

| Category                                            | Answers                                                                                         | Typical capabilities                                                                                                                                                                                                                                | Non-goals                                                                                                                                              |
|-----------------------------------------------------|-------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------|
| Code versioning (Git)                               | * Which code snapshot did we use?                                                               | * history, diff, review, branching, tags<br>* code provenance for papers and experiments                                                                                                                                                            | * does not version large data well<br>* does not record “runs” or produced artifacts by itself                                                         |
| Data versioning and lineage (DVC, lakeFS, etc.)     | * Which dataset snapshot did we use?<br>* Which derived artifacts depend on which inputs?       | * data snapshots / versions (often stored outside git)<br>* lineage via declared deps/outs<br>* reproducible data pipelines in terms of file dependencies<br>* stage skip via cache and “nothing changed” detection (DVC-style)                     | * not a full experiment tracker UI<br>* not a scheduler/queue/retry system (beyond simple stage execution)                                             |
| Environment capture (conda/mamba, lockfiles)        | * Which exact dependencies made this run work?                                                  | * pinned packages / versions<br>* exportable environment spec (env.yml / lockfile)<br>* reduces environment drift across machines                                                                                                                   | * does not track runs, metrics, or artifacts                                                                                                           |
| Training frameworks (Lightning, HF Trainer, etc.)   | * How do we write training loops faster and more consistently?                                  | * training loop abstractions<br>* standard callbacks, logging hooks<br>* multi-GPU / mixed precision conveniences (depending on framework)                                                                                                          | * not experiment tracking by itself<br>* not orchestration by itself<br>* not data versioning                                                          |
| Experiment tracking (MLflow, W&B, etc.)             | * Which run produced this result?<br>* What parameters, metrics, and artifacts did it generate? | * run records: params, metrics, tags<br>* artifact logging: plots, tables, models, reports<br>* comparison: search, filter, compare runs<br>* provenance links (to code/config/data references) if you log them                                     | * not HPO search engine (though it can integrate with one)<br>* not orchestration/scheduling (though it can be triggered from one)                     |
| HPO optimization (Optuna, Ray Tune, etc.)           | * How do we search the hyperparameter and design space systematically?                          | * define objective functions<br>* search algorithms (samplers), pruning, early stopping<br>* study analysis and visualizations<br>* parallel trial execution (varies by tool and setup)                                                             | * does not guarantee provenance unless paired with tracking/versioning<br>* does not replace broader evaluation surface (metrics beyond the objective) |
| Orchestration (Prefect, Dagster, Airflow, Argo/KFP) | * How do we run the workflow reliably and repeatedly, at scale?                                 | * scheduling and triggers<br>* retries, backoff, timeouts<br>* concurrency / queues / distributed execution primitives<br>* task caching / stage skip (orchestrator-style), idempotency patterns<br>* observability of workflow runs (logs, states) | * not a tracker unless you log to a tracker<br>* not a data versioning system (though it can call one)                                                 |