Multi-loop PID Controller Design for
Distillation Column using Firefly Algorithm

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Abstract— The main motivation of this manuscript is to develop a PID tuning procedure to improve the performance of the benchmark distillation column models using the heuristic firefly algorithm. A decentralised PID tuning approach is developed to design an independent PID controller for the top and bottom product loop. Minimization of a multi-objective function is chosen to guide the search process of the controller tuning procedure. The performance of the proposed approach is confirmed by evaluating the time domain parameters and the error values. From the experimental results, the main observation is that, proposed approach offers satisfactory result on the proposed approach and helps to achieve a reduced values of the time domain and error values. The proposed approach proves its efficiency in a benchmark Two Input Two Output (TITO) system. In future, this approach can be adopted to design controller for the multi-loop and non-linear systems existing in the process control literature. The proposed approach can also be compared against other heuristic approaches existing in the literature.

Key words: PID controller, distillation column, firefly algorithm, performance evaluation.

I  INTRODUCTION

In the chemical industry, design of optimal controller is widely preferred to maximize the profit by minimizing the waste. Due to the economical and environmental point of aspect, safe working condition is always preferred in chemical process loops. Implementation of a suitable controller structure is one on the technique to maintain the working process loop in its safe region[1-4]. In the literature, a number of controlling procedures are proposed and implemented to operate the process loops in a safer working region. In real time cases, the widely preferred controllers are PI/PID, since these controller structures are simple to understand and easy to implement[5-12].

In the proposed work, design of a suitable PID controller is discussed on a well known bench mark distillation process model. The distillation process is a really a complex unit with a series of actions or steps taken to achieve a particular end product with enhanced accuracy and purity. It is a series of interrelated tasks that, together, transform inputs into outputs[5-7]. Chemical, physical, electrical or mechanical procedures are the steps involved in industrial processes to aid in the manufacturing of an item, mostly carried out on a very large scale. Among the industrial process we use chemical process as they are multivariable in nature. Chemical process is a method intended to be used in manufacturing or on an industrial scale to change the composition of materials, usually using technology similar or related to that used in industry. Distillation column is said to be a separation process used for the purification of final products is widely implemented in chemical and petroleum industries. Due to their industrial significance they are generally used by the researchers.

Mostly industrial distillation processes are Multi-Input and Multi-Output (MIMO) in nature,i.e. a change or disturbance within a loop which causes to change the other loops through the cross-couplings between them, is the most important feature of a MIMO system. MIMO process is more complicated than a Single Input Single Output (SISO) process, but when implemented with a heuristic algorithm gives a better result with minimal errors[13].

In control process the literature gives us the modern and traditional approach for the design and optimization of PID controller. In this paper, PID controller design for MIMO process is addressed. The PID controller design is categorized as centralized and decentralized. Centralized system is far more complex than the decentralized
system due to the interaction between the loops. The heuristic algorithm is assisted with the initial parameters which is the centralized system for a TITO process is proposed in this work.

The remaining sections of this paper are arranged as follows. Section 2 gives the process description of distillation column with its benchmark models. Section 3 describes methodology adopted in this work. Section 4 gives a detailed results of this work and the corresponding discussions over it. The conclusion of the present work is discussed in section 5.

II PROCESS DESCRIPTION

The distillation column is one of the important devices to support liquid-liquid separation processes in the chemical industry. It works under the application of the removal of heat to exploit difference in rapid change unpredictably. Distillation can be used to separate binary or multi-component mixtures. Many variables, such as column pressure, temperature, size, and diameter are determined by the properties of the feed and the desired products. Fig 1 depicts the basic distillation column existing in the literature\[^{[1,5-7]}\].

![Fig. 1 Construction of distillation column](image)

The distillation column is used to convert the raw materials into final products. The mixture is applied on the distillation column, with a number of trays and a number of temperature regions. Based on the column temperature, the mixture is split into the Liquid (L) and the Vapour (V) products. The process for the distillation column is based on L-V structure or the energy balance method. In this control configuration, the vapour flow rate and the liquid flow rate are the control inputs. In figure 1 the schematic of the distillation column is shown. The benchmark distillation columns are WW and VL\[^{[14,16]}\].

Eqn. 1 shows the mathematical model of VL system widely considered by the researchers;

\[
G(s) = \begin{bmatrix}
\frac{2.2}{7s+1} e^{-2.8} & 1.3 \\
\frac{2.8}{9.5s+1} e^{-4.3} & \frac{9}{9.2s+1} e^{-0.35s}
\end{bmatrix}
\]  

(1)

Eqn. 2 shows the mathematical model of WW model;

\[
G(s) = \begin{bmatrix}
0.126 e^{-6s} & -0.101 \\
\frac{60}{6s+1} e^{-0.094} & \frac{1}{48s+1} e^{-8s}
\end{bmatrix}
\]  

(2)

The major aim of this work is to design a suitable PID controller using recent heuristic algorithms.
III METHODOLOGY

In this work, design of a centralised PID is addressed using the well known Firefly algorithm and its performance is validated against the PSO and BFO algorithms.

a. Firefly algorithm

The classical Firefly Algorithm (FA) was initially proposed by Yang [17]. FA is a nature inspired meta-heuristic algorithm, in which flashing illumination patterns generated by fireflies are modeled using a suitable mathematical expression. In this work, the recent version of the FA discussed in [18-20] is considered.

The pseudo code of FA is presented

```
START;
    Initialize essential algorithm parameters, \( D \) and \( f(T) \);
    Generate initial locations of 'n' fireflies for \( x_i \) \( (i = 1, 2, \ldots n) \);
    Determine the intensity of \( i^{th} \) firefly based on \( f(T)_i \) value
    If \( \text{iter} < M_{\text{iter}} \);
        For \( i = 1,2, \ldots, n; \)
            For \( j = 1,2, \ldots, n; \)
                If intensity of firefly \( j > i, \)
                    Calculate the Cartesian distance and move the \( i \) towards \( j; \)
                End if;
            End for \( j; \)
        End for \( i; \)
    End if;
    Sort the fireflies in descending order based on the rank and find the optimal value;
    End if;
    Record the \( f(T) \) and optimal threshold values.
STOP;
```

The updated position of a firefly in a \( D \) – dimensional search space can be expressed as;

\[
X_{i+1} = X_i + \beta_\alpha e^{-\gamma_g (X_i - X_j)} + \alpha_s \text{sign(rand - 1/2)} \oplus A |f(T)|^{1/2} \tag{3}
\]

where, \( X_{i+1} \) is updated position of \( i^{th} \) firefly, \( X_i \) is initial position of \( i^{th} \) firefly, \( \beta_\alpha e^{-\gamma_g (X_i - X_j)} \) is the attraction between fireflies, \( A \) is a random variable, \( \beta \) is the spatial exponent, \( \alpha \) is the temporal exponent, and \( \Gamma(\beta) \) is the Gamma function. The details of FA can be found in the literature. The FA parameters are assigned as; dimension of the search \( D = T \); population of firefly is chosen as 30, number of iterations are assigned as 1000 and the stopping criteria is the \( f(T) \).

b. Particle swarm optimization

PSO is a population based stochastic optimization technique inspired by social behaviour of bird flocking or fish schooling, and it is widely used in engineering applications due to its high computational efficiency. PSO algorithm is easy to implement and there are few parameters to adjust compared to other heuristic methods. It is a population based evolutionary computation technique, attempts to mimic the natural process of group communication of individual knowledge, to achieve some optimum property. It has two basic equations namely the velocity update and position update as presented below [21]:

\[
V'_i(t+1) = W(t) + V'_i(t) + C_1 R_1 (P'_i - S'_i) + C_2 R_2 (G'_i - S'_i) \tag{4}
\]

\[
X'_i(t+1) = X'_i + V'_i(t+1) \tag{5}
\]

where \( W(t) \) = inertia weight coefficient (typically 0.7), \( V'_i(t) \) = current velocity of particle, \( V'_i(t+1) \) = updated velocity of particle, \( X'_i \) = current position of particle, \( X'_i(t+1) \) = updated position of particle, \( R_1 \) and \( R_2 \) are
random numbers between \(\{0, 1\}\), \(C_1\) = cognitive coefficient (typically 2.0), and \(C_2\) = social coefficient (typically 1.8).

c. Bacterial foraging optimization

Bacteria Foraging Optimization (BFO) algorithm is a biologically inspired stochastic search technique based on mimicking the foraging (methods for locating, handling and ingesting food). During foraging, a bacterium can exhibit two different actions: Tumbling or swimming. The tumble action modifies the orientation of the bacterium. During swimming (chemotactic step) the bacterium will move in its current direction. Chemotactic movement is continued until a bacterium goes in the direction of positive nutrient gradient. After a certain number of complete swims, the best half of the population undergoes reproduction, eliminating the rest of the population. In order to escape local optima, an elimination-dispersion event is carried out where, some bacteria are liquidated at random with a very small probability and the new replacements are initialized at random locations of the search space.

In the proposed work, the enhanced BFO algorithm discussed in [22] is adopted. The initial BFO parameters are assigned as follows:

\[
\text{Number of E.Coli bacteria} = N = 30, \quad N_c = \frac{N}{2}; \quad N_s = N_{re} = \frac{N}{3}; \quad N_{ed} = \frac{N}{4}; \quad N_r = \frac{N}{2}; \quad P_{ed} = \left(\frac{N_{ed}}{N + N_r}\right);
\]

\[
d_{\text{attract}} = W_{\text{attract}} = \frac{N_s}{N}; \quad \text{and} \quad h_{\text{repell}} = W_{\text{repell}} = \frac{N_r}{N}
\]

A detailed description of the considered BFO algorithm can be found in [10].

d. Implementation

This section discusses the implementation of the proposed controller design procedure for the chosen MIMO process models. Fig. 2 depicts the implementation of the proposed centralised PID design procedure.

![Fig. 2 Implementation of the proposed PID tuning approach](image)

This process has two controllers, such as PID\(_1\) and PID\(_2\). Both the PIDs have the similar structure and the mathematical expression is given below:

\[
\begin{align*}
\text{PID}_1 &= K_{p1} + \frac{K_{i1}}{s} + \frac{K_{d1}s}{T_fs + 1} \\
\text{PID}_2 &= K_{p2} + \frac{K_{i2}}{s} + \frac{K_{d2}s}{T_fs + 1}
\end{align*}
\]
where $T_f = T_d/N_f$; $T_d$ = derivative controller time constant; and $N_f = 10$.

In this paper the heuristic algorithm, known as FA, which was first recently inspired by the nature of fireflies and the technique proposed is assisted by a PID controller design for the most common multi-variable system such as, Wardle-Wood (WW) and Vinante-Luyben (VL) models. The PID control optimization is designed for both top product and bottom product. In order to obtain the best optimal values the design process is repeated several times and the mean of the controller values are taken to be $K_p$, $K_i$, $K_d$, $K_{p2}$, $K_{i2}$, $K_{d2}$ are recorded. The simulation study is recorded using the MATLAB software to compare with the other algorithms which existed in the literature. In order to have a fair comparison, all the algorithms are assigned with the same population size, iteration number, stopping criteria and objective function.

IV RESULTS AND DISCUSSION

This section presents the performance of FA based PID controller of MIMO for VL model and WW model. The tabulation shows the performance comparison study of BFO, PSO and FA in which the $K_p$, $K_i$ and $K_d$ values of BFO and PSO are attained from the existing literature. They are tabulated for the values by simulating it for the PID controller for a MIMO process. They are simulated using MATLAB 2013a version.

| Process | Method | Top product | Bottom product |
|---------|--------|-------------|----------------|
|         |        | $K_p$       | $K_i$   | $K_d$   | $K_p$       | $K_i$   | $K_d$   |
| VL      | FA     | -1.1624     | -0.1981 | 0.5807 | 0.8989     | 0.1588 | 0.2182 |
|         | BFO    | -1.0174     | -0.4225 | 0      | 2.0935     | 0.4063 | 0      |
|         | PSO    | -0.8747     | -0.5105 | 0      | 2.1638     | 0.4111 | 0      |
| WW      | FA     | 12.7069     | 0.4711  | 1.9571 | -10.1500   | -0.4175 | 9.5116 |
|         | BFO    | 1.9903      | 0.4028  | 0      | -0.9566    | -0.5088 | 0      |
|         | PSO    | 2.3552      | 0.3067  | 0      | -1.0345    | -0.4149 | 0      |

| Method | Top product | Bottom product |
|--------|-------------|----------------|
|        | ITAE | ITSE | ISE | Mp | Ts | ITAE | ITSE | ISE | Mp | Ts |
| VL     | FA   | 5.166 | 2.075 | 1.912 | 0.06 | 16 | 11.24 | 1.661 | 1.388 | 0.07 | 34 |
|        | BFO  | 19.55 | 4.811 | 2.3 | 0.3 | 28.3 | 5.637 | 0.9216 | 0.9157 | 0.35 | 41 |
|        | PSO  | 36.38 | 8.537 | 2.786 | 0.45 | 47.3 | 6.563 | 1.067 | 0.9549 | 0.38 | 36 |
| WW     | FA   | 1496 | 307.6 | 19.34 | 0.15 | 350 | 619.5 | 193.3 | 17.71 | 0.05 | 210 |
|        | BFO  | 9644 | 2144 | 42.5 | 0.41 | 450 | 8442 | 1902 | 40.06 | 0.51 | 460 |
|        | PSO  | 7710 | 1706 | 40.9 | 0.31 | 500 | 6464 | 1455 | 37.52 | 0.41 | 580 |

The figure 3 (a) and (b), represents the top and bottom product of the VL model using the transfer function existing in the literature. The simulation time is assigned as 100 sec for both top and bottom product of VL distillation model. The performance measure values are tabulated in Table 1.

The figure. 4 (a) and (b), represents the top and bottom product of WW model. The same simulation process is implemented in WW model of distillation column using its transfer function existing in the literature. Here the simulation time is assigned as 500sec for both top product and bottom product of WW distillation model. The optimized controller values are tabulated in Table 1 and the corresponding results are presented in Table 2.
V CONCLUSION

The best possible controller parameters are found for the MIMO system using firefly algorithm are discussed in this paper. The proposed centralised PID controller is tested using the desired benchmark distillation column of WW and VL models. Hence by changing the Kp, Ki, Kd values the response of the system is improved and the graphical representation of the system shows that there is an improvement in the values which gives a lesser peak overshoot and settling time. This study shows that the obtained results provided by the firefly algorithm gives better results when compared with the other existing values existing in the literature.

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