Supplementary File 1

An efficient hybrid filter-wrapper method based on improved Harris Hawks optimization for feature selection

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Algorithm S1. HHO algorithm

Input: N (population size),
T (maximum number of iteration)
Output: The best position of prey
1: Randomly generating N hawks X_i (i=1, 2, …, N)
2: t = 1
3: **while** t ≤ T **do**
4: Calculate the fitness values of hawks
5: Set X_{prey} as the best position of the prey
6: **for** each hawk (X_i) **do**
7: Update the initial energy E_0 and jump strength J
8: Update the energy (E) using Eq. 2.
9: **if** |E| ≥ 1 **then**
10: Update the position vector using Eq. 1.
11: **end if**
12: **if** |E| < 1 **then**
13: **if** r ≥ 0.5 **and** |E| ≥ 0.5 **then**
14: Update the position vector using Eq. 4.
15: **else if** r ≥ 0.5 **and** |E| < 0.5 **then**
16: Update the position vector using Eq. 6.
17: **else if** r < 0.5 **and** |E| ≥ 0.5 **then**
18: Update the position vector using Eq. 10.
19: **else if** r < 0.5 **and** |E| < 0.5 **then**
20: Update the position vector using Eq. 11.
21: **end if**
22: **end if**
23: **end for**
24: t = t + 1
25: **end while**
26: **Return** X_{prey}

Algorithm S2. Pseudo code of the proposed algorithm

Input: D: Dataset; FS: filter measure; RF: classifier;
Output: S: The selected features
// FILTERING STAGE
1: For i = 1 to N // N = the count of features in D
2: Score[i] = FS(D_i) // The Score is calculated based on F-Score method
3: For i = 1 to N
4: ProbSelect[i] = Score[i] / $\sum_{j=1}^{N} \text{Score}(j)$
// WRAPPER STAGE - HHO Initialization
5: Nvar = 40, Npop = 10
6: For i = 1 to Npop
7: Hawk[i].Position = Select a feature from D without replacement by using ProbSel[];

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    Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
    Hawk[i].Fitness = Accuracy(C, T, [i].Position, D, RF);
// HHO Main Loop
While (the stopping condition is not met) do
    Hawks = Sort(Hawk.Fitness) // Sort Ascending by fitness of Hawk.
    Rabbit.Position = Hawks[1].position // The position of best Hawk
    For i = 1 to Npop do
        E0[i] = 2rand() - 1 // Update the initial energy E0
        J[i] = 2(1 - rand()) // Update the initial jump strength J
        E[i] = 2 E0[i](1 - t/T) // Update the E
        if (|E[i]| ≥ 1) then // Exploration phase
            if q ≥ 0.5
                Hawk[i].Position = RandomHawk.Position - r1 | RandomHawk.Position - 2r2 Hawk[i].Position |
                Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
            if q < 0.5
                Hawk[i].Position = (Rabbit.Position - AvrageHawks.position) - r3(LB + r4(UB - LB))
                Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
        if (|E[i]| < 1) then // Exploitation phase
            if (r ≥ 0.5 and |E[i]| ≥ 0.5) then // Soft besiege
                Hawk[i].Position = ΔHawk[i].Position - E | J Rabbit.Position - Hawk[i].Position |
                Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
            else if (r ≥ 0.5 and |E[i]| < 0.5) then // Hard besiege
                Hawk[i].Position = Rabbit.Position - E | ΔHawk[i].Position |
                Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
            else if (r < 0.5 and |E[i]| ≥ 0.5) then // Soft besiege with progressive rapid dives
                if F(Y) < F(X(t)) then
                    Hawk[i].Position = Y.position
                    Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
                if F(Z) < F(X(t)) then
                    Hawk[i].Position = Z.position
                    Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
            else if (r < 0.5 and |E[i]| < 0.5) then // Hard besiege with progressive rapid dives
                if F(Y) < F(X(t)) then
                    Hawk[i].Position = Y.position
                    Hawk[i].Position = Grasp(Hawk[i].Position, D, RF);
                if F(Z) < F(X(t)) then
                    Hawk[i].Position = Z.position
                    Hawk[i].Position=Grasp(Hawk [i].Position, D, RF);
    Pr1, Pr2 = Select_best(Hawks) // select 2 Hawks with the best fitness
    Child1, Child2 = crossover_mutation(Pr1, Pr2)
    substitute 2 children instead of 2 samples with the worst fitness
S = Hawks[1].position // final subset
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