Day 1: Spark Architecture, APIs, and Resource Management

1. Recap of Spark Architecture

- Overview of Spark's core components
- Execution model: Jobs, Stages, and Tasks

2. Structured APIs and Low-Level APIs

- Understanding DataFrames and Datasets
- Differences between Spark 2 and Spark 3
- Low-level RDD APIs

3. Resource Management and Scheduling on EMR

- Overview of Amazon EMR and its capabilities
- Configuring YARN on EMR
- Using Instance Groups and Instance Fleets for resource management
- Job scheduling and priority management in EMR

4. Spark Internals

- Catalyst optimizer: Logical and physical plan
- Rule-based and cost-based optimization
- Tungsten execution engine: In-memory computing, binary processing, and cache-aware computation

Day 2: Advanced Spark Techniques and Performance Optimization

1. Advanced DataFrames and Datasets

- Optimizing DataFrame transformations
- Type-safe processing using Datasets
- Custom aggregations and UDFs/UDAFs in EMR
- Using Glue Data Catalog with Spark SQL

2. Language-Specific Spark

- Case Classes in Scala
- Pandas API for Python
- Running SQL queries on DataFrames & optimizing them

3. Performance Tuning and Optimization Techniques

- Various joins in Spark and their performance impact
- Adaptive Query Execution (AQE)
- Best practices for writing efficient Spark code
- Serialization strategies: Using Kyro
- Data partitioning, bucketing, and custom partitioning
- Cache, persist, and checkpoint strategies

4. Memory Management and Tuning

- Spark's memory model
- Tuning memory parameters and garbage collection
- Off-heap storage and its benefits

Day 3: Advanced Topics in Streaming, ETL, and Fault Tolerance

1. Optimized ETL Pipelines with EMR

- Building ETL pipelines using Spark on EMR
- o Handling schema evolution with AWS Glue
- Best practices for data partitioning and bucketing
- Techniques to prevent shuffling

2. Fault Tolerance in Spark

- Reliable Spark Streaming: WALs, RDDs, and Availability
- Advanced Spark Streaming: Structured Streaming vs. DStreams
- Stateful transformations and exactly-once semantics
- Watermarking and window operations

3. Efficient Data Storage and Access

- Using S3 as a data source and sink in Spark
- Optimizing S3 access patterns
- Introduction to Magic Write for efficient data writes to S3
- Comparing file formats: Parquet, ORC, Avro

4. Exercise: Monitoring and Debugging Spark Jobs

- Monitoring using CloudWatch
- Debugging with Spark UI