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## **Nomenclature**

#### **List of Greek and Roman Symbols**

$P_{Loss}$	System	active	nower	loss
Loss	System	active	power	1033

 $P_a$  Active power injection at bus-a

 $Q_a$  Reactive power injection at bus-a

 $P_b$  Active power injection at bus-b

 $Q_b$  Reactive power injection at bus-b

 $\alpha_{ab}$ ,  $\beta_{ab}$  Loss coefficients

 $\delta_a, \, \delta_b$  Voltage angles at buses a and b

 $V_i$  Voltage in pu at bus-i

 $R_{ab}$  Resistance of the line connecting buses a and b

 $X_{ab}$  Reactance of the line connecting buses a and b

 $Z_{ab}$  Impedance of the line connecting buses a and b

 $P_{G,grid}^{T}$  Total active power injected though grid to the distribution network

 $P_{G,DG}^{T}$  Total active power injected by DG to the distribution network

 $P_{D,load}^{T}$  Total active power demand by the connected loads

 $Q_{G.erid}^{T}$  Total reactive power injected though grid to the distribution network

 $Q_{GDG}^{T}$  Total reactive power injected by DG to the distribution network

 $Q_{D,load}^{T}$  Total reactive power demand by the connected loads

 $S_{D,load}^{T}$  Total apparent power demand by the connected loads

 $Q_{Loss}$  System reactive power loss

 $S_{Loss}$  System apparent power loss

 $V_{min}$ ,  $V_{max}$  Minimum and maximum voltage limit

 $I_k$ ,  $I_k^{rated}$  Current and rated current of branch k

 $P^{T-1DG}$  Size of Type-1 DG in MW

 $Q^{T-2DG}$  Size of Type-2 DG in MVAr

 $S^{T-3DG}$  Size of Type-3 DG in MVA

 $\land$   $N \times M$  reef grid

 $\rho_0$  The ratio of free and occupied squares

 $F_b$  Broadcast spawners

1- $F_b$  Brooders

 $F_d$  Fraction of corals are depredated

*g*<sub>best</sub> Global best solution

*k* Number of attempts given to a larva to settle

w Inertia weight

 $c_1, c_2$  Individual cognition and social learning parameter

 $\lambda_1, \lambda_2, \lambda_3$  Penalty coefficient

 $G_{ab}$  Conductance of the branch ab

 $B_{ab}$  Susceptance of the branch ab

 $P_{Gi}$  Active power generated at bus-i

 $P_{Di}$  Active power demand at bus-i

 $Q_{Gi}$  Reactive power generated at bus-i

 $Q_{Di}$  Reactive power demand at bus-i

D Location of prey

B, E Penalty coefficient

 $\chi$  Position of particle

*v* Velocity of particle

 $G_c(t)$  Gravitational constant

 $Mass_i(t)$  Mass of individual element-i

 $\mathfrak{R}_{ij}(t)$  Euclidean distance between individuals

 $ff_i(t)$  Fitness value

 $\varepsilon$  Small constant

best(t) Best fitness value

worst(t) worst fitness value

 $k_b$  k best agents in the population

 $a_i^d(t)$  Acceleration for the iteration-t

 $P_{Di}^0$  &  $Q_{Di}^0$  Real and reactive power load at bus-i at nominal voltage  $V_i^0$  Nominal voltage at bus-i

\*\*\*\*\*

#### **List of Abbreviations**

RDS Radial Distribution System

DG Distributed Generation

PSO Particle Swarm Optimization

GWO Grey Wolf Optimization

OF Objective Function

VD Voltage Deviation

VSI Voltage Stability Index

SI Stability Index

MOFF Multi-Objective Fitness Function

GA Genetic Algorithm

GSA Gravitational Search Algorithm

PV Photo-Voltaic

DFIG Doubly Fed Induction Generator

MW Mega Watt

MVAr Mega Volt Ampere reactive

MVA Mega Volt Ampere

kW kilo Watt

CRO Coral Reef Optimization

SD Standard Deviation

US Unimodel Separable

UN Unimodel Non-Separable

MS Multimodel Separable

MN Multimodel Non-Separable

HGWO Hybrid GWO

CPLS Combined Power Loss Sensitivity

MINLP Mixed Integer Non-Linear Programming

EA-OPF Efficient Analytical- Optimal power flow

IA Improved Analytical

HSA-PABC Harmonic Search Algorithm -Particle Artificial Bee Colony

SOS Symbiotic Organism Search

WOA Whale Optimization Algorithm

PIPSO Parameter Improved Particle Swarm Optimization

SQP Sequential Quadratic Programming

CP Constant Power

CI Constant Current

CZ Constant Impedance

RL Residential Load

SDRL Summer Day Residential Load

WDRL Winter Day Residential Load

WNRL Winter Night Residential Load

IL Industrial Load

CL Commercial Load

SDCL Summer Day Commercial Load

SNCL Summer Night Commercial Load

WDCL Winter Day Commercial Load

AL Agricultural Load

EV Electric Vehicle

CCS Closed Switch Status

OSS Open Switch Status

AT&C Aggregate Technical & Commercial losses

\*\*\*\*\*