

Data Modeling Trends

- Trends
 - Mainstream NoSQL projects ("Modernizing")
 - Knowledge graphs getting the spotlight
 - Al growing, growing, growing
- More connecting and less explanatory
- Sharing over lecturing
- Your insights as well please!
- Learn at least three new things!









Scope (What is the scope of the initiative?) Bounded Context / Domain Eric Evans Project Fraud detection for auto insurance Northeast Products Analytics • London hotel survey application • Fraud detection for all LOB Program • **Enterprise Products Analytics** Hotel chain survey application •

(Which is m	Focus (Which is more important, flexibility or simplicity?)						
	Abstract	• Party					
Focus	(flexible)	• Event					
Only setting		Intellectual Unit					
which can be at	Concrete	Customer					
a subject level	(simple)	• Order					
within a model		• Book					



		Filter
		(Are we forward or reverse engineering?)
a la	Filter	
	Business	• The business calls it a 'classification'.
	(forward)	What patterns are of interest?
		• I need a 360 degree view of customer.
	Application	• SAP calls it a 'characteristic'.
	(reverse)	• What connections exist in this data set?
		I need to extract fields from this JSON
		file.

Anore	Mode 🗸
ON OFF	(What is the purpose of the application?)
RDBMS	 Benefit: Precisely representing data through sets Captures: Business rules <u>constraining</u> a business process Primary use case: Operational (OLTP) Modeling: Relational A Customer must own at least one Account. Benefit: Precisely representing how data will be analyzed Captures: Business questions <u>analyzing</u> a business process Primary use case: Analytics (OLAP) Modeling: Dimensional How much revenue did we generate in fees by Date, Region, and Product? Also want to see by Month
NoSQL	 and Year Benefit: Precisely representing how data will be received and accessed Captures: Access paths <u>providing insights</u> into a business process Primary use case: Discovery Modeling: Query Which customers own a checking account that generated over \$10,000 in fees this year, own at least one cat, and live within 500 miles of New York City?

		Mod	e (Pui	rpose	?): RD	BMS	CRAZE SALE ON OFF
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Align > Refine > Desigr	n Overview
<u>Align (Business Terms - BTM)</u>	"Which are your pets?"
Common business vocabulary	"Do you like landscapes or
Important terms, their relationships, and definitions	portraits?"
"This is what we need to photograph."	"Action or posed shots?"
Refine (Logical - LDM)	
What is needed for a specific initiative	
Independent of technology	
"We've taken the picture."	and a second
Design (Physical - PDM) Neo4j Cassandr	a
Instantiation (schema)	
Compromised for technology	
"We can print it on a mug." Oracle	

Overview							
	Relational Dimensional NoSQL						
Business Terms (Align)	Terms and rules	Terms and paths	Terms and queries				
Logical (Refine)	Sets	Measures with context	Query-focused hierarchy*				
Physical (Design)	Compromised sets	Star schema or snowflake	Enhanced hierarchy*				
*Exceptions including graph							

Exceptions including graph







Customer Category		Cus	stomer	Branch
Customer Category Code		Cust	tomer Number	Branch Code
Customer Category Name	Group	Cusi Cusi Cusi Cusi	tomer Category Code (Fł tomer First Name tomer Last Name tomer Birth Date	K) Branch Manager First Name Branch Manager Last Name Manage
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Relatio	nal Dimensional	NoSQL		
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Logical (Refine) Sets	Measures with context	Query-focused hierarchy		Account Number (FK) Account Fee Incurred Date
Physical (Design) Compror sets	nised Star schema or snowflake	Enhanced hierarchy		Account Fee Amount



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Common NoSQL patterns

Category	Patterns
Computation	Approximation
Grouping	• Bucket
Lifecycle	Document Versioning
	Envelope
Polymorphism	Inheritance

And many more!!





The Bucket Pattern

- Repeating Attributes technique + optionally summarization
- Fixed arrays to avoid references
- One-to-many that can't be embedded
- IoT, DW

ket	1 🗹 🖉
pk	doc *
	str
	date
	arr
	doc
	date
	int32
	pk



Account

Account Number

Customer Number (FK) Branch Code (FK) Account Open Date Account Type Code 1 Account Type Name 1 Account Type Code 2 Account Type Name 2 Account Type Code 3 Account Type Name 3

The Document Versioning Pattern

- SCDs for documents
- Keep history
- Financial, insurance, and legal apps



customer_id	pk	str	*
revision		int32	*
ts		date	*
name		str	
∃ insured_items		arr	
🖃 [0] home		doc	
type		str	*
address		str	
🖃 [1] life		doc	
type		str	*

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The Envelope Pattern

- Separate data intended for consumption from data intended to optimize the power and flexibility of the database and application.
- Dat lineage, integration

Envelope			
_id	pk	str	*
🖃 header		doc	
schema_version		num	
docRevision		num	
creation_ts		date	
last_update_ts		date	
created_by		str	
⊡ provenance		doc	
source		str	
lineage		str	
harmonization		doc	
zipcode		str	
phone		str	
⊡ related_to		arr	
[0]		str	
🖃 payload		doc	
		str	
			-

Envelope wraps metadata like version numbers, timestamps, lineage, or other data used for indexing or other database operations. Payload contains the

actual data intended to be consumed by the application.



Education: DMZ Sessions

- A Practical Use Case for NoSQL Data Modeling at American Express. Eve Danoff, American Express
- MongoDB Schema Design Patterns. Daniel Coupal, MongoDB
- Use JSON models to give your logical models life as a semantic layer. Rob Garrison, Compassion International
- Oracle 23c Duality Views: expose data stored in relational tables as JSON documents and get the best of both worlds! Pascal Desmarets, Hackolade and Beda Hammerschmidt, Oracle
- LDM + NoSQL? Mini-Hackathon. Pascal Desmarets and Marco Wobben







Data Modeling Trend #2

- Knowledge graphs getting the spotlight
- Impacts
 - Data modelers and data scientists collide
 - Traditional modelers extending their skills to include knowledge graphs, or being excluded from exciting machine learning and AI
- Response
 - Fact-based modeling
 - Learning



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From traditional data modeling to knowledge graphs Tables to Resource Description Framework (RDF) Attribute value to Triple (Subject-Predicate-Object) Surrogate key to URI CDM to Ontology DDL to OWL SQL to SPARQL Metadata to "kinds of things" Data to "things" Benefits: focus on things and make inferences ٠ Pete Stiglich Present July 19, 2023 What topic is Steve Hoberman Anindita Mahapatra Present October 3, 2023 talking about today? Steve Hoberman Present November 7, 2023 July 19, 2023 Topic "Specialized Database Types and Their Applications" October 3, 2023 Topic "Data Management and AI/ML" November 7, 2023 Topic "Top Three Data Modeling Trends"

data

Education: DMZ Sessions

- Unleashing Data's Potential: Mastering Precision with FCOIM. Marco Wobben, CaseTalk
- The Great Escape: Liberating 20+ Years of Legacy Data into Knowledge Graphs and Semantics with AI. Eliud Polanco, Fluree
- Unlocking Enterprise Intelligence: Integrating BI, Bayesian Networks, and OLAP Cubes into Knowledge Graphs. Eugene Asahara, Kyvos
- Avoiding Silos with Semantic Technology Part 1: Introduction to Semantics, Ontology, and OWL. Michael Uschold, PhD, Semantic Arts
- Avoiding Silos with Semantic Technology Part 2: Semantics in Practice. Michael Uschold, PhD, Semantic Arts
- Leveraging data quality checks, predictive modeling, and knowledge graph for credit card fraud detection: A Comprehensive Framework. Rafid Reaz, DMC, Scotia Bank
- Getting Data in and out of a Knowledge Graph. Michael Uschold, PhD, Semantic Arts
- Semantic Knowledge Graphs in Action with Ontotext GraphDB. Sumit Pal, Ontotext
- Zero Copy Integration. Dave McComb, Semantic Arts



Data Modeling Trend #3

- Al experimentations
- Impact
 - Data modelers leveraging AI, or, at some point in the future, AI becoming the data modeler
- Response
 - Learning
 - TLDR AI
 - DMZ



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Thank you for the clarification. In that case, we need to adjust the database design to accommodate the fact that an adopter can be interested in multiple animals and have a different status for each. We can achieve this by introducing a many-to-many relationship between the Adopter and Animal entities, along with an additional table to track the status of each adoption interest. Here's the revised design:

Entities and Attributes:

1. Animal Entity:

\$

- * AnimalID (Primary Key): Unique identifier for each animal. Data Type: Integer or GUID.
- Name: Name of the animal. Data Type: String.
- · AdmissionDate: Date when the animal was admitted. Data Type: Date/Time.
- * AvailableForAdoption: Boolean flag indicating if the animal is available for adoption.

Fix

mistakes



Education: DMZ Sessions

- What does AI have to do with Data Modeling? Kim Sever
- Data Literacy from an Early Age in the Age of AI: Empower Your Organization. Chandra L. Donelson, Army Intel Deputy Chief Data Officer, Pentagon and Jordan Morrow, DataPrime
- Our Friend the LLM Mini-Hackathon. Kim Sever.
- Mastering Large Language Models: A Practical Workshop. Thomas Niccum, PhD, Iseyon





Other Data Modeling Trends

- Databricks/Snowflake
- Data mesh
- ???



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- Trends
 - Mainstream NoSQL projects ("Modernizing")
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