



Practitioner's Guide to
Operationalizing
Data
Governance

Mary Anne Hopper

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Contents

Acknowledgments xiii

Chapter 1 Introduction 1

- Intended Audience 2
- Experience 2
- Common Challenge Themes 4

Chapter 2 Rethinking Data Governance 17

- Results You Can Expect with Common Approaches to Data Governance 18
- What Does Work 21
- Rethinking Data Governance Summary 23

Chapter 3 Data Governance and Data Management 25

- Results You Can Expect Focusing Purely on Data Governance or Data Management 26
- SAS Data Management Framework 26
- Aligning Data Governance and Data Management Outcomes 38
- Misaligning Data Governance and Data Management 43
- Data Governance and Data Management Summary 45

Chapter 4 Priorities 47

- Results You Can Expect Using the Most Common Approaches to Prioritization 48
- A Disciplined Approach to Priorities 50
- Utilizing the Model 55
- Priorities Summary 64

Chapter 5 Common Starting Points 65

- Results You Can Expect with Too Many Entry Points 66
- Building a Data Portfolio 66
- Metadata 67
- Data Quality 70
- Data Profiling 75
- Common Starting Points Summary 76

Chapter 6	Data Governance Planning	77
	Results You Can Expect Without Planning	78
	Defining Objectives	78
	Defining Guiding Principles	85
	Data Governance Planning Summary	88
Chapter 7	Organizational Framework	91
	Results You Can Expect When There Is	
	No Defined Organizational Structure	92
	Organizational Framework Roles	92
	Defining a Framework	94
	Aligning the Model to Existing Structures	97
	Aligning the Framework to the Culture	100
	Simplifying the Model	103
	Defining the Right Data Stewardship Model	104
	Organizational Framework Summary	109
Chapter 8	Roles and Responsibilities	111
	Results You Can Expect When Roles and	
	Responsibilities Are Not Clearly Defined	112
	Aligning Actions and Decisions to Program Objectives	112
	Using a RACI Model	119
	Defining Roles and Responsibilities	126
	Data Governance Steering Committee	126
	Data Management	131
	Naming Names	131
	Roles and Responsibilities Summary	135
Chapter 9	Operating Procedures	137
	Results You Can Expect Without Operating Procedures	138
	Operating Procedures	138
	Workflows	146
	Operating Procedures Summary	152
Chapter 10	Communication	153
	Results You Can Expect Without Communication	154
	Communication Plan Components	154
	Sample Communication Plan	156
	Communication Summary	160
Chapter 11	Measurement	161
	Results You Can Expect Without Measurement	162
	What Measurements to Define	162
	Program Scorecard – A Starting Point	166
	Program Scorecard Sample	172
	Measurement Summary	173

Chapter 12 Roadmap	175
Results You Can Expect Without a Roadmap	176
First Step in Defining a Roadmap:	
Implementing Your Framework	176
Defining a Roadmap	178
Formality First or Save It for Later?	184
Critical Success Factors	185
Roadmap Summary	188
Chapter 13 Policies	189
Results You Can Expect Without Policies	190
Breaking Down a Policy	190
Contents of a Policy	192
Policy Example – Metadata	193
Policy Example – Data Quality	200
Policy Summary	204
Chapter 14 Data Governance Maturity	207
Results You Can Expect With Maturity	208
Data Governance Maturity Cycle	209
Maturing Your Program	215
Summary	216
About the Author	217
Glossary of Terms	219
Index	221

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CHAPTER **1**

Introduction

INTENDED AUDIENCE

As long as the practice of Data Governance has been around, the concept continues to lack sustainable adoption in many organizations. My main objective with this book is to share my experience and help you and your organization on your journey, no matter where in that journey you are.

My best guess is that you are looking at this book as a guide for one of the following reasons:

- Your organization is thinking about Data Governance.
- You have been tasked with Data Governance.
- You need to get your Data Governance program back on track.
- You have acquired a tool and want to get the most value from your investment.
- You continue to have the same data quality issues over and over.
- You attended a conference and learned about Data Governance and think it is something you need.

The content in this book is meant for a large audience because Data Governance impacts the entire organization. Whether a senior leader or an individual contributor, you may be asked to participate at some level in Data Governance, actively or passively.

This book guides you through practical steps in applying Data Governance concepts to solve business problems by adopting a disciplined approach to Data Management methods. The chapters cover prioritization, alignment of Data Governance and Data Management, organizational structures, defining roles and responsibilities, communications, measurements, operations, implementation, and policies. All of the examples presented are not conceptual; they are real-world customer examples that can be applied to your specific organization.

EXPERIENCE

You most likely have an interest in not just Data Governance, but in data itself. Do you remember your “Aha” moment that turned you into a data junkie? I remember mine clearly. In the early 1990s, I

worked for a small naval architectural firm. The focus of the firm was primarily custom high-end racing sailboat designs, including the America's Cup. One day my boss brought in a floppy disk and asked me to take a look at what was on it. Apparently, we had a client who thought his brand-new boat was slow. The disk contained the data dump from the boat's instruments. There were fields like time of day, heading, wind velocity, and boat speed. I was able to parse the data and essentially recreate the races with the available data points. What I learned was that the boat tacked nine or ten times on the first leg of each race. I know not all of you are expert sailboat racers but take my word for it; tacking that many times on any leg of a race in a big boat is slow. What did that mean for my boss? He was able to have a different conversation with our client. We were no longer defending boat design or building materials but instead talking about racing tactics and offering suggestions for improvements there first.

That day changed my view of the power of data and from that point forward I chose classes and career roles that were focused on data. Initially, I focused on database development and support and then transitioned into data warehouse development. On the IT side, I managed the development of platforms to support finance and treasury processes as well as the re-platforming of a home-grown loan servicing system. That experience enlightened me to the need for data quality processes and the understanding of data lineage and documented business rules. There came a time when I transitioned into project management, product ownership, and finally consulting. The consulting role is what has helped me most in hearing customer challenges and helping them solve those problems by instilling discipline in Data Management processes.

Over the years, I have worked with hundreds of clients across all industry verticals to help them establish that discipline in Data Management practices. In other words, helping them to establish Data Governance programs that align with their individual organization's business objectives while also considering their maturity, culture, and appetite for Data Governance.

This book is not only a reflection of a tested and proven methodology but also my experiences in what works and what doesn't work, things to not get hung up on, and where best to focus efforts. Some of

the chapters are shorter than others but I still believe the topics are important enough to cover. My hope is that this book helps you and your organization in your own Data Governance journey.

COMMON CHALLENGE THEMES

Most of what I've heard over the years can be broken down into a set of common themes. One of the best ways to talk about those themes is to share with you what I've heard my clients say. Every quote is directly from a customer. If any of these quotes resonate with you, then formalizing Data Governance can help. You will see these themes again in future chapters.

Metadata



Metadata is the practice of gathering, storing, and provisioning information about data assets. As important as it is to collect and maintain, it is a practice that does not formally exist in most organizations. Most of my customers might not necessarily use the term metadata, but the concept is top of mind for them. There is a desire to have common terms defined and have a single repository to maintain information about those terms. Because there is no formal metadata process or repository, users spend a lot of their time trying to understand data on their own or relying on others to interpret meaning for them. Another byproduct from the lack of metadata process is that users complain of not knowing what data is available to them. Always keep in mind that metadata is a precursor to data quality; I will write more about that topic in later chapters.

Here is what clients have said:

- “we need Rosetta Stone for our data”
- “metadata is so important and it doesn’t exist”
- “the most time-consuming part is to find what you’re looking for”
- “would be nice to follow the trail”
- “can’t get to confident decisions without common definitions”

- “a little bit of detective work and a little bit of knowledge”
- “this is what I mean when I say ‘this’”
- “we haven’t the foggiest idea of what the denominator is”
- “you get the data and it’s not what you meant”
- “some people just want to call it something different”

Access to Data



Oftentimes, there are very few people with the “know-how” and the tools to access data. Users who do have direct access feel they must navigate a labyrinth to get to the data they need. That labyrinth includes multiple reports, accessing tables, or calling people who have knowledge of data structures. Because of this, users find it easier to maintain their own datasets instead of accessing a common repository. In most organizations, users are anxious to have access to tools to make it easier to use data.

Here is what clients have said:

- “we got to know what the hell we got”
- “our issue isn’t so much storage, it’s access”
- “quit parking data on some machine”
- “a whole lot of horsepower to pull data out of that system”
- “you have to have your DNA tested before you get access to it”
- “not knowing something exists is a greater liability than not using what is available”
- “a lot of what we’re doing seems so hard”
- “information does not seem readily available”
- “manual data exercise to put it together”
- “we have so much information out there in so many places”
- “Excel becomes the big workhorse”
- “we’ve created a process to deal with lack of access to information”
- “want to hire an analyst, not a SQL person”
- “high-priced analyst just getting data for people”

Trust in Data



Users want the ability to make solid decisions on trusted data that is deemed a definitive source of truth. However, users feel there is a lack of consistency across data sources. Some of the reasons for this could be related to data latency, poor data collection practices, a lack of data understanding (e.g., data acceptance, service level agreements, data remediation, and data profiling), or different groups creating and maintaining their own copies of data. This results in users feeling they spend a significant amount of time validating or defending the data they do use.

Here is what clients have said:

- “depending on which query you run you get a different answer”
- “can’t create individual sources of truth”
- “the place we pull the data from doesn’t balance to itself”
- “we don’t know how reliable the data is”
- “you trust the data until you know it’s not right”
- “if you can’t fix the problem you work around it”
- “how do we know what an error looks like?”

Data Integration



Data integration consists of processes for moving and combining data that reside in multiple locations and providing a unified view of the data. In many environments, users who need access to integrated data are essentially required to pull several reports or datasets and then integrate on their desktop using MS Access or Excel. There may also be a lack of formal processes or tool usage across divisions and even in IT. More often than not, this results in differing business rules that are applied to data, which turns into discrepancies in the data results.

Here is what clients have said:

- “I’m living in spreadsheet hell”
- “really no linking it all together”

- “right now, it’s fragmented”
- “all our stuff doesn’t talk to each other”
- “being able to stitch data together is what we need”
- “our systems have never been organized to allow us to answer questions”
- “almost every prototype that we did last fiscal year had to do with the difficulty of pulling data from multiple datasets”
- “we have a lot of questions, we have a lot of data, but we can’t pull it out easily”

Data Ownership



Users do not know who to contact when there are data questions. There is a desire to have a named data owner for the various domains who can answer questions, address issues, and help users understand data usage guidelines for given datasets.

Here is what clients have said:

- “you’re stepping on toes every time you go in there”
- “everybody wants to control their own fate”
- “that’s our data so we should be able to keep up with it”
- “lack of accountability for data responsibility”
- “we don’t really know who does that”

Reporting/Analytics



Users are becoming more data aware. Although some users only require operational reports, there is a growing curiosity and desire for more advanced analytic capabilities. This makes the reporting and analytic platform (e.g., data warehouse, data mart, data lake, etc.) being part of the overall strategic plan more important than ever. Most users feel it takes up a lot of their time to get reports and like the concept of a single point of entry for all of their reports as opposed to reports within the various applications that they are forced to self-integrate.

Here is what clients have said:

- “how much of that data is relevant to the next level of the department?”
- “I don’t think people realize what we could do [if our data were integrated]”
- “very myopic view of the data”
- “[we need to be able to provide] reliable, repeatable answers to questions”
- “the most time-consuming part is to find what you’re looking for”
- “would like to have a dashboard to share accurate information”
- “it’s more art than science”
- “information is perceived as ad-hoc”
- “used to managing without information”
- “too much reliance on old data to make current decisions”

Data Architecture



While most organizations have an architecture practice in place, the teams often lack authority because they do not have a formally defined charter. There is no formal data strategy to help set the team’s direction and enable it to define standards and guidelines for identifying, provisioning, storing, and integrating data. With newly formed teams especially, the focus is on new applications instead of the entire enterprise data landscape that has been growing for years with no formal practices in place.

Here is what clients have said:

- “there have been so many architecture hands over the years”
- “we are duplicating a lot of information”
- “[there is] no logic in how we approach managing data”
- “data should be accessible regardless of where its source is”
- “it’s extremely laborious”
- “tendency to work like we’re all artisans here”