Multi-arm Robotic Swimmer Actuated by Antagonistic SMA Springs

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Abstract—The present paper considers the modeling, control, development and experimental validation of bio-inspired multi-arm underwater robotic swimmers actuated by compliant actuating elements, in the context of the soft robotics paradigm. Each one of the swimmer’s compliant arms is actuated at its base by a pair of antagonistic compliant shape memory alloy (SMA) springs. The base joint of each such arm displays hysteretic behavior and asymmetries, which are compensated via the modified Prandtl-Ishlinskii (MPI) model of the joint’s response, in conjunction with angular position feedback from a potentiometer. This closed-loop control scheme achieves fast and efficient tracking of a sculling joint motion profile. Experimental results based on a pair of such submerged arms, integrated in a catamaran hull, indicate the feasibility of this actuation and control scheme, providing propulsive speeds up to approximately 0.5 arm lengths per second (~50 mm/sec) and propulsive forces up to 30 mN. The experimental studies presented, regarding the effect of the arm kinematic parameters on propulsive speed and force, are in qualitative agreement with previous results of our group for rigid-actuator multi-arm underwater swimmers.

Index Terms—Bio-Inspired Robotics, Soft Robotics, Marine Robotics, Shape Memory Alloys, Control, Prandtl-Ishlinskii model.

I. INTRODUCTION

The exploitation of soft components on sophisticated robotic systems can greatly enhance their manipulation and locomotion capabilities, offering solutions to robotic applications in complex environments [1]. Shape Memory Alloys (SMA) have been commonly used, in recent years, as compliant actuation structures on soft robots. The advantages of SMAs lie on the material’s characteristics, being lightweight, small, simple in design and quiet in operation [2], [3]. Nickel-Titanium (Ni-Ti) SMA actuators have, further, the advantage of being highly ductile, reversible, corrosion resistant, highly bio-compatible, and easily electrically heated. The increased energy density of SMAs allows for the use of such actuators on reduced size systems; their structure can be configured into springs that intensify their stroke [4].

The use of compliant SMA actuators in robotics is gaining increasing popularity against rigid servomotors, in particular for biologically-inspired systems, aiming, for example, at emulating the efficiency of animal muscles, for both terrestrial [5]–[8] and aquatic locomotion [9]–[11]. Known challenges associated with SMA actuation relate primarily to their control precision, that requires compensation of several nonlinear effects, in order to avoid undesirable dynamical phenomena, instabilities in the system, or performance tracking difficulties. Such nonlinearities are predominantly due to the material’s complex hysteretic behavior, which, in turn, is related to the shape memory characteristic of the SMA. Another limitation of the control of SMAs is the requirement for low-bandwidth operation, which is due to their slow response time during the cooling transition.

Within this framework, this paper discusses a closed-loop control strategy for rotary joints actuated by an antagonistic pair of SMA springs, and presents proof-of-concept design and experimental results of a two-arm planar swimmer with soft arms and actuation. The control scheme incorporates the inverse of the modified Prandtl-Ishlinski model [12] of the system’s response as a feedforward term for hysteresis and asymmetry compensation, along with a feedback controller, to achieve effective tracking of the reference angular position. The proposed scheme is found to be effective in reduced size systems, with moderate to low computational effort.

The effect of a soft body on a multi-arm underwater robot has been recently presented in [13]–[17], for designs inspired by the octopus morphology. These soft-body robots employ eight compliant arms and a passively-compliant web, but use rigid actuators (micro-servomotors). The corresponding model includes information from detailed hydrodynamic studies [18]–[21] and is in accordance with relevant elastodynamic investigations of octopus arm muscle activation [22], [23]. These prototypes have demonstrated forward and turning propulsion with sculling-only gaits, achieving speeds of up to 0.5 body lengths per second with the web, and maximum propulsive forces of 10.5 N, with a cost of transport as low as 0.62 [14]; they have also been tested for grasping capabilities and suitability in a marine ecosystem [13].

The aim of the present paper is to extend these previous studies by incorporating soft actuation by SMA springs, in place of the rigid servos, and, thus, reducing the size of the robot swimmers. The speed and accuracy of the arm motion, which can be achieved with such actuators, is significantly ameliorated by employing closed-loop control of the SMAs. Indeed, open-loop control of the SMAs induces scaling and delaying effects to their response when tracking a desired joint arm trajectory (in particular, the “sculling” profile used in [13]), which are improved by our closed-loop scheme.

Section II of the paper presents a methodology for the
closed-loop control of a rotary joint actuated by an antagonistic pair of SMA springs, and its experimental validation using a single-joint testbed. Section III presents the modeling and CFD studies, and the design of a proof-of-concept prototype SMA-actuated robotic swimmer, with two arms actuated by pairs of SMA springs and whose control is based in the above methodology, as well as associated experimental studies. Finally, Section IV summarizes the results of this work, and discusses its impact.

II. CONTROL OF SMA-ACTUATED JOINTS

A. SMA-actuated arm and control methodology

The 1-dof rotary joint prototype arm, employed in the current work, is shown in Fig. 1. Two identically “trained” SMA springs, positioned symmetrically on the lateral sides of the joint in an antagonistic configuration, allow bidirectional actuation of the soft arm in the transverse plane, achieving a $40^\circ$ span of rotation. The SMAs, made of 250 $\mu$m-diameter NiTi wire (Flexinol, Dynalloy Inc.), were first wrapped tightly around a 2 mm rod to form them into coils of 5 mm in length (which correspond to 73 mm length of uncoiled NiTi wire), before being heated in an oven at 450 $^\circ$C, for 20 min, and then cooled down with water outside the oven. This process trains the SMAs to remember the shape of the coil and to revert to this shape upon heating, after being deformed. In order to allow underwater operation of the joint, the actuator SMA springs are coated with Teflon. A rotary potentiometer, mounted on the joint, is utilized to provide feedback for its angular position. A CortexM4-based microcontroller platform (Teensy 3.1) is used to control the prototype, by collecting the potentiometer’s signal with an on-board 12-bit A/D converter, and generating PWM signals for the regulation of the SMAs electrical power supply from a 7.4 V source, via a pair of IRFZ44 mosfets.

The SMA-actuated arm is made of soft silicone rubber (Dragon Skin Q), taking on a conical shape with 10 mm in base diameter, 1 mm in tip diameter, and 100 mm in length. The shape of the arm is chosen to emulate the octopus arms, as described in [14]–[18], [21].

The implemented strategy for the joint actuation in the experimental prototype, based on the antagonistic activation of the two SMA springs, is depicted in Fig. 2. Turning moments are produced through the force generated by the SMA spring in the corresponding side, as it contracts through PWM-regulated electrical heating. Being related to the duty cycle of the PWM signals generated by the microcontroller, the range of the SMA activation command signal is -100% to 100%, where its sign denotes the desired turning direction (and, hence, which of the two SMA springs will be activated), while its magnitude affects the extent of the turning motion. The duty cycle of PWM signals originates from “smooth activation” modules that allow the SMAs to change smoothly between heated and non-heated states [24]. Figure 3a depicts the input-output characteristic of these modules, the transition phase of which is large enough to allow pre-heating of the opposite SMA, and therefore reduction of the response time for a nearly zero control signal. Here, we assumed a transition phase of $[-4a,4a]$, where $a$ is equal to 4% of the control input maximum value.

The adopted control scheme follows the approach of [12], [25] by applying the inverse of the modified Prandtl-Ishlinskii (MPI) model of the system’s response, to the command signal. The MPI model offers good handling of asymmetries in the hysteresis loop, approximating hysteretic nonlinearities by a linearly weighted superposition of $n+1$ backlash operators, with magnitudes of $r_i$ (where $0 \leq i \leq n$) and weight values of $w_{hi}$, and in series with a linearly weighted superposition of $2m+1$ one-sided dead-zone operators of different thresholds $d_j$ (where $-m \leq j \leq m$) and weight values $w_{sj}$. Fig. 3b shows the input-output characteristics of these operators. The existence of the inverse MPI model is true under specific conditions and, like the original MPI model, has $n+1$ backlash operators and $2m+1$ one-sided dead-zone operators, characterized by a respective set of parameters, i.e., $w'_{hi}$, $r'_i$, $w'_{sj}$, and $d'_j$.

As detailed in [26], our closed-loop position control methodology, which is based on the approach of [12], [25], employs first open-loop response data to calculate the MPI model $H$ of the arm’s response and its inverse $H^{-1}$. The feedforward term $H^{-1}$ is then combined with a proportional-integral (PI) feedback controller with anti-windup, which
utilizes the angular position feedback signal from a joint potentiometer (Fig. 2). Normalization of the hysteresis’ compensator input and the output signals, via the gains $K_{in}$ and $K_{out}$ in the feedforward path, allows scaling of the reference angular position to the control input range. SMA overheating is avoided by assigning, through the “limiter” block, to the activation signal suitable constraints, here specified so that the PWM duty cycle does not exceed 60%.

**B. Experimental results for a single SMA-actuated arm**

The primary arm motion profile that was implemented here, is based on a two-stroke pattern, termed *sculling* [14]–[17], which emulates the kinematics of octopus arm-swimming behavior. It involves a velocity ratio $\beta$ between a slow recovery stroke (opening part) and a faster power stroke (closing part) of the arms. The angular trajectory of the SMA-actuated joint is then implemented according to the acceleration profile described in [15], characterized by the following motion parameters: the angular offset $\psi$, the angular amplitude $A$, and the maximum angular velocity of the recovery stroke $\omega$. The total duration of one sculling period of motion is $T_s = T_p + T_r$, with $T_p = 2.5A/(\beta \omega)$ and $T_r = \beta T_p$ being, respectively, the power and recovery time durations. That makes $T_s = (\beta + 1)T_p$.

Following the control scheme described in Section II-A, Fig. 4 shows results from the system’s open loop response to SMA activation with such a sculling signal. The plot demonstrates the effects of hysteresis and asymmetry, which result in the output trajectory deviating significantly from the sculling profile. These input-output data were used to calculate the MPI model $H$ and its inverse $H^{-1}$. The performance attained under the combined feedback-feedforward control scheme, implemented as per Fig. 2 at a 100 Hz rate, with the PI gains set to $k_p = 3.0$ and $k_i = 0.03$, is shown in Fig. 5. The angular position of the SMA-actuated arm can be seen to track effectively the reference signal (a sculling profile with $A = 15^\circ$, $\psi = 0^\circ$, $\omega = 40^\circ/\text{sec}$ and $\beta = 3$), with the exception of a relatively small overshoot that occurs at the end of the power stroke. We also note that the response is quite fast, and exhibits minimal lag with respect to the reference, indicating successful cancellation of the hysteresis.

**III. TWO-ARM ROBOT SWIMMER**

**A. Simulation studies**

Utilizing computational fluid dynamics (CFD) methodologies, we examined in simulation a two-arm swimmer (Figs. 6), modeled after the robotic prototype of Section III-B. The geometries of the arms are identical to those used in the robot and the swimmer is tested at a stationary position, for rigidly moving arms (with and without non-folding flaps), undergoing the two-stroke sculling motion ($A = 5^\circ$, $\psi = 10^\circ$, $\omega = 10^\circ/\text{sec}$ and $\beta = 3$). The details of

![Fig. 6: Hydrodynamic simulations of a two-arm swimmer, modeled after the robotic prototype of Section III-B. Vortical patterns are depicted in blue in the near wake of rigidly moving arms (a,c) without flaps and (b,d) with flaps. (a,b) Recovery stroke. (c,d) Power stroke.](image)

**Fig. 5: Tracking of a reference sculling trajectory by the SMA-actuated joint under the combined feedback-feedforward control scheme. The lower graph shows the control signal.**

![image](image)

**Fig. 4: Open loop response of the joint angular position to a sculling-shaped SMA activation command input.**
the CFD methods, as well as further related results, can be found in [19], [20], [27].

Fig. 6 depicts the fluid field, exhibiting unstructured vortical flow, developed around the rotating arms. The CFD simulations were used to evaluate the total force components (along the swimmer’s axis and in the lateral, in-plane direction; Fig. 7) for the two-arm system, and under the effect of flaps. They confirm the generation of a propulsive forward thrust, which is higher than for single-arm systems [18], [21], and considerably increases for arms with flaps (5.6-fold difference in the peak values, Fig. 7a). More importantly, the lateral force is, on average, nearly zero for the two-arm system, in both arm geometries (Fig. 7b), compared to a substantial lateral force for equivalent one-arm systems.

B. SMA-actuated robotic prototype swimmer

Based on the results of the modeling studies, a robotic prototype of a two-arm swimmer (Fig. 8), was fabricated as a proof-of-concept design for soft actuation via SMA springs. The prototype has a rigid body resembling a twin-hull catamaran, and two compliant arms, mounted on the underside of each hull via 1-dof compliant rotary joints, which are actuated by antagonistic pairs of SMA springs, as described in Section II-B. The body is fabricated by ABSplus material, in a 3D printer (Dimension Elite, Stratasys, USA). Each hull, of dimensions 180 mm x 45 mm x 45 mm, is cylindrical, with its two edges shaped as prolate hemispheroids, in order to reduce hydrodynamic resistance. The axis-to-axis distance between the parallel streamlined hulls is 140 mm. At 30 mm above the hulls’ axes, lies a rectangular (90 mm x 95 mm x 70 mm) superstructure that houses the electronics and the battery. The SMA-actuated joints are mounted on the middle of the bottom face of each hull, at a position parallel to the direction of swimming; in total, the design can accommodate 6 discrete offset positions with respect to the direction of motion, at every 30°. The overall dimensions of the prototype are 180 mm in length, 140 mm in width, and 122.5 mm in height, of which approximately 35 mm are submerged. The overall weight of the robot without the arms is 331 gr.

Apart from the silicone arms described in the previous Section (weighing 3 gr each), a pair of ABSplus-made arms (2 gr each) was also tested with the swimmer (referred to as “rigid”), as well as a second pair of silicone arms (7 gr each), incorporating a pair of novel design “flaps”, symmetrically positioned at the lateral sides of the arm’s axis and at an angle of 120° between them (Fig. 9). The flaps’ design features thinner layers of material along their junction with the arms, allowing the flaps to almost align with the flow during the recovery stroke of the motion (minimizing, therefore, the induced fluid drag force), while hindering them from reversing during the power stroke (increasing, hence, the projected body area to the flow and maximizing the induced drag). This body-drag difference between power and recovery stroke is meant to enhance the propulsive force generated by the sculling profile, as described in [14]. Although this strategy unavoidably imposes unequal workload on the antagonistic SMAs of the soft joint, the experiments demonstrated good SMA behavior. These flaps emulate, to some extent, the web between the arms of the octopus [14].

The robot is fully untethered and energetically autonomous, being powered by a Li-Po battery located inside the superstructure. The latter also houses the microcontroller platform that controls the two SMA-actuated joints, as well as the associated power electronics (see Section II-A). Wireless communication between the microcontroller and a host PC is implemented via a bluetooth link.

The prototype was tested inside a water tank with dimensions 200 cm x 70 cm x 60 cm. Its position and orientation was tracked with a high-definition camera, via computer vision methods, using a checkerboard marker of known size, placed on top of the superstructure (Fig. 8b). Following the motion profile described in Section II-B, several different gaits can be generated from the combination of the two arms, for both forward [15] and turning [16] maneuvers. In this work, we examine gait G1 [15], in which both arms move...
in synchrony.

Force measurements on the robot are performed with a custom test-rig, shown in Fig. 10, and acquired with a high-precision digital force gauge (Alluris FMI-210A5).

C. Experimental results

Experiments with the two-arm robotic swimmer, performing the sculling profile described in [14], demonstrated the generation of forward propulsion via soft, SMA-actuated 1-dof rotary joints, employing the proposed control scheme. The accurate and robust tracking of the arms’ reference trajectories, afforded by the closed-loop controller, contributed significantly to the effective mutual cancellation of the side forces generated by the two arms, to ensure the straight-line propulsion of the vessel with minimal yawing motions (footage in accompanying video).

Indicative results for the simplified arms (rigid and compliant) and the arms with flaps, are shown, respectively, in

Figs. 11a, b and c, for $A = 15^\circ$, $\psi = 30^\circ$, $\omega = 40^\circ/$sec and $\beta = 3$. The instantaneous velocity exhibits periodic variations, induced by the two-stroke sculling motion, with distinct peaks, corresponding to the power stroke, being more evident for the arms with flaps.

As shown in Fig. 12, the robot’s average steady-state speed $V_b$, was found to increase with the angular velocity $\omega$, for all of the three arm designs tested. The maximum $V_b$ value attained with the soft arms with flaps, for $A = 15^\circ$, $\psi = 30^\circ$, $\omega = 40^\circ/$sec and $\beta = 3$, was around 28 mm/s, significantly higher than the corresponding ones for both the simple compliant arms (28 mm/s) and the rigid arms (17 mm/s). The fact that the latter were found to be the least effective ones can be attributed to the increased loading for rotation of non-compliant arms, which hinders accurate tracking of the prescribed profile.

These findings correlate well with the results of the force measurements (Fig. 13), obtained with the setup in Fig. 10. It can be seen that the propulsive forces developed by the arms with flaps are considerably higher than those of both the plain silicone and rigid arms. The data in Fig. 13 also indicate that the positive thrust peak (reaching values of around 28 mN in the case of the arms with the flaps) occurs during the arms’ power stroke, while negative forces, of a lower peak value, are generated as the recovery stroke is initiated. It should be noted that these observations are in close agreement with the results of the CFD simulations (cf. Fig. 7a).

Fig. 11: Experimental results with closed-loop control: Forward propulsion attained with (a) rigid or (b-c) compliant arms, (b) without and (c) with folding flaps, for swimming with sculling gait G1 ($A = 15^\circ$, $\psi = 30^\circ$, $\omega = 40^\circ$/sec and $\beta = 3$). In each subfigure, the upper plot shows the robot’s displacement and the lower plot the corresponding velocity profile, over a time span of several sculling periods (where $T_s = 1.25$sec). The red horizontal line in the lower plot indicates the average steady-state velocity $V_b$.

Fig. 12: Average swimming velocity $V_b$, shown as a function of the recovery stroke velocity $\omega$, of the two-arm SMA-actuated prototype, under closed-loop control, for the three different arm designs.

Fig. 13: Lower plot: Instantaneous thrust force generated by the two-arm SMA-actuated prototype, under closed-loop control, for the three different arm designs, shown over four periods of the reference sculling trajectory (shown in the upper plot).
IV. DISCUSSION AND CONCLUSIONS

This work provides evidence of the feasibility of compliant reduced-size actuation for a two-arm underwater robot swimmer, and other analogous soft robots, based on pairs of antagonistic SMA springs in each joint. Moreover, it highlights the importance of closed-loop control schemes to compensate hysteretic phenomena and asymmetries, and drive the SMAs fast and accurately, and with relatively low computational cost. Propulsive speeds of up to about 0.5 arm lengths per second (≈50 mm/s) and forces up to 30 mN were demonstrated. This performance was found to come at the expense of the SMAs’ usable life span: due to the high workload demand on our trained SMAs (approximately 1.05 V/cm for each SMA), they showed aging effects as early as about 1000 cycles, as opposed to the 10000 cycles quoted by the manufacturer for a workload of 0.3 V/cm.

Fig. 14: Five-segment undulatory robot with compliant actuation elements based on SMA springs.

Future work will consider the development of fully-submerged multi-arm swimmers, both with compliant bodies, as well as with compliant actuation elements. Other bio-inspired robot morphologies, like a five-segment undulatory crawler, are also under development, using a similar actuation and control scheme (Fig. 14).

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