

Distributed Hyperparameter Searching in Ray Tune

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Background

Hyperparameter selection in machine learning is very important

Many hyperparameter searching algorithms have been developed

- Bayesian Optimization
- Random search
- Grid Search



Where does Ray Tune come in?

Ray

- Framework for distributed ML workloads
- Tasks
 - Invocations of functions to be executed asynchronously on different Python workers
- Actors
 - A stateful worker for Python objects
- Objects
 - Tasks and actors compute on these

Where does Ray Tune come in?

Tune

- Implemented on top of Ray
- A framework for distributed hyperparameter optimization / model selection
- Integrates multiple SOTA hyperparameter search algorithms

```
# Function-based API

def train():
    for _ in range(N):
        tune.report(...)

Ray Tune API

HyperBand

Grid Search

# Class-based API
class MyModel(Trainable):
    def _setup(); def _train();
    def _save(); def _restore();

Bayesian
Optimization

Population
Based Training
```



Significance of Ray Tune

Ray Tune offers

- 1. A unified framework for users to tune hyperparameters using different SOTA algorithms and implementations
 - Distributed
- 2. A framework for researchers to implement their own hyperparameter tuning algorithms
- 3. Additional features
 - Monitor and visualize trial progress



This Project

- 1. Explore capabilities of distributed tuning using Ray Tune
 - Test out performance of Ray Tune for distributed training using several datasets and several tuning algorithms
- 2. Implement Structured Bayesian Optimization for specific models
 - a. from BOAT
 - Instead of using a generic GP as prior, use contextual information to create a probabilistic model about the performance
 - c. Converge faster & better parameters found
- Implement generic SBO (similar to BOAT) that allows users to define their own probabilistic models for SBO
 - a. Using an open source Python probabilistic model library



What I have done so far

Read papers

Understand papers

Read code

Understand code

Check feasibility



Future Work

Explore distributed training capabilities of Ray

Run experiments with Normal BO & other methods

Implement structured BO

Run experiments with Structured BO

Compare BO vs SBO (non-distributed & distributed)

Write report



Questions & Suggestions?

