	0	[X]	

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JDIQ author list by ACM

real-world applications, datasets and other experiences in handling poor

Ramamurthy, Karthikeyan ; Mojsilovic, Aleksandra

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