

MODELLING AND CONTROLLER DESIGN FOR
POSITION TRACKING OF PNEUMATIC ACTUATOR SYSTEM

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MODELLING AND CONTROLLER DESIGN FOR
POSITION TRACKING OF PNEUMATIC ACTUATOR SYSTEM

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DEDICATION

This thesis is dedicated to Professor Ts. Dr. Mohd Fua'ad Rahmat for his advice, faith and patience with me on my road toward this master thesis completion. It is also dedicated to myself, who had endured this research journey during the pandemic.

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ABSTRACT

To control a pneumatic actuator precisely is not a simple task, as the actuator system consists of many unknown and unpredictable non-linearity. In the worst case, it is prone to disturbances where the position tracking will be inaccurate. This thesis proposes an adaptive controller design for position tracking of the pneumatic actuator system, validated via a simulation study. Considering the mentioned problem, the proposed solution is an Extremum Seeking (ES) based PI(D) controller. This decision is based on the favour of current industry trends, that is, to maintain PID control structure while providing a model-free, data-driven approach and smart control scheme. A preliminary progression has been made to confirm the simulation model for the future controller design stage. The modelling methodology is carried out using the empirical method, and the selected model is *ARX331* structure polynomial model. This is due to the consideration of the parsimonious / theoretical structure of the model and high validation accuracy. Additionally, the model is subjected only for simulation purposes and not for model-based controller design. The benchmark controller tuning using Ziegler-Nichols and IMC-PID approach is carried out to investigate the relationship of PID parameters to the performance of the pneumatic actuator system in position tracking. The proposed model-free online parameter optimization scheme using extremum seeking algorithm is applied on Proportional and Integral paths because it is found that these 2 paths are the primary source of affecting the transient performance response based on the investigation from the benchmark controller. The simulation validation test is carried out using 2 different types of input: step input of 50 mm, 100 mm, 150 mm, and square wave input of ± 50 mm and ± 75 mm. The learning ability of the proposed controller scheme was observed when the parameters of the ES-PI(D) controller would automatically tune without properly initialisation and provides a consistent response behaviour when subjected to different inputs. Besides, consistency in transient response and settling time is one of the most significant advantages of the proposed controller.

ABSTRAK

Pengawalan sistem penggerak pneumatik dengan tepat bukanlah sesuatu tugas yang mudah, kerana sistem tersebut mempunyai sifat tidak linear yang sukar dikenal pasti dan diramalkan. Dalam keadaan terburuk, ia terdedah kepada gangguan di mana penjejakan kedudukan akan menjadi tidak tepat. Oleh itu, tesis ini mencadangkan pelan penyelidikan yang jelas untuk mereka bentuk pengawal bagi penjejakan kedudukan sistem penggerak pneumatic dan divalidasi melalui kajian simulasi. Berdasarkan masalah yang disebutkan awal, penyelesaian yang dicadangkan ialah pengawal PID adaptif dengan algoritma pencarian ekstrem (ES). Keputusan ini adalah berdasarkan trend industri semasa, iaitu untuk mengekalkan struktur kawalan PID, pada masa yang sama, pendekatan tanpa model, kawalan pacuan data dan skim kawalan pintar digunakan. Perkembangan awal telah dibuat iaitu untuk mengesahkan model simulasi yang akan digunakan dalam peringkat reka bentuk pengawal akan datang. Metodologi pemodelan dijalankan menggunakan kaedah empirikal dan model yang dipilih adalah model polinomial struktur $ARX331$, ini disebabkan pertimbangan antara struktur parsimonious/teori model, dan ketepatan pengesanan yang tinggi. Selain itu, model ini tertakluk hanya untuk tujuan simulasi dan bukan untuk reka bentuk pengawal berasaskan model. Penalaan pengawal penanda aras menggunakan pendekatan Ziegler-Nichols dan IMC-PID dijalankan untuk menyiasat hubungan parameter PID terhadap prestasi sistem penggerak pneumatik dari segi pengesanan kedudukan. Skim pengoptimuman parameter bebas model dan dalam talian yang dicadangkan menggunakan algoritma pencarian ekstrem digunakan pada laluan Proportional dan Integral, kerana didapati bahawa 2 laluan ini adalah sumber utama yang mempengaruhi tindak balas sementara prestasi berdasarkan penyiasatan daripada pengawal penanda aras. Ujian pengesanan simulasi dijalankan menggunakan 2 jenis input yang berbeza: input langkah 50 mm , 100 mm , 150 mm , dan input gelombang persegi $\pm 50\text{ mm}$ dan $\pm 75\text{ mm}$. Keupayaan pembelajaran skema pengawal yang dicadangkan telah diperhatikan apabila parameter pengawal ES-PI(D) akan ditala secara automatik tanpa dimulakan dengan betul dan memberikan gelagat tindak balas yang konsisten apabila tertakluk kepada julat input yang berbeza. Selain itu, ketekalan dalam tindak balas sementara dan masa penyelesaian adalah salah satu kelebihan terbesar pengawal ES-PI(D).

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LIST OF ABBREVIATIONS

ARX	-	Autoregressive Exogenous
DAQ	-	Data Acquisition
ES	-	Extremum Seeking
IMC	-	Internal Model Control
MSE	-	Mean Squared Error
PA	-	Pneumatic Actuator
PID	-	Proportional – Integral – Derivative Controller
SMC	-	Sliding Mode Control
UAV	-	Unmanned Aerial Vehicle
ZN	-	Ziegler – Nichols

LIST OF SYMBOLS

$\underline{\gamma}$	-	Adaptation gain
$e(t)$	-	Error signal / difference between $r(t)$ and $y(t)$
ω_h	-	High pass frequency
$\underline{\theta}_0$	-	Initial parameters
$u(t)$	-	Input signal / actuator valve's voltage
$\underline{\theta}_{k,max}$	-	Maximum saturation limit
$\underline{\theta}_{k,min}$	-	Minimum saturation limit
$y(t)$	-	Output signal / cylinder position
$\underline{\alpha}$	-	Perturbation amplitude
$\underline{\omega}$	-	Perturbation frequency
$r(t)$	-	Reference signal / desired cylinder position
T_s	-	Sampling time

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CHAPTER 1

INTRODUCTION

1.1 Problem Background

An actuator is a device that makes another machine / device to moves mechanically. There are 2 types of standard actuators: the linear actuator for straight motion and the rotary actuator for circular motion. All actuator requires a source of energy to operate. In industrial applications, there are 3 common energy sources: electric, hydraulic and pneumatic. The hydraulic and pneumatic sources are classified as fluidic sources too. The pneumatic actuator (PA) system refers to a series of pneumatic sourced interconnected components, including a pneumatic actuator, that results in a mechanical movement when operated. PA system is commonly found in manufacturing and automation industries to execute high frequency and repetitive mechanical motion.

Compared to electrical and hydraulic actuator systems, the PA system possesses some absolute advantages, such as providing a greener, cleaner and fail-safe environment (oil/spark free) and lower operation and maintenance costs. Due to these advantages, the PA system gradually becomes the standard solution in industry by replacing the electrical actuator system. However, controlling a PA system to perform precision position tracking is not easy compared to electrical actuators. It is mainly caused by high nonlinearities in the fluidic system; these nonlinearities include non-linear dynamics in compressible air, frictional properties and etc. Research about position/servo tracking of PA systems can be dated back to the 1990s and increased significantly by the 2010s when the control and automation field drew attention due to the introduction of Industry 4.0

1.2 Problem Statement

As stated previously, the advantages of a pneumatic actuator (PA) systems are significant. They are cheaper, durable and safer compared to other actuator systems. However, one of the most significant issues in PA systems is the difficulty in executing precise position tracking. It is mainly caused by unpredictable system dynamics, especially in a system that uses fluid (pressurized air) sources. This led to a situation where model-based controller design or model-driven approach for position tracking of PAS becomes difficult as the model of PAS is not always accurate or available. Thus, a non-model-based controller design or data-driven approach might be an option for this situation.

Besides, the implementation of PID controller for PAS in the industry is still widely used, despite it being an ‘old’ technology in the eyes of a particular group. This is mainly caused by the practice of manual tuning, which is a time-consuming task that relies on an engineer’s experience for fine-tuning. Therefore, following the emergence of adaptive control theory, it is possible to tune the optimal PID parameters in a closed-loop setting (direct / online tuning). To overcome these weaknesses, an optimal-based adaptive PID tuning control strategy for position tracking is proposed: Adaptive Extremum Seeking PID controller.

1.3 Research Goal

1.3.1 Research Objectives

The aim of the project is to design a controller for position tracking of the pneumatic actuator system. The specific objectives are shown below:

- (a) To perform model identification of pneumatic actuator system using empirical modelling technique from secondary data.

- (b) To design a controller for a pneumatic actuator system with the following features: Data-driven control, adaptive extremum seeking PID tuning, closed-loop system stability guaranteed.
- (c) To compare the performance of the proposed controller with another rule-based controller.

1.3.2 Research Scopes

The scopes of the project are shown below:

- (a) The simulation tool for this project is subjected to MATLAB/Simulink only.
- (b) The Data Acquisition (DAQ) card used in this research is SCB-68 by National Instrument.
- (c) The process rig consists of an air compressor, pneumatic cylinder, 2 pressure sensors, 1 electromagnetic displacement sensor and 1 control valve.
- (d) This research work is limited to adaptive controller design only.

1.3.3 Research Limitation and Assumptions

The limitation and assumptions of the project are:

- (a) For the ease of controller design, the noise from the system is assumed to be nearly zero.
- (b) The supply pressure and temperature change throughout the position tracking process are constant.
- (c) The nonlinear factors are ignored during modelling. They may be hysteresis, pressure change, frictional loss, etc.

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1. Khong, F., Rahmat, M., Sunar, N., Ramli, M., Jamaluddin, J., Ahmad, N., Nawawi, S., Ibrahim, S., & Md. Yunus, Y. (2022). Linear ARX modelling of pneumatic actuator system. In A. Shamsudin, A. Ahmad, & R. Abdul Rahim, *Sensor & Instrumentation System*, 28, 125-145. Parit Raja, Batu Pahat, Johor: Penerbit UTHM.