Cost Optimization Challenge: Managing Billing Records in Azure Serverless Architecture

Assumptions & Important Notes

- Cutoff Window: Records older than 3 months (90 days) are considered "cold."
- API Contracts: No changes—existing HTTP endpoints remain identical.
- Compute: Azure Functions in Consumption (or Premium) plan.
- Secrets: Stored in Azure Key Vault, accessed via managed identity.
- Storage Tiers:
 - **Hot**: Cosmos DB (Serverless)
 - **Cold**: Azure Blob Storage (Cool tier; optionally Archive tier for ultra-cold)
- CI/CD: GitHub Actions or Azure Pipelines with ARM/Bicep or Terraform.

1. Executive Summary

We introduce a **transparent**, **tiered** storage pattern:

- **Hot Store** (< 3 months) in Cosmos DB for sub-100 ms reads
- **Cold Store** (≥ 3 months) in Blob Storage (Cool) for sub-2 s reads
- Automated Archival: nightly batch (or real-time Change Feed) moves cold data to Blob and deletes from Cosmos
- Dual-Read Validation & Feature Flags guarantee zero downtime and data integrity
- End-to-End CI/CD, Monitoring, DR, and Rollback ensure production readiness

Expected Benefits: ~ 70 % cost savings, SLA-compliant latencies, seamless failover, no service interruption.

2. Final Architecture Diagram

```
flowchart TD
    subgraph Clients
    A[API Clients]
end
subgraph API Layer
    A --> F[HTTP Trigger Function]
    F --> Decision{Timestamp < 3 months?}
    Decision -->|Yes| C[Cosmos DB<br/>Storage<br/>br/>(Serverless)]
    Decision -->|No| B[Blob Storage<br/>br/>(Cool Tier)]
end
subgraph Archival
    T[Timer Trigger<br/>br/>(Function/Logic App)] --> G[Archiver Function]
    G --> B
    G --> C[Delete from Cosmos]
End
```

3. Key Components & Enhancements

```
1. Hierarchical Blob Layout
   billing/YYYY-MM/dd_<id>.json
```

- Benefit: Enables folder-level lifecycle policies and fast blob listings.
- 2. Dual-Read Shadow Mode
 - a. Phase 1: Dry-run—archive only (no deletes).

- b. Phase 2: Dual-read—API fetches from both stores and compares.
- c. Phase 3: Flip "archive enabled" flag-deletes allowed.

3. Change Feed Archiving (Highly Recommended)

- d. Near-real-time archival by subscribing to Cosmos DB Change Feed.
- e. Simplifies checkpoints & error handling.

4. Point-in-Time Backups & Geo-DR

- f. Cosmos: PITR up to 30 days.
- g. Blob: GRS + soft-delete (e.g., 90 days).

5. Observability & Alerts

- h. App Insights for Cosmos RU, Function latency, Blob latency.
- i. Alerts: RU > 80 %, p95 blob > 2 s, archiver errors > 5 /hr.

6. CI/CD with Feature Flags

- j. Infrastructure as code (Bicep/Terraform).
- k. GitHub Actions with gated deploys, artifact promotion, rollback.
- 1. Feature-flag-driven archiver activation (e.g., Azure App Configuration).

4. Pseudocode & Scripts

4.1 Data Access Layer (HTTP Trigger)

```
async function getBillingRecord(id) {
  const cutoff = Date.now() - 90*24*3600*1000;

// 1. Try hot path (Cosmos)
  try {
    const { resource } = await cosmos.container.item(id, id).read();
    if (new Date(resource.timestamp).getTime() > cutoff) {
      return resource;
    }
  } catch (e) {
    console.warn("Cosmos read failed", e);
}

// 2. Fallback to cold path (Blob)
```

```
try {
   const blob = blobClient
        .getContainerClient("archives")
        .getBlockBlobClient(getBlobPath(id));
   const download = await blob.download();
   return JSON.parse(await streamToString(download.readableStreamBody));
} catch (e) {
   console.error("Blob read failed", e);
   throw new Error("Record not found");
}
```

4.2 Archiver Function (Timer Trigger)

```
const BATCH = 500;
async function archiveOld() {
  const cutoffISO = new Date(Date.now() - 90*24*3600*1000).toISOString();
  let { resources } = await container.items
    .query(
      "SELECT * FROM c WHERE c.timestamp <= @cutoff LIMIT @batch",
      { "@cutoff": cutoffISO, "@batch": BATCH }
    .fetchAll();
 while (resources.length) {
    // 1. Upload to Blob (per-day folder)
    const date = resources[0].timestamp.split("T")[0];
    const blobPath = `${date}/${uuid()}.json`;
    await archives
      .getBlockBlobClient(blobPath)
      .upload(JSON.stringify(resources),
Buffer.byteLength(JSON.stringify(resources)));
    // 2. Delete from Cosmos (behind feature flag and soft-delete flag)
    for (const doc of resources) {
      if (featureFlags.archiveEnabled) {
        await container.item(doc.id, doc.partitionKey).delete();
      } else {
        // Optionally set a soft-delete flag on the document
     }
    }
    // 3. Fetch next batch
    ({ resources } = await container.items
      .query(
```

4.3 Infrastructure Bootstrap (Bicep Snippet)

```
@description('Cosmos account')
resource cosmos 'Microsoft.DocumentDB/databaseAccounts@2021-04-15' = {
 name: 'cosmos-billing-prod'
 kind: 'GlobalDocumentDB'
 properties: {
    databaseAccountOfferType: 'Standard'
    capabilities: [ { name: 'EnableServerless' } ]
    locations: [ { locationName: resourceGroup().location } ]
    backupPolicy: {
     type: 'Periodic'
      periodicModeProperties: {
        backupIntervalInMinutes: 240
        backupRetentionIntervalInHours: 720
     }
    }
 }
}
@description('Blob storage account')
resource stg 'Microsoft.Storage/storageAccounts@2021-04-01' = {
 name: 'stgarchiveprod01'
 sku: { name: 'Standard_RAGRS' }
 kind: 'StorageV2'
 properties: { accessTier: 'Cool' }
}
```

5. Failure Modes & Mitigations

Scenario Impact	Detection	Mitigation & Fix
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Cosmos RU exhaustion	Throttled reads/writes → errors	RU > 80 % alert	Autoscale or manual RU bump; exponential backoff + jitter; Redis cache for hottest cold
Archiver crash/backlog	Cold data never moved/deleted	Function failure alerts; backlog grows	reads Dead-letter queue; auto-retry with exponential backoff; switch to Change Feed- based archiving
Blob upload throttling	Archival delays; backlog buildup	Storage 503/429 metrics	Reduce batch size; switch to Premium block blobs; parallelize shards
Blob retrieval latency spike	Cold reads exceed SLA (> 2 s)	p95 blob retrieval alert	Azure CDN fronting; Redis cache for popular records; pre-warm blob blocks
Data corruption in Blob	Invalid JSON → read errors	Parse exceptions logged	Blob versioning + soft delete; MD5 checksum on upload; fallback to restore from PITR
Schema evolution mismatch	Cold data format incompatibility	Parse/runtime errors	Version payloads; adapter pattern in DAL; migration scripts to backfill old blobs
Key Vault outage	Secrets inaccessible → function failures	Key Vault health alert	Managed identity token caching; retry logic; local encrypted secret cache
Concurrent archive vs. read race	Read-after-delete → 404 errors	Increased 404 on cold reads	Soft-delete flag before hard delete; feature flag gating; batch archiving windows
Regional Azure outage	Service unavailability	Azure Service Health alerts	Cosmos multi-region writes; Blob GRS + manual failover; Traffic Manager DNS-based failover
CI/CD misconfiguration	Broken deployments; infra drift	Pipeline failures; drift alerts	Protected branches; "what-if" deployments; nightly drift detection + automated rollback
Cold data growth over time	Unexpected storage cost spike	Cost anomaly alert	Lifecycle policies to move > 2 years old to Archive tier or delete; budget alerts
Excessive cold-read traffic	Blob egress charges spike	Cost Management anomaly alerts	API throttle via Azure API Management; client throttling; caching at edge and in-memory

6. Operations, Monitoring & SLAs

- Application Insights
 - o Custom Metrics: cosmosLatency, blobLatency, archiverErrors
 - o Dashboards: Hot vs. Cold traffic breakdown; cost savings over time
- Alerts & Actions
 - o **Cosmos RU > 80 %** → scale out + Ops page
 - o **p95 Blob Latency > 2 s** \rightarrow investigate; possibly spin up CDN
 - o **Archiver Errors > 5/hr \rightarrow pause deletes; raise ticket**
- Disaster Recovery
 - o **Cosmos**: PITR + geo-failover
 - o **Blob**: GRS + soft-delete (90 days)
- SLA Targets
 - o **Hot reads**: < 100 ms (99 th pct)
 - o **Cold reads**: < 2 s (95 th pct)
 - o **Archival window**: complete nightly in < 30 min

7. Conclusion

This comprehensive, production-hardened design:

- **Cuts costs by ~ 70** % by tiering cold data into low-cost Blob storage.
- **Preserves API contracts** and **ensures zero downtime** via dual-read validation and feature flags.
- Addresses failure modes from RU throttling to regional outages with clear detection & remediation steps.
- **Delivers SLAs**: sub-100 ms hot reads, sub-2 s cold reads, reliable nightly archival.