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import random
from deap import base, creator, tools
# Define the evaluation function
def eval_func(individual):
   target_sum = 15
   return (len(individual) - abs(sum(individual) - target_sum),) # Note the comma to make it a tuple
# Create the toolbox
def create_toolbox(num_bits):
   creator.create("FitnessMax", base.Fitness, weights=(1.0,))
   creator.create("Individual", list, fitness=creator.FitnessMax)
   toolbox = base.Toolbox()
   toolbox.register("attr_bool", random.randint, 0, 1)
   toolbox.register("individual", tools.initRepeat, creator.Individual,
                     toolbox.attr_bool, num_bits)
    toolbox.register("population", tools.initRepeat, list, toolbox.individual)
    # Register the evaluation operator
   toolbox.register("evaluate", eval_func)
    # Register the crossover operator
    toolbox.register("mate", tools.cxTwoPoint)
    # Register the mutation operator
   toolbox.register("mutate", tools.mutFlipBit, indpb=0.05)
    # Register the selection operator
    toolbox.register("select", tools.selTournament, tournsize=3)
   return toolbox
if __name__ == "__main__":
   num_bits = 45
   toolbox = create_toolbox(num_bits)
   random.seed(7)
    # Create an initial population
   population = toolbox.population(n=500)
   # Define probabilities for crossover and mutation
   probab_crossing, probab_mutating = 0.5, 0.2
   num_generations = 10
   print('\nEvolution process starts')
   # Evaluate the entire population
   fitnesses = list(map(toolbox.evaluate, population))
   for ind, fit in zip(population, fitnesses):
        ind.fitness.values = fit
   print('\nEvaluated', len(population), 'individuals')
    # Iterate through generations
   for g in range(num_generations):
        print("\n- Generation", g)
        # Select the next generation individuals
        offspring = toolbox.select(population, len(population))
        offspring = list(map(toolbox.clone, offspring))
        # Apply crossover and mutation
        for child1, child2 in zip(offspring[::2], offspring[1::2]):
            if random.random() < probab_crossing:</pre>
                toolbox.mate(child1, child2)
                del child1.fitness.values
                del child2.fitness.values
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# Apply mutation
    for mutant in offspring:
       if random.random() < probab_mutating:</pre>
            toolbox.mutate(mutant)
            del mutant.fitness.values
    # Evaluate individuals with invalid fitness
    invalid_ind = [ind for ind in offspring if not ind.fitness.valid]
    fitnesses = map(toolbox.evaluate, invalid_ind)
    for ind, fit in zip(invalid_ind, fitnesses):
        ind.fitness.values = fit
    print('Evaluated', len(invalid_ind), 'individuals')
    # Replace population with next generation
    population[:] = offspring
    # Print statistics for the current generation
    fits = [ind.fitness.values[0] for ind in population]
    length = len(population)
    mean = sum(fits) / length
    sum2 = sum(x*x for x in fits)
    std = abs(sum2 / length - mean**2)**0.5
    print('Min =', min(fits), ', Max =', max(fits))
    print('Average =', round(mean, 2), ', Standard deviation =', round(std, 2))
print("\n- Evolution ends")
# Print the final output
best_ind = tools.selBest(population, 1)[0]
print("\nBest individual:\n", best_ind)
print("\nNumber of ones:", sum(best_ind))
```

```
# Install DEAP if not already installed
# !pip install deap
import operator
import math
import random
import numpy as np
from deap import base, creator, gp, tools, algorithms
# Define a set of operators and terminals (Primitive Set)
pset = gp.PrimitiveSet("MAIN", 1) # 1 input variable (X)
# Adding basic operators
pset.addPrimitive(operator.add, 2)
pset.addPrimitive(operator.sub, 2) # -
                                   # *
pset.addPrimitive(operator.mul, 2)
pset.addPrimitive(operator.neg, 1) # negation (unary -)
# Add ephemeral constant (random constants)
pset.addEphemeralConstant("rand101", lambda: random.randint(-1, 1))
# Rename the argument for clarity
pset.renameArguments(ARG0='x')
# Define Fitness and Individual
creator.create("FitnessMin", base.Fitness, weights=(-1.0,)) # Minimize error
creator.create("Individual", gp.PrimitiveTree, fitness=creator.FitnessMin)
# Toolbox setup
toolbox = base.Toolbox()
toolbox.register("expr", gp.genHalfAndHalf, pset=pset, min_=1, max_=3)
toolbox.register("individual", tools.initIterate, creator.Individual, toolbox.expr)
toolbox.register("population", tools.initRepeat, list, toolbox.individual)
# Define evaluation function
def eval_symb_reg(individual):
   func = toolbox.compile(expr=individual)
    # Training points
   X = np.linspace(-10, 10, 50)
    Y_{true} = 5*X**3 - 6*X**2 + 8*X - 1 # Slightly rearranged to equal zero
    # Compute predicted Y
   Y_pred = np.array([func(x) for x in X])
    # Compute RMSE
    rmse = np.sqrt(np.mean((Y_true - Y_pred)**2))
    return (rmse,)
toolbox.register("compile", gp.compile, pset=pset)
toolbox.register("evaluate", eval_symb_reg)
toolbox.register("select", tools.selTournament, tournsize=3)
toolbox.register("mate", gp.cxOnePoint)
toolbox.register("expr_mut", gp.genFull, min_=0, max_=2)
toolbox.register("mutate", gp.mutUniform, expr=toolbox.expr_mut, pset=pset)
# Decorate (limit height of trees to avoid bloat)
toolbox.decorate("mate", gp.staticLimit(key=operator.attrgetter("height"), max_value=17))
toolbox.decorate("mutate", gp.staticLimit(key=operator.attrgetter("height"), max_value=17))
# Genetic Algorithm parameters
def main():
   random.seed(42)
   pop = toolbox.population(n=300)
   hof = tools.HallOfFame(1) # Best individual
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stats = tools.Statistics(lambda ind: ind.fitness.values)
   stats.register("avg", np.mean)
   stats.register("std", np.std)
   stats.register("min", np.min)
   stats.register("max", np.max)
   print("Starting Evolution...")
   pop, log = algorithms.eaSimple(pop, toolbox,
                                    cxpb=0.5, mutpb=0.2,
                                    ngen=40,
                                    stats=stats, halloffame=hof,
                                   verbose=True)
   print("\nBest individual:")
   print(hof[0])
   print("\nFitness (RMSE):", hof[0].fitness.values[0])
if __name__ == "__main__":
   main()
```