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### Mechanism and Control of Continuous-State Coupled Elastic Actuation

Tzu-Hao Huang · Han-Pang Huang · Jiun-Yih Kuan

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1 Abstract Focusing on the physical interaction be-2 tween people and machines within safety con-3 straints in versatile situations, this paper proposes 4 a new, efficient, coupled elastic actuation (CEA) 5 to provide future human-machine systems with 6 an intrinsically programmable stiffness capacity 7 to shape the output force corresponding to the 8 deviation between human motions and the set 9 positions of the system. As a possible CEA sys-10 tem, a prototype of a two degrees of freedom (2-11 DOF) continuous-state coupled elastic actuator 12 (CCEA) is designed to provide a compromise be-13 tween performance and safety. Using a pair of an-14 tagonistic four-bar linkages, the inherent stiffness 15 of the system can be adjusted dynamically. In 16 addition, the optimal control in a simple various 17 stiffness model is used to illustrate how to find 18 the optimal stiffness and force trajectories. Using 19 the optimal control results, the shortest distance

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J.-Y. Kuan Department of Mechanical Engineering, Massachusetts Institute of Technology, Cambridge, USA control is proposed to control the stiffness and 20 force trajectory of the CCEA. Compared to state-21 of-the-art variable stiffness actuators, the CCEA 22 system is unique in that it can achieve near-zero 23 mechanical stiffness efficiently and the shortest 24 distance control provides an easy way to control 25 various stiffness mechanisms. Finally, a CCEA 26 exoskeleton is built for elbow rehabilitation. Sim-27 ulations and experiments are conducted to show 28 the desired properties of the proposed CCEA sys-29 tem and the performance of the shortest distance 30 control. 31

Keywords Variable stiffness mechanism •	32
Variable stiffness control • Optimal control •	33
Continuous-state coupled elastic actuation	34

### **1** Introduction

35

In modern robotics, physical human-robot inter- 36 action (pHRI) is the current focus. Considering 37 the trade-off between safety and performance, 38 robots are designed to be intrinsically safe for 39 human-robot interaction [1, 2]. In particular, ro- 40 bots, which provide services during labor short- 41 ages or assist the disabled with daily activities due 42 to longevity problems, are the major focuses. 43

To achieve safe and efficient manipulation, the 44 designs should consider all mechanisms, electron- 45 ics, control, and software architectures. Although 46

47 modifying the controllers of rigid robots with ad-48 ditional sensors has demonstrated effectiveness in 49 safe manipulation [3–5], some performance lim-50 itations, however, are due to the imperfect me-51 chanical design [1, 6, 7]. In particular, passive 52 compliance mechanisms that reduce transmission 53 stiffness are regarded as one of the most promising 54 designs.

Recently, several safe and efficient robot actua-55 tion techniques have been proposed, such as series 56 elastic actuators (SEAs) [6-13], programmed im-57 pedance actuators [14, 15], and variable stiffness 58 actuators [15-22]. In all these designs, a criti-59 cal feature is the stiffness of the series elastic 60 component, which dominates the bandwidth and 61 the payload capacity of the overall system, and 62 therefore the safety level in the pHRI field. Most 63 of the works cited are designed with a constant 64 stiffness. Although these mechanisms possess in-65 trinsic safety, the control performance is sacrificed 66 because of the necessary stability for various 67 users and tasks. Distinct from designed actuators 68 with constant stiffness, the human muscular sys-69 tem possesses inherent advantages in its adaptive, 70 elastic nature, resulting in minimized work and 71 peak power [23-25], which, in the actuator as-72 pect, reduces the required weight of the actuator 73 [22, 26–28]. Therefore, variable stiffness actuation 74 75 plays an important role in the next generation of robotics. 76

77 To realize the stiffness adaptively, a popular approach is to implement two opposing actuators 78 of similar capacity in series with variable stiffness 79 elements. By utilizing two actuators, the magni-80 tude of the output is determined by the com-81 mon motion of the actuators, whereas the stiffness 82 can be changed according to differential motion 83 [17, 20, 29]. Due to the antagonistic setting, the 84 actuators are required to consistently exert torque 85 on the output link to maintain stiffness, which 86 87 results in a large waste of energy.

To design a more practical actuation that can be used adaptively in rehabilitative and assistive motions, a continuous-state coupled elastic actuator (CCEA) is introduced. The main contribution of this work is the realization of the CCEA mechanism, the formulation of the optimal control problem for general variable stiffness control, 94 and the shortest distance optimization method 95 for the CCEA or any type of variable stiffness 96 mechanism. 97

The design concept and mechanical properties of the proposed mechanism are addressed in 99 Section 2. A possible optimal stiffness and equilibrium position control in a simple various stiffness 101 mode is proposed in Section 3. The stiffness and 102 force control of the CCEA by the shortest distance control method is proposed in Section 4. 104 The mechanical property of the CCEA, the simulation results, and the experimental results are 106 derived and explained in Section 5. Simulations 107 and experiments are also addressed. Finally, the 108 conclusion follows. 109

#### 2 Design of a Continuous-State Elastic Actuator 110

The purpose of the continuous-state elastic ac- 111 tuator (CEA) is to generate the reaction force 112 profile relating the deviation of the output link 113 to the set position of the system by using a set 114 of components with different elastic properties. 115 As shown in Fig. 1, compared with typical com- 116 pliant actuators, the coupled elastic elements and 117 stiffness-adjusting mechanisms do not move with 118 the output link. Therefore, the inertia of the out- 119 put can be kept as small as possible, and the 120 operation range of the output position could theo- 121 retically be unlimited. Although the output is not 122 directly connected to the input via the coupled 123 elastic elements, it still possesses a similar effect 124 as the typical SEA, in which the output force is 125 zero, if no reaction force is provided by the elastic 126 elements. Moreover, the power input is always 127 protected, since it is virtually decoupled from the 128 output link. 129

In this paper, a new CCEA system is con- 130 structed using a pair of antagonistic four-bar link-131 ages. The CCEA, as one of the CEAs, can dy-132 namically adjust the stiffness of the system by 133 tuning the equilibrium position of the preload. 134 The detailed working principles and the design are 135 addressed in the following section. 136



# 137 2.1 CCEA Design Concept - Single Four-Bar138 Linkage

139 First, we consider a single four-bar linkage with an 140 extensional linear spring configured as in Fig. 2, 141 where the mass of the stiffness adjuster is  $M_{ac}$ , the 142 mass of the output carriage is  $M_{ca}$ , the stiffness 143 adjusting force is  $F_{ac}$ , the displacement of the 144 stiffness adjuster is  $X_{ac}$ , the displacement of the 145 output carriage is  $X_{ca}$ , and the external load force 146 is  $F_1$ . The length of the linkages,  $R_1$  and  $R_2$ , are set 147 to be R for convenience. Thus, the transmission 148 angle of the four-bar linkage  $\beta \in (0, 2\pi)$  can be 149 defined as follows:

Q2 
$$\beta = \cos^{-1}\left(\frac{X}{2R}\right),$$
 (1)



Fig. 2 Topology of the proposed continuous-state

where the displacement between the stiffness ad- 150 juster and the output mass is 151

$$X = 2R - X_{ac} + X_{ca},\tag{2}$$

and the potential energy stored in the spring of the 152 CCEA can be formulated as 153

$$P(X) = \frac{1}{2}K_t \Delta Y^2 = \frac{1}{2}K_t (Y - Y_0)^2, \qquad (3)$$

where  $Y_0(X_0) = \sqrt{4R^2 - X_0^2}$  is the non-stressed 154 length, and  $K_t$  is the stiffness constant of the linear 155 spring. Due to the deflection  $\Delta Y$  of the linear 156 spring, the restored force on the output link, which 157 is the function of the geometry, can be written as 158 follows: 159

$$F(X) = \frac{\partial P}{\partial X} = -K_t \cdot X \left( 1 - \sqrt{\frac{4R^2 - X_0^2}{4R^2 - X_2}} \right).$$
(4)

Thus, the stiffness is:

K

$$(X) = \frac{\partial^2 P}{\partial X^2} = \frac{\partial F}{\partial X}$$
  
=  $-K_t \left[ 1 - (4R^2 - X^2)^{-\frac{1}{2}} (4R^2 - X_0^2)^{\frac{1}{2}} + K_t X^2 (4R^2 - X^2)^{-\frac{3}{2}} (4R^2 - X_0^2)^{\frac{1}{2}} \right]$   
=  $-K_t \left[ 1 - (4R^2 - X^2)^{-\frac{1}{2}} (4R^2 - X_0^2)^{\frac{1}{2}} + X^2 (4R^2 - X^2)^{-\frac{3}{2}} (4R^2 - X_0^2)^{\frac{1}{2}} \right]$   
(5)



Fig. 3 Topology of the antagonistic coupled elastic actuation  $% \left( {{{\left[ {{{{\left[ {{{{}}}}}} \right]}}}} \right.}$ 

### 161 2.2 CCEA Design Concept - Antagonistic

162 Four-Bar Linkages

163 Using the model derived above, the intrinsic prop-164 erties of a pair of antagonistically identical four-

165 bar linkages with two extensional linear springs



$$X_{1} = 2R - X_{ac} + X_{ca}; \quad X_{2} = 2R - X_{ac} - X_{ca}$$
  

$$R = 12.2mm; \quad X_{0} = 14mm; \quad K_{t} = 62 (N/mm)$$
(6)

168

$$P_{CCEA}(X_{ac}, X_{ca}) = P_1(X_1) + P_2(X_2)$$
  

$$F_{CCEA}(X_{ac}, X_{ca}) = F_1(X_1) - F_2(X_2) .$$
(7)  

$$K_{CCEA}(X_{ac}, X_{ca}) = K_1(X_1) + K_2(X_2)$$

2.3 Practical CCEA Design and Working 169 Principle 170

Based on the proposed design, the resultant 171 CCEA is shown in Fig. 4. In this design, a worm 172 drives a worm gear through a pair of four-bar linkages with linear extensional springs and a set of 174 coupled parallel soft linear compression springs, 175 which initially restrain the movement of the worm 176 shaft in its axial direction; two additional motors 177







**Fig. 4** Continuous-state coupled elastic actuator. **a** The fabricated CCEA. **b** A three-dimensional view of the CCEA 178 control the output force and the stiffness of the 179 system.

Figure 5a shows how the stiffness can be ad-180 181 justed by Motor 2. The rotation of Motor 2 drives a both-end-thread screw along which two mov-182 able blocks and stiffness adjusters are conveyed 183 184 simultaneously. Then the associated transmission angles of the four bar linkages change. Figure 5b 185 shows how the force can be generated by Motor 186 1. The rotation of Motor 1 drives the worm that 187 188 drives the worm gear directly coupled with the



Fig. 5 Stiffness adjustment process and continuous-state coupled elastic actuation mechanism. **a** Motor 2 drives the stiffness adjusters that carry a pair of four-bar linkage. **b** Motor 1 drives the output shaft via a worm and gear pair. Output torque will be generated only when there is environment torque on the output link. **c** Load torque on the output shaft moves the worm, and shortens one hand side springs and lengthens the other hand side springs

Table 1 Specifications of the CCEA actuator		
Weight (include the motor)	800 g	t1.2
Length*Width*Height	$60 \times 600 \times 74 \text{ mm}^3$	t1.3
Reduction Ratio of Input	1:30	t1.4
to Output		t1.5
Reduction Ratio of a Gear	1:1	t1.6
to a Pinion		t1.7
Rated Output Torque	13 Nm	t1.8
Rated Output Speed	86 deg/sec	t1.9
Base Soft / Hard Spring	62 / 171 Nm/mm	t1.10
Stiffness		t1.11
Max. Output Link Deflection	±72°	t1.12
Stroke of the Stiffness Adjuster	12 mm	t1.13

\*The input motor used in this design is Faulhaber DC- t1.14 micromotor 2657G024CR with a 26A gearhead that has a 1:13 reduction ratio.

output linkage. Figure 5c shows the mechanism 189 of the variable stiffness actuation. When external 190 force is exerted on the output linkage, the worm 191 gear moves, and the spring compresses on one side 192 and lengthens on the other side. Finally, Table 1 193 shows the specification of the CCEA mechanism. 194

# **3 Optimal Stiffness Control in a Simple Model**195of Variable Stiffness Actuation196

To control the stiffness and the output force of 197 this two degrees of freedom (2-DOF) CCEA, 198 we adopt optimal control, which is used widely 199 in problems of mechanisms [2, 4]. Because the 200 influence on the stiffness of the two motors is cou- 201 pled, the nonlinear system is too complex for con- 202 ventional optimal control. Therefore, the CCEA 203 model is simplified as the decoupled model, in 204 which only one of the motors can control the 205 stiffness. This simple variable stiffness model is 206 modeled as an ideal variable stiffness actuation, so 207 the stiffness and the equilibrium position can be 208 controlled directly and independently. Although 209 the nominal model is different from the real 210 CCEA model, the nominal model simplifies the 211 design of the stiffness and the output force. Be- 212 cause the CCEA mechanism is mainly composed 213 of a worm and a worm gear, Motor 1 and Motor 2 214 are modeled as a non-back drivable system shown 215 in Fig. 6. The mass, damper, and force of Motor 1 216 are  $m_1$ ,  $B_1$ , and  $u_1$ . The mass, damper, and force of 217 Motor 2 are  $m_2$ ,  $B_2$ , and  $u_2$ . The displacements of 218



O4

**Fig. 6** The CCEA can be modeled as this simplified model with two motors. The mass, damper, and force of Motor 1 are  $m_1$ ,  $B_1$ , and  $u_1$ . The mass, damper, and force of Motor 2 are  $m_2$ ,  $B_2$ , and  $u_2$ . The displacements of Motor 1 and Motor 2 are  $z_1$  and  $z_2$ . The stiffness of the spring in the four-bar linkage is  $k_g$ . Motor 1 is used to actuate the output link, and Motor 2 is used to change the stiffness ( $k_1$ ) of the CCEA

219 Motor 1 and Motor 2 are  $z_1$  and  $z_2$ . The stiffness 220 of the spring in the four-bar linkage is  $k_g$ . Motor 1 221 is used to actuate the output link, and Motor 2 is 222 used to change the stiffness ( $k_1$ ) of the CCEA.

223 With suitable variable stiffness, the energy ef-224 ficiency and the dynamic range of the actuation can be improved [30]. Therefore, the requirement 225 for the size and the weight of the actuator can 226 be reduced, and the CCEA system can be more 227 compact and competent. As in the introduction, 228 the muscular system has excellent adaptive non-229 230 linearity originating from the variable stiffness mechanism of muscles that can minimize the work 231 and peak power in various tasks [23–28]. In this 232 233 paper, we adopt this idea of minimizing the work and peak power in the actuator design [28, 31]. 234 235 However, the other variable stiffness optimiza-236 tion methods consider the cost function regarding 237 the control input, kinetic energy, and potential 238 energy [32, 33]. To investigate the effect of the control input, kinetic energy, and the potential en- 239 ergy on the system, three different cost functions 240 are chosen based on the following definition of 241 optimality. 242

### **Definition of Optimality**

243

The stiffness and the equilibrium position are op- 244 timal if 245

- 1. the energy of the cost function is minimized, 246
- 2. the total deflection of Motor 1 and Motor 2 247 are the least. 248

Since Motor 1 controls the equilibrium position, 249 and Motor 2 controls the stiffness, the second 250 requirement is more than a realistic limitation, 251 which limits the stroke of Motor 1 and Motor 252 2. For instance, too soft stiffness implies a large 253 deflection of Motor 1, which cannot be achieved 254 in real use. 255

According to the definition of optimality, the 256 cost function is chosen as shown, where  $J_0$  is cho-257 sen as the  $l^2$ -norm of the control input, the dis-258 placement, the velocity, and the tracking error, 259  $J_1$  is the  $l^2$ -norm of the control input, the displace-260 ment, and the tracking error, and  $J_2$  is the  $l^2$ -norm 261 of the displacement and the tracking error. The 262 parameters are defined as follows. 263

$z_1$ : Displacement of motor 1		
$z_3$ : Displacement of motor 2		
$u_1$ : Control input of equilibrium point	264	
$Z_1$ : Control input of adjusted stiffness	204	Q5
Output Force : $y = k_1 z_1 = (k_g z_3) z_1 k_g$ is set as 1		
Tracking Force Trajectory: $r(t) = \sin(2\pi t), t = 0 \sim 1$		

The cost functions are:

$$\begin{cases} \min \mathbf{J}_{0} = \int_{0}^{T} \mathbf{z}(t)^{T} \mathbf{z}(t) + \mathbf{u}(t)^{T} \mathbf{u}(t) + 100 * (k_{g}z_{1}z_{3} - r(t))^{2} dt \\ \min \mathbf{J}_{1} = \int_{0}^{T} \mathbf{z}(t)^{T} \mathbf{R}\mathbf{z}(t) + \mathbf{u}(t)^{T} \mathbf{u}(t) + 100 * (k_{g}z_{1}z_{3} - r(t))^{2} dt \\ \min \mathbf{J}_{2} = \int_{0}^{T} \mathbf{z}(t)^{T} \mathbf{R}\mathbf{z}(t) + 100 * (k_{g}z_{1}z_{3} - r(t))^{2} dt \end{cases}$$
(8)

266  $\mathbf{z}(t) = [z_1(t) \ z_2(t) \ z_3(t) \ z_4(t)]^T; \mathbf{R} = diag([1\ 0\ 1\ 0]);$ 267  $\mathbf{u}(t) = [u_1(t) \ u_2(t)]^T$  subject to

$$\begin{cases} \dot{z}_1 = z_2 \\ \dot{z}_2 = -\frac{B_1}{m_1} z_2 + \frac{1}{m_1} u_1 \\ \dot{z}_3 = z_4 \\ \dot{z}_4 = -\frac{B_2}{m_2} z_4 + \frac{1}{m_2} u_2 \\ z_3 > 0 \end{cases}$$
(9)

268

269 Solving non-quadratic optimal control with state 270 inequality and constrained equality is not easy. To solve the optimization, control vector para-271 meterization (CVP) is considered. Control vector 272 parameterization known as the direct sequential 273 method is a direct optimization method for solving 274 275 optimal control problems. The basic idea of direct optimization methods is to discretize the control 276 problem in the time domain and states, and then 277 apply nonlinear programming (NLP) techniques 278 to the resulting finite-dimensional optimization 279 problem. This method is easy to implement, but 280 281 the computation increases as the discretization becomes finer. Although it is impossible for real-282 time optimal control, in our study, CVP is mainly 283 used to illustrate the method of adjusting the 284 stiffness and the output force of the variable 285 stiffness mechanism. Together with the shortest 286 distance algorithm proposed in Section 4, the real-287 time variable stiffness control is possible with pre-288 computed CVP. In this paper, the CVP program 289 is based on the MATLAB library, DOTcvp (Dy-290 namic Optimization Toolbox with Control Vector 291 292 Parameterization) [34]. The method breaks the 293 control input into piecewise vectors, and each piecewise vector is an approximation of the real 294 optimal control policy, such as constant, linear, or 295 polynomial approximation. With the chosen sensi- 296 tivity coefficients, which are the partial derivation 297 of state variables regarding decision variables, the 298 problem can be solved by using a general non- 299 linear programming solver. Here, we chose the 300 nonlinear optimization solver FMINCON [35] in 301 MATLAB, which uses sequential quadratic pro- 302 gramming (SQP) to find the minimum of the 303 constrained differentiable nonlinear multivariable 304 function. Owing to the curse of dimensionality, 305 the computational burden and the memory re- 306 quirement of CVP increase exponentially with the 307 size of the problem. However, for the size of our 308 problem, it can still be solved in finite time. 309

# 4 Force and Stiffness Control in CCEA with the<br/>Shortest Distance Algorithm310311

In Section 3, optimal control for the simple variable stiffness model is discussed. However, the 313 method for controlling the stiffness and force of 314 the CCEA is still not clear. The assumptions for 315 controlling the variable stiffness actuation imply 316 that one of the best ways to control the CCEA 317 is choose the shortest distance from the initial 318 position to the end position, because the shortest 319 distance during each sample period is similar to 320 minimize the velocity term of variable stiffness 321 actuation. Through the simple algorithm shown 322 in Table 2, the complex CCEA optimal problem 323 can be relaxed and approximated by the proposed 324

Table 2   The main	Set an initial value	in Point <i>P</i> (0)	(
distance control method	For	$k=0,\ldots,m-1,m$ is the number of total trajectory points.	t2.1
for force and stiffness	Step 1	From force lookup table $F_{\text{lookup table}}(X_{ac}, X_{ca})$ ,	t2.2
control in CCEA	_	search those points $P_i = (X_{ac}, X_{ca})$ satisfy that the	t2.3
		force of those points are near next force command $r(k+1)$ .	t2.4
		Find $ F_{\text{lookup table}}(P_i) - r(k+1)  < \delta, \delta = 0.01$	t2.5
	Step 2	Find the point $P^* = (X_{ac}^*, X_{ca}^*)$ which has the minimum	t2.6
		$\cot J_{sd}^* = \ P(k) - P^*\ _2$	t2.7
	Step 3	$P(k+1) = P_i^*$	t2.8
	End	·	t2.9

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shortest distance. In this method, the distance of
Motor 1 and Motor 2 from the current position
to the next position is calculated, and the value is
used as the main objective function to minimize.

The cost function for CCEA force control is the 329 shortest distance in the 2-norm space [36].  $d_1$  is 330 the distance from the current displacement to 331 the next displacement of  $X_{ac}$ .  $d_2$  is the distance 332



Fig. 8 Properties of the designed CCEA system. a Potential energy of single four-bar linkage. b Force of single four-bar linkage. c Stiffness of single four-bar linkage. d

Potential energy of antagonist four-bar linkages. **e** Force of antagonist four-bar linkages. **f** Stiffness of antagonist four-bar linkages

333 from the current deflection to the next deflection 334 of  $X_{ca}$ .

$$\mathbf{J}_{sd} = \sqrt{d_1^2 + d_2^2} \tag{10}$$

335 The parameters for CCEA force control are 336 defined as follows.

	r(k): the current force command
	r(k+1): the next force command
	P(k): the current deflection and displacement
	of motors
7	P(k + 1): the next deflection and displacement
′	of motors
	$P_i$ : those points which force are near $r(k + 1)$
	$P^*$ : the optimal point of $P_i$
	$F_{\text{lookup_table}}(X_{ac}, X_{ca})$ : The force lookup table
	$K_{\text{lookup table}}(X_{ac}, X_{ca})$ : The stiffness lookup table

The control scheme is illustrated as follows. 338 339 First, an arbitrary force trajectory is defined by 340 the user to generate the force profile. Second, optimal control is used to find the correspond-341 ing trajectories of  $X_{ac}$  and  $X_{ca}$  that minimize the 342 cost function. Once the position trajectory is gen-343 erated, two independent position proportional-344 derivative (PD) controllers are used to control 345 346 the two actuators. The control flow is shown in 347 Fig. 7, in which the force profile regarding the displacement of  $X_{ac}$  and the deflection of  $X_{ca}$  by 348 349 Eqs. 4 and 6 is stored as Fig. 8e. With the lookup 350 table, the optimal force command can be easily approximated. Those points are calculated. The 351 352 cost and the point with the minimum cost are the optimal results for the next displacement of  $X_{ac}$ 353 and deflection of  $X_{ca}$ . The major advantage of this 354 algorithm is that it computes quickly and is easily 355 356 implemented, since it does not need a complicated 357 nonlinear optimal control algorithm.

To verify the proposed method, an upperstremity exoskeleton system based on the proposed CCEA actuator is adopted, as shown in fig. 9. To satisfy individual needs of the elbow exoskeleton, a level arm with a forearm holder and an upper-arm holder is designed to move with a subject's forearm and arm. To track the position reference generated in optimal control, a simple position PD controller is used to control the deflection of  $X_{ca}$  and the displacement of  $X_{ac}$ .



Fig. 9 CCEA exoskeleton for a human elbow

The proportional gain is 120, the derivative gain 368 is 10, and the variable fed into the PID loop is 369 the encoder counts. Finally, a simple experiment is 370 conducted to demonstrate the performance of the 371 force and stiffness control of the CCEA, in which 372 the output link is fixed, the force reference com-373 mand is given, and the trajectories of the actuators 374 and the force generated by CCEA are collected to 375 illustrate the performance of the shortest distance 376 algorithm. 377

### 5 Results and Discussion

5.1 CCEA Potential Energy, Force, and Stiffness 379

The stiffness, force, and potential energy of sin- 380 gle and antagonist four-bar linkage are shown 381 in Fig. 8. The system demonstrates different me- 382 chanical properties efficiently by adjusting  $X_{ac}$ , 383 especially, near zero mechanical stiffness, which is 384 rare compared to state-of-art designs. The CCEA 385 with various mechanical properties can regulate 386 safety and performance in various tasks. Briefly, 387 the variable stiffness actuators can be achieved 388 by the nonlinear displacement mechanism with a 389 constant stiffness structure [11–17] or a nonlinear 390 stiffness structure with constant displacement [10]. 391 The CCEA is a nonlinear displacement mecha- 392 nism with a constant stiffness structure, nonlin- 393 ear displacement is achieved with four-bar link- 394 age, and adjusting the preload of the constant 395

33





396 spring can change the natural stiffness curve of the 397 CCEA. Compared to previous compliant or stiff actuators, an actuator using the proposed CCEA 398 approach not only exhibits the desired ranges of 399 intrinsic output impedance but also performs ad-400 justable force profiles corresponding to the devia-401 402 tion between human motions and the set positions 403 of the system. Moreover, the output stiffness can be controlled by using an incomparable, prompt, 404 and relatively small adjusting actuator while 405 delivering output force using coupled parallel 406 elasticity. 407

408 The result for the average stiffness with 409 different displacement of  $X_{ac}$  is shown in Fig. 10. 410 The figure reveals an interesting result: The 411 stiffness decreases as  $X_{ac}$  increases and ranges 412 from 80.703 N/mm to -21.009 N/mm. When the 413 displacement of  $X_{ac}$  is 16.327 (the angle of  $\beta$  is ap-414 proximate to 70.678 degrees), the average stiffness 415 is approximately zero. The curve is approximate 416 to Eq. 11.

$$k_1 = k_g \left( 0.0109 X_{ac}^2 - 0.4774 X_{ac} + 4.8861 \right), \ k_g = 62$$
(11)

417 By observing the potential energy of the antago-418 nistic four-bar linkage, when the value of  $X_{ac}$  is 419 larger than 16.327, the deflection of  $X_{ca}$  makes the 420 CCEA store energy. In contrast, when the value 421 of  $X_{ac}$  is smaller than 16.327, the deflection of  $X_{ca}$ 422 makes the CCEA release energy. The additional 423 property of native stiffness may have another 424 unknown useful benefit, but this paper mainly considers variable stiffness from zero to a suitable425value, such as 80 N/mm. Finally, this property426can be achieved easily through the antagonistic427mechanism.428

## 5.2 Results for Optimal Control in a Simple429Model of Variable Stiffness Actuation430

The results for the optimal stiffness and equilib- 431 rium position for variable stiffness actuation are 432 shown in Fig. 11. The aim of the cost function 433  $J_0$  is to minimize the two norms of the control 434 input, displacement, velocity, and tracking error. 435 The result for  $J_0$  shows the change rate of the 436 stiffness and velocity of the equilibrium point are 437 lower than  $J_1$  and  $J_2$ , especially for  $J_2$ . From the 438 high to low value, the average stiffness is  $J_0$ ,  $J_1$ , 439 and  $J_2$ . This implies that the average stiffness 440 increases as the frequency increases as the cost 441 function includes the control input  $(u_1 \& u_2)$ , dis- 442 placement of the equilibrium point  $(z_1)$ , velocity 443 of the equilibrium point  $(z_2)$ , stiffness  $(z_3)$ , and 444 stiffness change rate  $(z_4)$ .  $J_1$  minimizes the two 445 norms of the control input, displacement, and 446 tracking error. Because minimizing the two norms 447 of velocity is similar to minimizing kinetic energy, 448 which is part of the input energy, the result for 449  $J_1$  is similar to that for  $J_0$ . However,  $J_2$  minimizes 450 only the two norms of displacement and tracking 451 error. The result for  $J_2$  is much different from that 452 for  $J_1$  and  $J_0$ . To observe the results of three cost 453 functions, the relationship between the stiffness 454





455 and the equilibrium point can approximated as 456 follows:

$$k_g z_3 \approx |z_1|, \ z_3 > 0$$
 (12)

457

$$F = k_g z_3 z_1 \approx k_g z_3^2 \tag{13}$$

$$z_3 \approx \sqrt{F/k_g}.\tag{14}$$

The optimal results happened as the stiffness is 458 proportional to the equilibrium point. As de- 459 scribed, the result shows some properties are 460

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461 similar to human muscle. According to Farahat 462 and Herr [37], the human muscle force model is 463 modeled such that the muscle force is bilinear in 464 the equilibrium position and the muscle activation 465 level, and the stiffness is proportional to the mus-466 cle activation level. In two opposite types of movements, the muscle activation will increase. One 467 is the fixed output angle with slowly increasing 468 muscle force, and the other is rapid free motion 469 without a fixed output angle. The first condition is 470 the muscle performance in low frequency, and the 471 second is in high frequency. In the first condition, 472

### Q4 Fig. 11 (continued)



473 the stiffness increases as the force increases. In
474 the second condition, the stiffness increases as the
475 frequency increases. Those properties are similar
476 to the results for optimal variable stiffness control.
477 In addition, the relationship of stiffness, force, and
478 motion frequency is possibly generated according

to the minimum energy consumed in nature. Al- 479 though the model is only a simple CCEA model, 480 the property of system with coupled stiffness and 481 equilibrium position is similar to the system with 482 independent stiffness and equilibrium position. 483 They will have similar results in minimizing the 484





485 energy of the control input, state variables, and 486 tracking error.

487 5.3 Simulation Results for Force and Stiffness

### 488 Control in the CCEA

489 The results for the simple variable stiffness actua-490 tion are shown in Fig. 12, and the results for the 491 CCEA force and stiffness control are shown in 492 Fig. 13. The different cost functions are compared 493 in Fig. 12, which reveals the trajectory of  $J_2$  is 494 similar to the trajectory of  $J_{sd}$  and the optimal 495 method of  $J_{sd}$  is easier and faster than the optimal 496 control method of  $J_2$ .

497 The results for the force and stiffness trajec-498 tory in the CCEA are shown in Fig. 13. It re-499 veals the results for a coupled mechanism, such 500 as the CCEA, and an independent mechanism, 501 such as a simple various stiffness mechanism, are similar. The mechanisms have similar force and 502 stiffness trajectories, although they have different 503 mechanisms. 504

#### 5.4 Experimental Results for Assistive Control 505

The control result is shown in Fig. 14, and the 506 trajectories of  $X_{ac}$  and  $X_{ca}$  are shown in Fig. 15. 507 The solid line is the force command, the dashed 508 line is the measured force from the potentiometer 509 and encoder of the CCEA, and the dotted line is 510 the tracking error. The errors come mainly from 511 the output backlash of the worm and the worm 512 gear, the steady state error of the PD position con-513 trol, the torque error from the cross term of the 514 actuator position tracking error, and the trunca-515 tion error from the force lookup table. The error 516 from backlash can be induced by considering the 517 backlash in the dynamic equation. The state error 518







519 of the PD control and the torque error from the 520 cross term from the actuation position tracking error can be reduced by choosing a suitable PD 521 522 gain or applying some nonlinear control, such as a sliding mode control to minimize the position 523 error in each actuator. The truncation error can 524 525 be reduced with a more precise lookup table, but it will increase the computation time. The 526 experimental results show slight tracking errors. 527 However, these errors are relatively small. Finally, 528 the proposed system provides a gentle way to 529 accomplish various tasks, and the various stiffness 530 and force controls are achieved by the shortest 531 distance between the current point and the next 532 point. The benefits are shorter computation time 533 534 and the ease of implementing any type of various stiffness mechanism. The system does not need to 535 536 know the precise mechanical modes of the various stiffness mechanisms. 537

### **6** Conclusions

In this paper, a novel CCEA approach, a general 539 optimal control for variable stiffness control, and 540 the shortest path control for variable stiffness and 541 force controls in the CCEA have been proposed 542 to give a robot system an intrinsically program- 543 mable stiffness capacity. As a possible design of 544 the proposed actuation approach, a CCEA design 545 with adjustable characteristics according to an ap- 546 plied output force and an input force has also been 547 designed to provide a favorable solution via a 548 novel torque transmission mechanism with a pair 549 of four-bar linkages. The proposed CCEA system 550 possesses intrinsic advantages of being adjustable 551 to compromise safety with performance and pro- 552 viding flexibility for an individual user with good 553 performance. In addition, the optimal control and 554 the shortest distance control are used to choose 555



**Fig. 15** Command trajectory on force and stiffness contour

556 the optimal stiffness and force trajectories. The 557 conclusions are the shortest distance control has 558 similar results as the optimal control method and can be implemented and extended very easily 559 560 to any type of various stiffness mechanism. In the future, estimating human muscle stiffness and 561 562 using human impedance to change the stiffness for the best performance and safety should be 563 researched and addressed. Considering the re-564 peatability in the application of assistive humans 565 566 or rehabilitation, the repeatability analysis of this CCEA is also important. Future work will also 567 conduct the repeatability test in rehabilitation and 568 assistive exercise in a clinic. In summary, the pro-569 posed CCEA approach with the proposed shortest 570 distance control are good choices for providing 571 future human-machine systems with an intrinsic 572 way to deal with different requirements and to 573 574 help individuals with weak muscle ability.

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