# Stage-10 v2 (Geodesic Parser + Executor): Mathematical Specification

## 1 Setup and Notation

Let  $x \in \mathbb{R}^F$  denote the latent state per time step. We perform one-time PCA whitening:

$$y = W(x - \mu) \in \mathbb{R}^d$$
,  $W = PCA$  whitener,  $d \ll F$ . (1)

We are given K primitive prototypes  $p_k \in \mathbb{R}^d$  (e.g., K = 3 for flip\_h,flip\_v,rotate), normalized and nearly orthogonal:

$$||p_k||_2 = 1, p_i^{\mathsf{T}} p_j \approx 0 \ (i \neq j).$$
 (2)

Each primitive also has an anchor (center)  $c_k \in \mathbb{R}^d$  estimated from data (e.g., per-class mean in the whitened space). A geodesic rollout produces a trajectory  $t \mapsto y(t), t = 0, \dots, T$ .

#### 2 Geodesic Mechanics

### 2.1 Action, Potentials, and Forces

In the whitened chart we take the metric  $G = \mathbf{I}_d$  so free geodesics are straight lines. We guide the trajectory by a scalar potential that encodes active primitives. Let

$$U_k(y) = \frac{1}{2} \|\Pi_k (y - c_k)\|^2, \qquad \Pi_k \equiv \mathbf{I} - p_k p_k^{\top},$$
 (3)

so that  $U_k$  is minimized when y lies on the line  $c_k + \alpha p_k$  (aligned with  $p_k$  and passing through  $c_k$ ). Its gradient is

$$\nabla U_k(y) = \Pi_k (y - c_k), \tag{4}$$

which removes components orthogonal to  $p_k$ , pulling the state onto the  $p_k$ -axis.

Given (possibly time-varying) nonnegative weights  $w_k(t)$  over primitives, define the composite potential

$$U(y,t) = \sum_{k=1}^{K} w_k(t) U_k(y).$$
 (5)

The controlled Lagrangian is

$$\mathcal{L}(y, \dot{y}, t) = \frac{1}{2} m ||\dot{y}||^2 - \lambda U(y, t), \tag{6}$$

with mass m > 0 and coupling  $\lambda > 0$ . Including Rayleigh dissipation  $\mathcal{R} = \frac{1}{2}\gamma \|\dot{y}\|^2$  yields the Euler–Lagrange equations

$$m \ddot{y} = -\lambda \nabla U(y,t) - \gamma \dot{y} = -\lambda \sum_{k} w_{k}(t) \Pi_{k} (y - c_{k}) - \gamma \dot{y}.$$
 (7)

Single-primitive runs. For the *oracle* or prototype runs used to estimate per-primitive energy traces, set  $w_k(t) \equiv \mathbb{K}[k=k^*]$  constant in time; Eq. (7) aligns the state with  $p_{k^*}$  (orthogonal components decay via the potential and damping).

**Mixture control.** For multi-task scenarios,  $w_k(t)$  encodes a *schedule* over primitives (sequential or overlapping). Stage-10 v2 parses  $w_k(t)$  from traces (Sec. 4) and then executes in that order (possibly with concurrency).

## 2.2 Discrete Integrator (CPU-friendly)

Let  $\Delta t > 0$  be the step size. A stable semi-implicit Euler (or damped Verlet) discretization of (7) is:

$$v_{t+\frac{1}{2}} = \alpha v_t - \frac{\lambda \Delta t}{2m} \nabla U(y_t, t), \tag{8}$$

$$y_{t+1} = y_t + \Delta t \, v_{t+\frac{1}{2}},\tag{9}$$

$$v_{t+1} = \alpha v_{t+\frac{1}{2}} - \frac{\lambda \Delta t}{2m} \nabla U(y_{t+1}, t + \Delta t), \tag{10}$$

with  $\alpha = (1 - \frac{\gamma \Delta t}{2m})$ . Parameters  $\{m, \lambda, \gamma, \Delta t\}$  match the implementation knobs (mass\_scale, lambda, gamma, dt).

## 3 Energies Along the Geodesic

Given a rollout  $\{y(t)\}_{t=0}^T$ , define (with  $c_k$  optionally set to 0 if data is zero-centered)

$$s_k(t) = \langle p_k | y(t) - c_k \rangle, \quad \text{(signed alignment)}$$
 (11)

$$E_{\parallel}^{(k)}(t) = s_k(t)^2 = (p_k^{\top}(y(t) - c_k))^2,$$
 (12)

$$E_{\perp}^{(k)}(t) = \|y(t) - c_k\|^2 - E_{\parallel}^{(k)}(t). \tag{13}$$

We then smooth each series with a short FIR/moving average to obtain  $\widetilde{E_{\parallel}}^{(k)}$  and  $\widetilde{E_{\perp}}^{(k)}$ . Intuition: during a k-task window,  $\widetilde{E_{\parallel}}^{(k)}$  peaks and  $\widetilde{E_{\perp}}^{(k)}$  dips (relative to others).

#### 3.1 Exclusive (Span-Complement) Residual

To suppress cross-talk between correlated prototypes, we use the exclusive residual for channel k:

$$r_k^{\text{ex}}(t) = \left(\mathbf{I} - Q_{-k}Q_{-k}^{\top}\right) z_k(t), \qquad z_k(t) = \text{zscore}(E_{\perp}^{(k)}(t)), \tag{14}$$

where  $Q_{-k}$  is an orthonormal basis (via QR) for the column space spanned by  $\{z_j\}_{j\neq k}$ . The parsing signal is then

$$\mathcal{E}^{(k)}(t) = [r_k^{\text{ex}}(t)]_+ * h, \tag{15}$$

i.e., positive part followed by a small smoothing kernel h; this is exactly what Stage-10 v2 integrates as area.

## 4 Parsing: Task Set, Order, Concurrency

### 4.1 Matched Filter and Peak Statistics

Let  $q(\tau)$  be a fixed unimodal template ("bump"). The normalized cross-correlation for channel k is

$$C^{(k)}(t) = \frac{\sum_{\tau} \left(\mathcal{E}^{(k)}(t-\tau) - \overline{\mathcal{E}^{(k)}}\right) \left(q(\tau) - \overline{q}\right)}{\sqrt{\sum_{\tau} \left(\mathcal{E}^{(k)}(t-\tau) - \overline{\mathcal{E}^{(k)}}\right)^2} \sqrt{\sum_{\tau} \left(q(\tau) - \overline{q}\right)^2}}.$$
 (16)

Let  $t_k^* = \arg \max_t C^{(k)}(t)$  and define a window  $[a_k, b_k]$  around  $t_k^*$  (e.g., half-max width in  $\mathcal{E}^{(k)}$ ). The area score is

$$A^{(k)} = \sum_{t=a_k}^{b_k} \mathcal{E}^{(k)}(t). \tag{17}$$

## 4.2 Decision Rules (Stage-10 v2)

- 1. **Presence:** include primitive k iff  $A^{(k)} > \tau_{\text{area}}$  and  $\max_t C^{(k)}(t) > \tau_{\text{corr}}$ .
- 2. **Order:** sort included primitives by  $t_k^{\star}$  (or by matched-filter lag; both are supported).
- 3. Concurrency: if windows overlap,  $[a_i, b_i] \cap [a_j, b_j] \neq \emptyset$ , add a concurrency edge (i, j).
- 4. **Confidence:** report  $(A^{(k)}, \max C^{(k)})$  per task; overall confidence may be the harmonic mean of per-task normalized scores.

# 5 Executor (Primitive Geodesics)

For execution, we run (7) with a *single* active primitive at a time following the parsed order:

$$w_k(t) = \begin{cases} 1 & \text{if } k \text{ is the current primitive,} \\ 0 & \text{otherwise.} \end{cases}$$

At the end of each task window we update the grid/latent with the primitive's map (e.g., flip or rotation for ARC synthetics). Concurrency can be handled by either (i) short alternating micro-steps between active primitives or (ii) superposing small weights  $w_i, w_j$  during the overlap.

# 6 Parameters to Freeze (for Reproducibility)

Symbol/Flag	Typical Value	Meaning
$\overline{d}$	19	PCA-whitened dimension
m	4.0	mass (mass_scale)
$\lambda$	0.35	potential coupling (lambda)
$\gamma$	0.04	damping/friction
$\Delta t$	0.02	integrator time step
T	600 – 720	rollout steps
h	window $7-15$	smoother kernel (moving average)
q	width 50–80	matched-filter template
$ au_{ m area}$	$\approx 10$ (synthetic)	area floor for presence
$ au_{ m corr}$	$\approx 0.7$ (synthetic)	correlation floor for presence

## 7 Why It Works (Invariants)

- Whitened orthogonality: PCA + unit prototypes make directions comparable; with near-orthogonality,  $\sum_k E_{\parallel}^{(k)} \approx ||y||^2$ .
- Geodesic locality: under  $U_k$ , the system damps components orthogonal to  $p_k$  and travels along the  $p_k$ -axis (the intended primitive).
- Additivity: sequential (or overlapping)  $w_k(t)$  produce separated (or overlapping) lobes in  $\mathcal{E}^{(k)}$ .

- Exclusive residual: projecting onto the span-complement of  $\{j \neq k\}$  eliminates cross-talk and sharpens detection.
- **Template robustness:** matched filtering provides a normalized peak statistic stable to scale/drift/timing jitter.

### 8 Unit Tests to Lock In

- 1. **Primitive oracle (single):**  $\arg \min_k \sum_t E_{\perp}^{(k)}(t)$  equals ground truth (observed 100% on ARC-12 primitives).
- 2. **Stage-10 v2 synthetic:** parser+executor recovers task set and order end-to-end (25/25 observed).
- 3. Stability:  $\pm 10\%$  timing jitter and amplitude noise do not change decisions.
- 4. **Ablations:** removing whitening hurts accuracy; lowering  $\tau_{\rm corr}$  adds spurious tasks;  $\pm 25\%$  change in q leaves decisions unchanged.

# 9 Minimal Algorithms (Pseudocode)

## Parser (from geodesic traces)

```
Inputs: y[0:T], {p_k, c_k}, template q, smoother h
for k in K:
    s_k[t] = dot(p_k, y[t]-c_k)
    E_par[k] = smooth(s_k^2, h)
    E_perp[k] = smooth(||y[t]-c_k||^2 - s_k^2, h)

# exclusive residual across channels

E_ex[k] = pos((I - Q_{-k}Q_{-k}^T) zscore(E_perp[k]))

# matched filter + decisions

C[k] = nxcorr(E_ex[k], q); t*_k = argmax C[k]

A[k] = sum_window(E_ex[k] around t*_k)

tasks = { k : A[k] > tau_area and max C[k] > tau_corr }
order = sort_by t*_k; concurrency = overlap(windows)
```

#### Executor (primitive geodesics)

```
for primitive k in order:
    set weights w_k(t)=1 (others 0)
    integrate m y' = -lambda * grad U_k(y) - gamma y'
    apply primitive map to grid/latent at window end
# handle overlaps by alternating small steps or w_i,w_j >0 simultaneously
```

### 10 Empirical Summary

- Stage-10 v2 (synthetic): 25/25 correct (task set and order) using the parser + executor.
- Oracle single-primitive: 12/12 correct using the perpendicular-energy criterion.
- Visuals show clean, separable lobes in  $\mathcal{E}^{(k)}$ , high matched-filter peaks ( $\sim 0.97$ ) for active tasks, and stable ordering.