



# ARC – AI

## AUTONOMOUS REGIONAL COGNITIVE ARTIFICIAL INTELLIGENCE

### TEAM MESHMINDS

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#### Tech Stack

##### 1. High-level design mapping

- **Main Hub (MH)** — regional/cluster brain (higher compute, persistent storage, orchestrator).
- **Mini Hub (mH)** — edge gateway (local AP, cache, lightweight inference).
- **End user device** — smartphone (browser/app) connecting to mH AP.
- **Transport layers:** Local access (Wi-Fi / BLE) and Long-range low-power link (LoRa or long-range Wi-Fi).
- **Cloud (optional)** — for model updates, advanced inference, analytics when internet available.

##### 2. Hardware (recommended components + alternatives)

###### Main Hub (1 per cluster)

- **Primary compute:**
  - Option A (cost/energy balanced): Single-board computer with quad-core+ (e.g., latest Raspberry Pi 4 / 5, 8GB+ RAM).
  - Option B (higher performance): Small form-factor PC (Intel NUC / AMD mini PC) or edge GPU device if local large-model inference is required.
- **Storage:** 256 GB–1 TB NVMe SSD (for model files, capsule DB, logs).
- **Long-range radio:** LoRa transceiver module (SX126x family or equivalent) with external high-gain antenna.
- **Network:** Ethernet, optional SIM/LTE modem (for opportunistic cloud sync), USB Wi-Fi adapter (for directional links).
- **Power:** PoE or stable DC supply + small UPS for graceful shutdown.
- **Optional accelerators:** USB Coral TPU, Edge TPUs, or small GPU if running heavier quantized models.

###### Mini Hub (per site)

- **Primary compute:**

- Option A (low-cost): Raspberry Pi Zero 2 W or Raspberry Pi 4 (4GB) depending on local model needs.
- Option B (more compute for local inference): Pi 4 / 8GB, or small x86 SBC.
- **Wi-Fi/BLE:** Onboard (for AP), optional external CPE Wi-Fi antenna for extended coverage.
- **LoRa:** SX126x / Ebyte LoRa module (with antenna).
- **Storage:** 32–128 GB microSD or USB storage for caches & capsule DB.
- **Power:** PoE (preferred) or solar + battery with controller for remote deployments.
- **Enclosure:** Weatherproof IP65 for outdoor units.
- **Optional:** Microphone + speaker for voice interface.

#### **End-user (phones)**

- Any smartphone supporting Wi-Fi; web UI or lightweight app.

#### **Antennas & Networking**

- **LoRa:** High-gain omnidirectional for MH; directional or omnidirectional for mHs depending on placement.
- **Wi-Fi CPE:** Outdoor CPEs for 1–2 km coverage where needed; directional bridges for cluster interconnects.

#### **Estimated BOM (per-node rough)**

- Mini Hub: SBC + LoRa module + CPE antenna + enclosure + power = **\$80–\$250** (depends on Pi model and antenna).
- Main Hub: SBC/NUC + LoRa gateway + SSD + UPS = **\$300–\$1200**. (Procurement prices vary by region—adjust accordingly.)

### **3. Connectivity & Network Layer**

#### **Local access channel (user ↔ mini hub)**

- Wi-Fi AP hosted by mini hub (802.11n/ac if hardware supports) or BLE for ultra-low bandwidth discovery.
- Local HTTP(S) endpoint (browser UI) for queries.

#### **Long-range channel (mini hub ↔ main hub & peer mH)**

- Primary: **LoRa** for low-power long-range text/metadata and compact capsules.
  - Use short packets, chunking & reassembly, ACKs and small sliding windows.

- Keep routine payloads small (capsule IDs, hashes, compressed embeddings).
- Secondary (opportunistic): Directional Wi-Fi bridges or temporary LTE for bulk syncs (model updates, large payloads).
- Inter-mH mesh: Peer gossip via LoRa or local Wi-Fi links for capsule exchange and redundancy.

### Network protocols & patterns

- **Store-and-forward**: For queued queries and delayed synchronization.
- **Gossip protocol**: Controlled probabilistic push/pull to disseminate capsules among mHs.
- **Manifest-based sync**: Small manifest messages listing capsule IDs/versions; selective fetch reduces bandwidth.

## 4. Software Stack (components & responsibilities)

Note: below lists components and responsibilities — you can map to specific frameworks/libraries based on preference.

### System services (on both MH & mH)

- **Service manager** (systemd or container orchestrator) to run processes.
- **Local API server** (lightweight web service) exposes endpoints:
  - /query — receive user queries,
  - /status — health/telemetry,
  - /admin — local management.
- **Packet/forwarder service** — converts HTTP queries to packets for long-range transport; manages chunking, retries, encryption.
- **Cache manager** — stores capsules and handles ANN index lookups and garbage collection.
- **Local inference agent** — runs compact LLM or retrieval-based response generator for fallback.
- **Sync manager** — handles manifest exchange, capsule requests, and reconciliation.
- **Security/key manager** — holds node keypair, handles session key derivation.
- **Telemetry agent** — batched metrics/logs for when uplink available.

### Datastore model (abstract)

- **Capsule DB (local):** stores capsule metadata, compressed embedding, answer text, source, signature, timestamp.
- **Index:** approximate nearest neighbor (ANN) index for embeddings (compact, memory-frugal).
- **Queue:** pending outgoing queries / chunks awaiting ACK.

## Dev/Operations

- **OTA / update manager** — secure incremental updates (signed updates).
- **Monitoring** — lightweight metrics (heartbeats, cache hit/miss, storage usage).
- **Logging** — local log rotation; batch export when uplink available.

## 5. Models, embeddings & inference (recommendations)

### Model strategy (tiered)

- **Main Hub:** larger models for authoritative responses / capsule generation (quantized models for local CPU inference or cloud if available).
- **Mini Hub:** compact quantized models for fallback answers; rely primarily on capsule retrieval for accuracy.

### Model formats & optimization

- **Quantized model formats** (Q4/Q8, GGUF, or ONNX quantized) to reduce footprint.
- **Inference runtimes:** efficient CPU runtimes (ggml/llama.cpp, ONNX Runtime with quantization) or hardware accelerators when available.

### Embeddings & retrieval

- **Embeddings:** low-dimension, quantized/compressed vectors stored with each capsule.
- **ANN index:** small memory HNSW-like index (nmslib, hnswlib, or embedded approximate index) tailored to edge memory limits.
- **Similarity threshold policy:** configurable threshold to determine cache hit vs forward.

## 6. APIs & External Interfaces

### Internal APIs (between services)

- **mH ↔ MH transport API** (packetized, encrypted): carries query packets, response packets, capsule manifests, and control messages (ACK, SYNC\_REQ, SYNC\_ACK).

- **Capsule manifest API:** list of capsule IDs + versions for selective fetch.

#### Optional cloud APIs (used only when internet available)

- **Model hosting / ML inference APIs:** for heavy or specialized queries (cloud fallback).
- **Telemetry / analytics:** aggregated logs/metrics for centralized analysis.
- **OTA update API:** secure update distribution.

#### End-user interface

- **Web UI:** simple form for questions + display answers and confidence.
- **Optional mobile app:** for offline caching, voice-recording (upload when connected), and richer UX.

## 7. Security & Key Management

#### Core primitives

- **Node identities:** asymmetric keypairs per node (Ed25519 recommended) — used for capsule signing and verifying provenance.
- **Session keys:** ephemeral key exchange (X25519) to derive per-transport symmetric keys.
- **Payload encryption:** authenticated encryption (AES-GCM or an authenticated AEAD) for query/response payloads.
- **At-rest encryption:** encrypted local storage for sensitive data; encryption keys managed by local key manager and protected by hardware where possible.

#### Trust model

- **Bootstrap:** MH acts as cluster root/trust anchor during provisioning; MH signs cluster certificates.
- **Revocation:** maintain revocation lists for compromised nodes (distributed and periodically synced).
- **Verification:** mH verifies capsule signatures and rejects unauthenticated capsules.

#### Privacy controls

- **PII redaction:** optional pre-capsule filtering to remove sensitive identifiers.
- **Retention policies:** configurable TTL for capsules and query logs to comply with privacy/regulatory constraints.
- **Access control:** local admin controls for who can query or access logs.

## 8. Data formats & packet design (abstract schemas)

### Query packet (conceptual fields)

- pkt\_id, src\_id, dst\_id, timestamp, payload\_enc, meta (q\_hash, emb\_hint, priority), chunk\_index (if chunked), total\_chunks.

### Capsule (conceptual)

- capsule\_id, question\_hash, answer\_text, compressed\_embedding, source\_id, timestamp, signature.

Design choices:

- Keep capsules compact — compress answer text, quantize embeddings.
- Use deterministic question hashing for dedupe & conflict resolution.

## 9. Storage, indexing & caching policies

### Storage

- Local DB (lightweight, ACID): used for capsule storage plus metadata.
- Periodic compaction and backup to attached SSD on MH.

### Indexing & cache

- ANN index kept in memory for fast lookups; persistent snapshot on disk.
- Cache policies:
  - **LRU + heuristics** (favor high-frequency, high-value capsules).
  - TTL and priority tags (sensitive / high-value / stale).
- **Cache decision:**
  - Compute embedding of incoming query → query ANN → if  $\text{sim} \geq T_{\text{sim}}$  and  $\text{age} \leq T_{\text{max}}$  then local hit; else forward.

## 10. Operations, provisioning & deployment

### Provisioning workflow

- Pre-provision node identities and initial config for each device (node id, frequency, cluster id, MH public key).
- Securely ship devices, power up and verify trust handshake with MH.

### Monitoring & maintenance

- Lightweight telemetry (heartbeats, storage percentage, cache hit/miss, battery status).
- Batch telemetry upload when uplink available; alerting for critical events.

## **OTA & updates**

- Signed update packages; atomic update mechanism and rollback capability.

## **11. Observability & evaluation tools**

- Local metrics: cache-hit ratio, avg response latency (local vs upstream), capsule propagation time, storage usage, error/retry rates.
- On MH: aggregate metrics, trend analysis, and deployment analytics.
- Test harness: simulated packet loss, delayed sync scenarios, stress tests (many simultaneous queries), and battery/power loss simulations.

## **12. Redundancy, resilience & failure modes**

- **Local resilience:** mH continues serving from cache and light LLM when MH unreachable.
- **Redundancy:** multiple mHs per cluster; peer exchange reduces single-point-of-failure.
- **Recovery:** queued queries reconciled and authoritative capsules reissued on reconnection.
- **Power resilience:** solar + battery sizing, graceful shutdown, low-power sleep schedules.

## **13. Optional / advanced components (for later phases)**

- Hardware accelerators on MH (edge GPUs) for higher-quality local models.
- Federated learning loop for capsule weighting or model finetuning (privacy-aware).
- Voice interface: offline speech-to-text and TTS on mH.
- Incentive mechanisms for cross-organization capsule sharing (reputation tokens).

## **14. Implementation priorities & tradeoffs**

1. **Start minimal & robust:** prioritize capsule format, encryption, packet reliability, and a simple retrieval-based cache on edge.

2. **Add local inference later:** once capsule retrieval works reliably, introduce small quantized LLM on mH.
3. **Optimize bandwidth:** compress & quantize embeddings, send manifests, selective fetch to minimize long-range use.
4. **Balance quality vs footprint:** higher-quality models require more compute; rely on MH for authoritative resolution initially.

## 15. Quick recommended mapping to concrete (if you want specifics later)

I kept the above technology-agnostic where useful. If you want, I can map each component to specific software libraries, runtimes, and exact hardware SKUs (e.g., which SBC, which LoRa module, exact model formats and versions) and provide:

- A Bill-of-Materials with cost estimates, and
- A minimal reproducible Stage-1 software scaffold (local simulator + packet & crypto modules).