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1 Tactile Sensing with Accelerometers in Prehensile 2 Grippers for Robots

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9 Abstract

10 Several pneumatic grippers with accelerometers attached to their fingers have been developed
11 and tested. The first gripper is able to classify the hardness of different cylinders, estimate the
12 pneumatic pressure, monitor the position and speed of the gripper fingers, and study the
13 phases of the action of grasping and the influence of the relative position between the gripper
14 and the cylinders. The other grippers manipulate and assess the firmness of eggplants and
15 mangoes. To achieve a gentle manipulation, the grippers employ fingers with several degrees
16 of freedom in different configurations and have a membrane filled with a fluid that allows
17 their hardness to be controlled by means of the jamming transition of the granular fluid inside
18 it. To assess the firmness of eggplants and mangoes and avoid the influence of the relative
19 position between product and gripper, the firmness is estimated while the products are being
20 held by the fingers. Better performance of the accelerometers is achieved when the finger
21 employs the granular fluid. The article presents methods for designing grippers capable of
22 assessing the firmness of irregular products with accelerometers. At the same time, it also
23 studies the possibilities that accelerometers, attached to different pneumatic robot gripper
24 fingers, offer as tactile sensors.

25 **Keywords:** Tactile sensing; Gripper; Grasp contact; Hardness; Pick and place; Accelerometer
26

27 **1. Introduction**

28 Human hands are capable of carefully manipulating products of different shapes at high speed
29 and classifying them according to the response of their internal tactile sensors. Human
30 manipulation is widely used for the packaging of horticulture products. The introduction of
31 industrial robotics into the primary packaging of food has a huge potential [1,2]. To meet this
32 challenge, robot grippers have to improve their capability to handle irregular products and
33 incorporate reliable and robust tactile sensors.

34 For a gripper, handling irregular products with varying shapes is a challenging task and more
35 so if the products are sensitive, like some fruits or vegetables. Different approaches have been
36 followed in an attempt to achieve the necessary dexterity. Robotic hands seek to come close
37 to the degrees of freedom of the human hand with complex mechanisms, sensors and control
38 systems. In general, they are too complex and cannot achieve the necessary speed, reliability
39 and cost to accomplish the industrial requirements [3]. Grippers with simple mechanisms and
40 controls are required. Underactuated mechanisms reduce the number of actuators without
41 reducing the degrees of freedom of gripper fingers, and increase the grasping dexterity to
42 adapt to different product shapes [4]. Underactuation can be used to develop robot hands [5]
43 even in some industrial applications [6]. The design of underactuated mechanisms requires a
44 large amount of arduous work to find the best solution [7], their behavior is nonlinear and
45 specific algorithms are necessary to estimate their contact forces [8].

46 Compliant fingers or gripper mechanisms help the gripper to grasp irregular products. A
47 distributed compliant gripper made of silicone allows adaptation to products with varying
48 shapes and surfaces [9]. In robotic hands, some developments can be found with a fully
49 compliant robot hand [10], with a concentrated compliant in the fingers of an underactuated
50 robot hand [11] or a robot hand with a compliant actuator [12]. Some authors [13] tested
51 fingers covered with a membrane with inflatable rubber pockets. If a membrane is filled with
52 granular material, the pad easily adapts to the product shapes. The control of the inside
53 pressure of an elastic membrane filled with granular materials has been used to adjust its
54 stiffness by means of the jamming transition. This property has great potential in robotics for
55 developing robot grippers [14], for example, with this technology it is possible to develop a
56 universal gripper [15]. The jamming transition can be used for the control of stiffness in the
57 fingers of parallel grippers [16, 17].

58 In robotics, a tactile sensor is “a device or system that can measure a given property of an
59 object or contact event through physical contact between the sensor and the object” [18].

60 Tactile sensors for robot grippers can be intrinsic when the sensor does not need to be in
61 direct contact, and extrinsic when the sensor does need to be in contact [19]. Since intrinsic
62 sensors are not in direct contact with the product, this can affect the quality of the signals
63 received. But intrinsic sensors can be embedded away from the risk of damage from direct
64 contact and it is not necessary to use an array of sensors, which simplifies installation and
65 control. Despite these advantages most of them are extrinsic. Conductive silicone rubber has
66 been used as an intrinsic sensor in compliant joints [20] and has been embedded in a
67 compliant gripper [21] to detect the presence of objects with different sizes and orientations.
68 This material has high hysteresis but its behavior can be predicted with an adaptive neuro-
69 fuzzy inference system [22]. Another possibility is the use of micro-electro-mechanical
70 devices with low hysteresis and quasilinear behavior as intrinsic sensors. Load cells in
71 continuum robots allow force sensing to evaluate product softness [23]. A tri-axial
72 accelerometer fitted to a probe that slides over several surfaces [24] is used as a texture
73 perception sensor. A similar solution has also been implemented in a humanoid robot [25].
74 Accelerometers, in a pneumatic gripper, can monitor the instant in which the contact occurs
75 and may be combined with a force sensor to regulate the grasping force [26]. Intrinsic sensors
76 are able to sort fruits by means of an online algorithm analyzing the current of an electric
77 motor gripper [27]. IR phototransistors and a small three-axis force [28] were used to develop
78 an embedded flexure and force sensor. Some extrinsic tactile sensors can evaluate product
79 hardness by using a piezoelectric transducer [29] in combination with a pressure sensor [30].
80 [31] have developed a flexible tactile sensor with piezoresistive rubber to classify rigid and
81 deformable objects. Between intrinsic and extrinsic sensors, product hardness has also been
82 evaluated with a quasi-static intrinsic sensor that measures sensor displacement, while the
83 internal sensor chamber is deformed under pneumatic [32] or magnetic actuation [33].
84 Piezoresistive sensors placed on the fingers allow tomatoes and peppers to be classified
85 according to their ripeness [34].

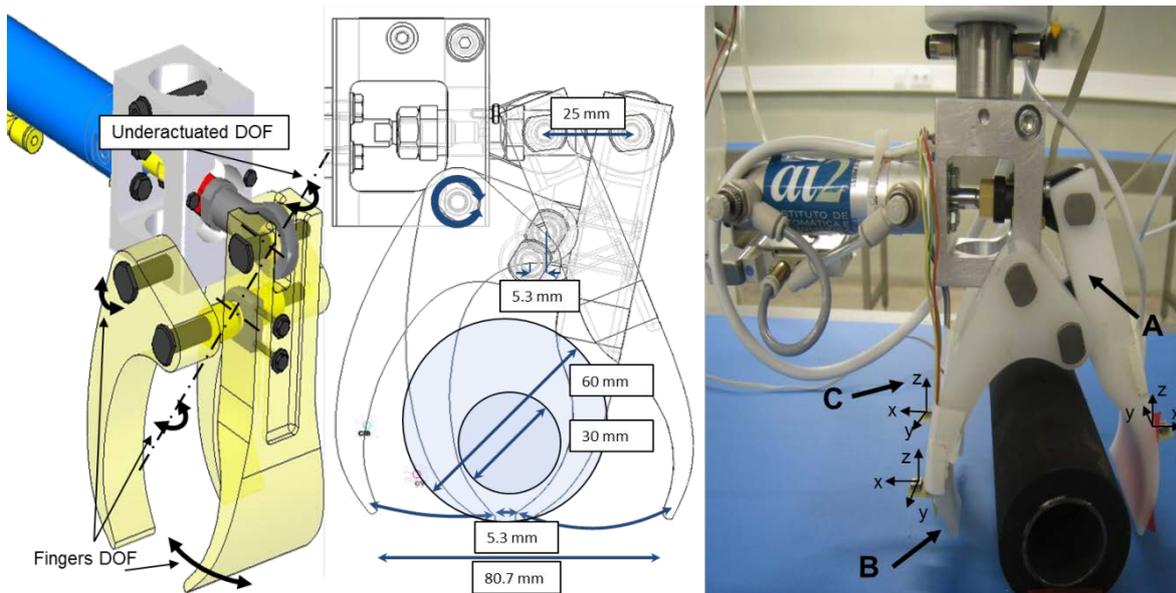
86 The purpose of this research is to study the information that accelerometers attached to the
87 fingers of grippers can provide as tactile sensors and the potential use of this technique in
88 industrial pick-and-place robot processes. The grippers use accelerometers to identify the
89 phases of the actions they perform while grasping an object and several methods are proposed
90 for measuring the hardness of the grasped products. Hardness is estimated by processing
91 deceleration time during the grasping action, by the severity of the deceleration at the first
92 product/finger contact, and by the highest deceleration peak. These methods can be
93 extrapolated to other prehensile grippers.

94 In common robotic primary packaging processes, robots pick products up from a conveyor
95 belt. Product shape and orientation are defined by computer vision, and product position is
96 coordinated with a conveyor belt tracking system. Even though there is an error in product
97 positioning, the robot gripper should be able to grasp and sense products despite these
98 inaccuracies. A specific robot gripper operation is developed taking these inaccuracies into
99 account. The gripper prototypes have been tested to estimate the firmness of eggplants and
100 mango fruits. In order to improve the gripper's capabilities for grasping products with
101 different shapes, they have fingers with underactuated motion or fingers with pads filled with
102 a granular material capable of jamming transition. All the grippers have been tested on an
103 ABB IRB 340 robot.

104

105 2. Embedded accelerometers in an angular gripper

106 Pneumatic gripper I is a prototype angular gripper designed for handling products with
107 cylindrical shapes. It was designed for robotic pick-and-place processes. The gripper's fingers
108 are made of Ultra High Molecular Weight Polyethylene (UHMWPE) plastic, and finger A is
109 underactuated because it is connected by two standard plastic ball sockets and can rotate
110 around an inclined vertical axis. The gripper actuator is a standard pneumatic aluminum
111 cylinder. An electro-valve controls the open-and-close actions of the fingers. Two adjustable
112 flow-rate valves allow manual regulation of the velocity of the gripper fingers.



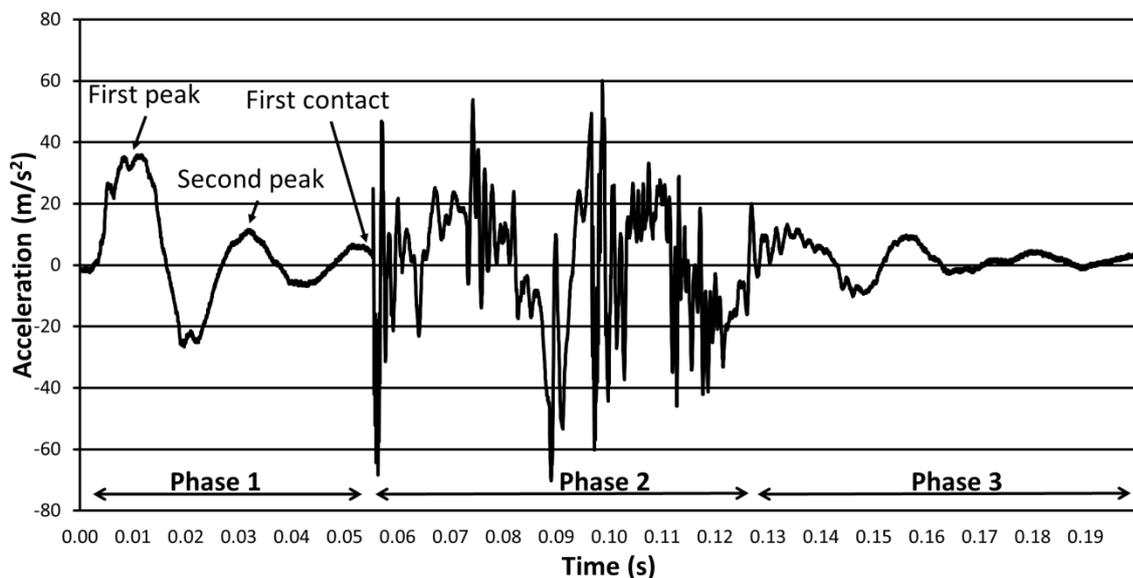
113

114 *Figure 1. From left to right: gripper I with its axis configuration and degrees of freedom*
115 *(DOF), gripper range specifications, and the location of accelerometers A, B and C.*

116 Each finger gripper has a biaxial accelerometer, X and Y, attached to its rear side (Figure 1).
117 ADXL278 accelerometers have a measurement range of +/- 50g and provide six analog
118 signals, Ax, Ay, Bx, By, Cx, and Cy. They can also measure both dynamic acceleration
119 (vibration) and static acceleration (gravity). These signals and digital electro-valve activation
120 are collected by means of an A/D data acquisition unit USB NI-6210 module that sends the
121 information to the computer. One purpose-built software application developed in LabVIEW
122 was used to record decelerations and another one processed and analyzed them.

123 **2.1. Gripper grasping phases**

124 Accelerometer signals can be used to recognize the duration of the grasping action performed
125 by the gripper. Figure 2 shows the accelerometer gripper response of finger B in direction X
126 when gripper I grasps a wooden cylinder. The same figure illustrates three different phases of
127 the decelerations, which occur in less than 0.2 seconds.



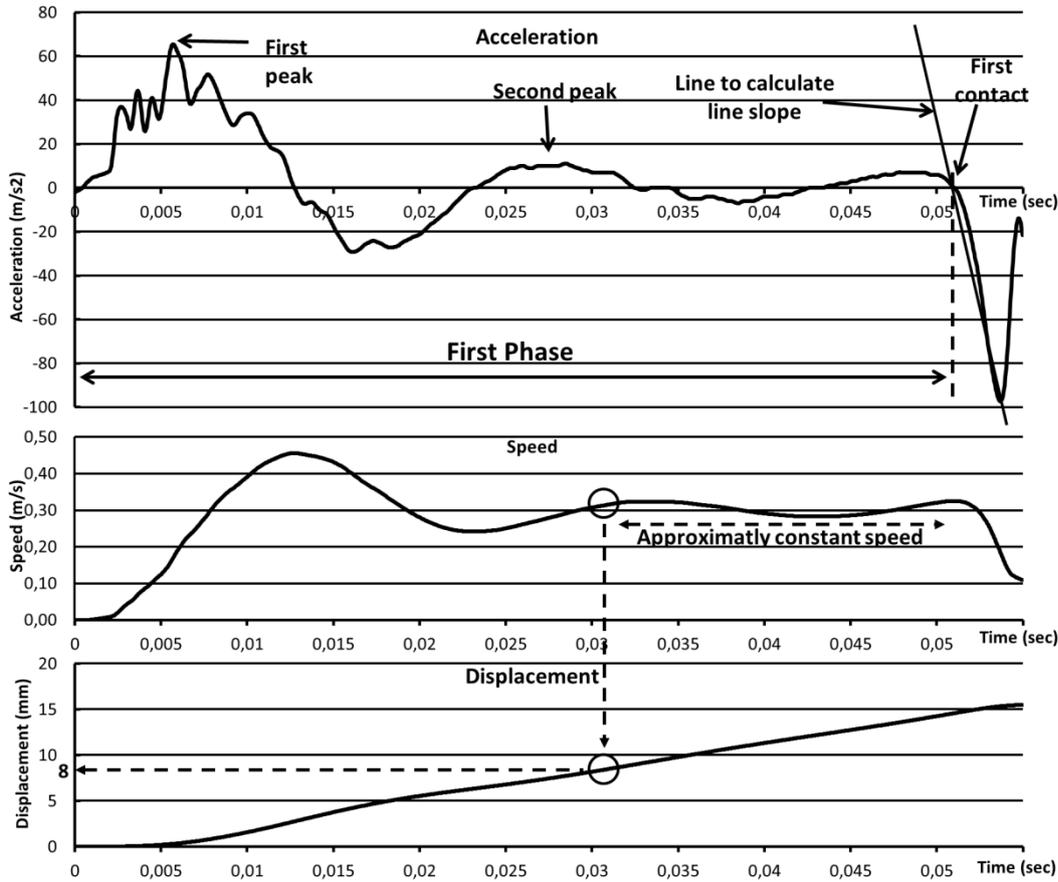
128
129 *Figure 2. Finger B deceleration in direction X when gripper I grasps a wooden cylinder.*

- 130 • Phase 1 or approximation phase. The gripper finger starts its movement and continues until
131 it establishes contact. In Figure 2 this phase is approximately a sinusoidal underdamping
132 acceleration signal. Flow meters control the speed of the pneumatic cylinder, and for this
133 reason the acceleration fluctuates until the cylinder achieves the nominal speed.
- 134 • Phase 2. All the product finger impacts are collected until the final approaching and pushing
135 motion, where there is no relative movement between product and gripper. During this phase
136 the force between product and finger is smaller than when there is no relative motion. If the
137 robot moves at high speed during this phase, the product could fall over or may be moved
138 outside the tool center point of the gripper.

139 • Phase 3. Dynamic forces until a static equilibrium is found while product and gripper finger
140 move together with an underdamping movement. The product is grasped with higher and
141 more constant forces. The robot can move the gripper and product at a higher speed than
142 during phase 2.

143 ***2.2. Gripper's finger position and force***

144 The decelerations of the first phase of grasping can be used to track the position of the gripper
145 fingers and to estimate the force of the gripper. The decelerations during the approximation
146 phase, from the moment the gripper fingers start to move until the nominal speed is reached,
147 will be more powerful if the pneumatic pressure in the actuator increases. During this phase
148 the first and second acceleration peaks (Figure 3) are higher if the pneumatic pressure
149 increases. The difference between the first and the second deceleration positive peak increases
150 when the pneumatic pressure of the actuator varies from 1.5 to 4 bars. With an analysis of
151 four samples in steps of 0.25 bars, the linear correlation between pneumatic pressure and the
152 difference in the deceleration peaks has a coefficient of determination R^2 of 0.98. The gripper
153 finger speed is adjusted through flow meters at the entrance of both pneumatic cylinder
154 chambers. For this case, the gripper fingers reach a stable and approximately constant speed
155 in 0.03 seconds (Figure 3) with a pneumatic pressure of 3 MPa; during this time the finger
156 moves 8 mm.



157
 158 *Figure 3. Analysis of the first phase of grasping. From top to bottom: gripper deceleration,*
 159 *speed and displacement for finger B while gripper I grasps a wooden cylinder.*

160 **2.3. Hardness estimation with accelerometers**

161 The experiment was performed using gripper I and grasping five cylinders with a diameter of
 162 50 mm from a fixed cradle, the process being repeated 40 times. The cylinders are covered
 163 with rubber with hardnesses of 20, 30, 40, 50 and 60 Shore A, and weights of 416, 435, 435,
 164 447 and 457 g respectively.

165 Accelerometer signals are processed to obtain different parameters, which are then used to
 166 estimate the hardness of the cylinders grasped by gripper I. These parameters are extracted
 167 according to different methods.

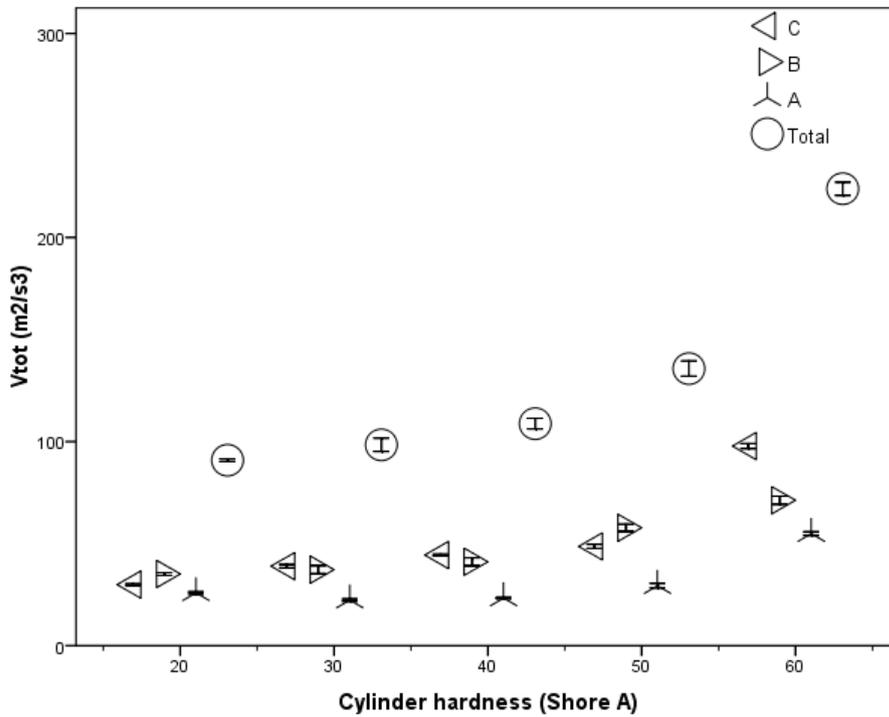
168 a) Parameters extracted from the analysis of the signal during the time in which the
 169 fingers start to be in contact with the product until the product and gripper move
 170 together (Equations 1-4).

171
$$VA = \int_{t_0}^{t_1} (Ax^2 + Ay^2) dt ; (1)$$

172
$$VB = \int_{t_0}^{t_1} (Bx^2 + By^2) dt ; (2)$$

173
$$VC = \int_{t_0}^{t_1} (Cx^2 + Cy^2)dt ; (3)$$

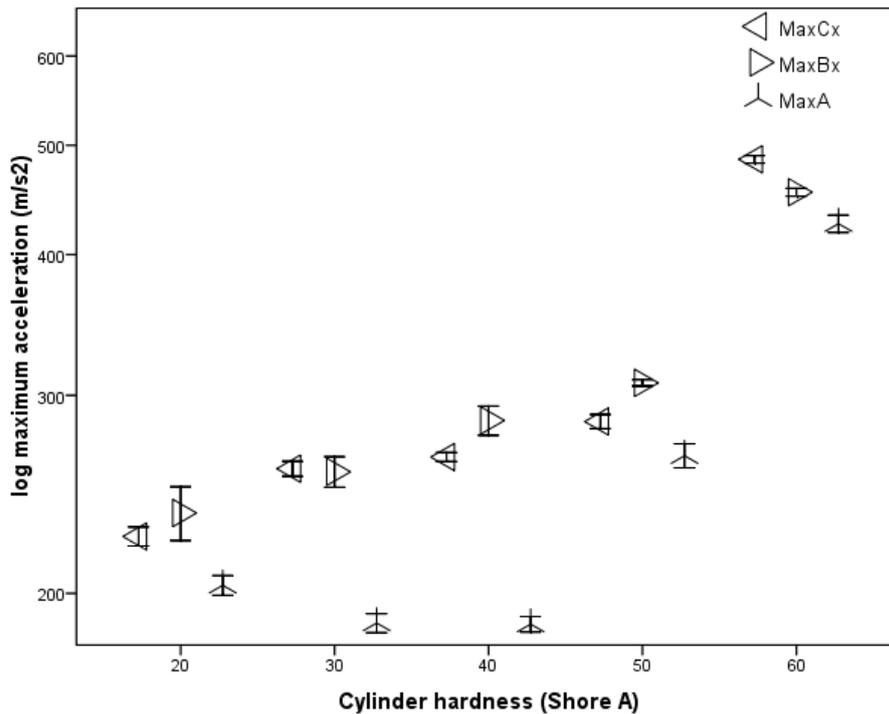
174
$$V_{tot} = VA + VB + VC ; (4)$$



175
 176 *Figure 4. The evolution of Vtot, VA, VB and VC (Equation 4) when gripper I grasps cylinders*
 177 *with different hardnesses. Error bars denote the standard deviation over 40 samples.*

178 The results in Figure 4 show an increase in Vtot, VB and VC for harder cylinders but
 179 not always for VA. If the speed of the fingers, before starting to be in contact with the
 180 cylinders, is approximately similar, then the hardness estimation with this method
 181 should be good regardless of the diameter of the cylinders grasped. With the
 182 adjustment of gripper I that was used, an approximately constant speed of the fingers
 183 is achieved if finger B moves 8 mm or more (Figure3).

184 b) The maximum decelerations achieved during the impact between finger and cylinder.



185

186 *Figure 5. Maximum deceleration after the initial finger contact against the product for*
 187 *signals Bx, Cx and A versus different cylinders with distinct hardnesses. Error bars denote the*
 188 *standard deviation over 40 samples.*

189

From the results in Figure 5, maximum deceleration signals for B and C are always bigger for harder products, while the signals for A are not always higher for harder products.

191

192

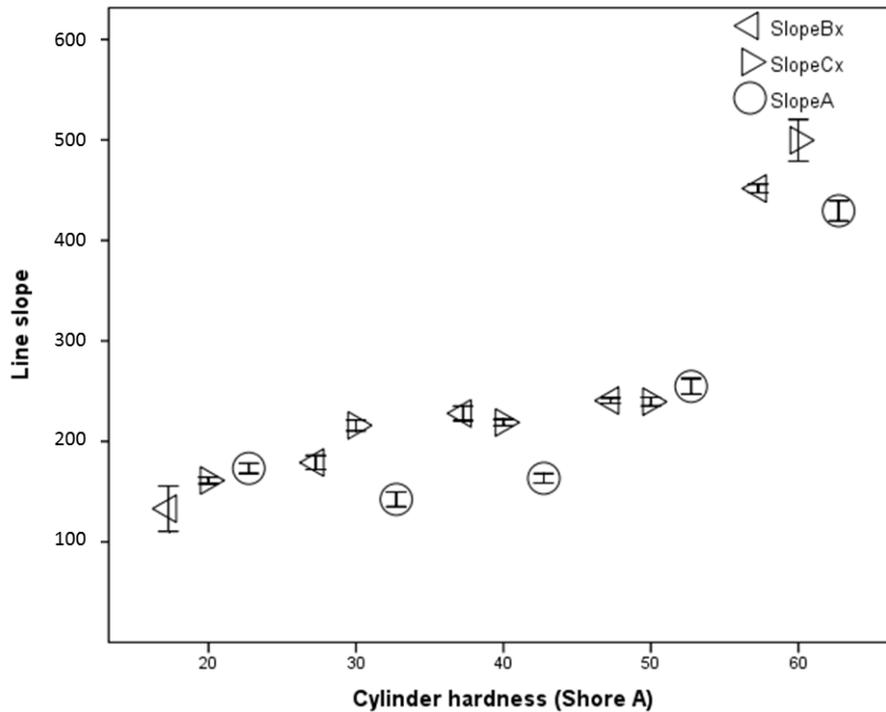
- c) If the products that are grasped are hard, then the fingers of the gripper undergo a more violent deceleration than in the case of softer products. This is the severity of the decelerations after the initial impact, and can be extracted as the line slope of the first deceleration peak produced after the first contact between the finger and the cylinder (Figure 3).

193

194

195

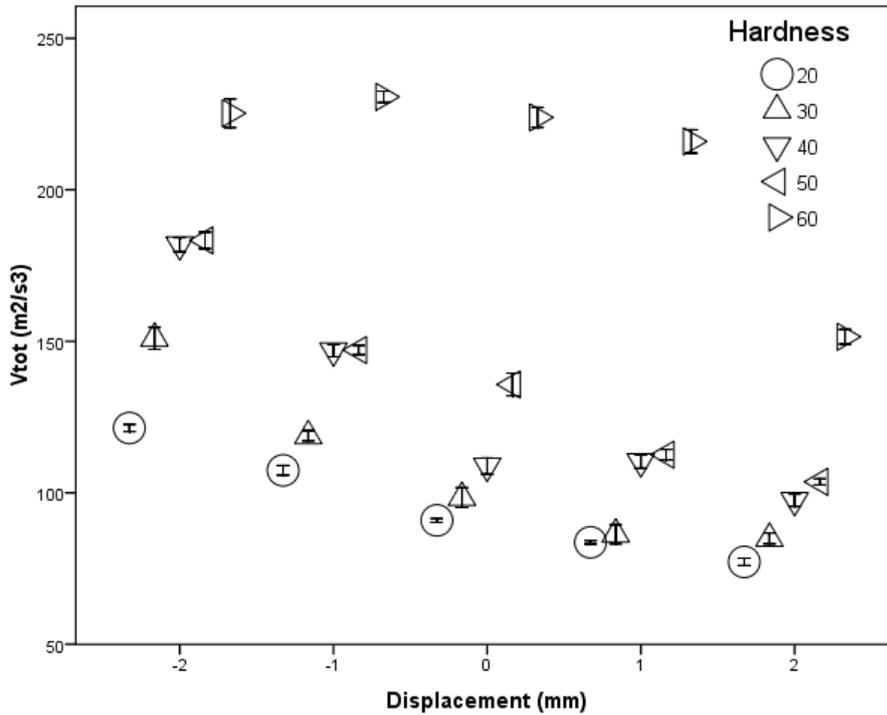
196



197

198 *Figure 6. Line slopes of the first deceleration peak for Bx, Cx and A versus different cylinders*
 199 *with distinct hardnesses. Error bars denote the standard deviation over 40 samples.*

200 In Figure 6 the line slopes for signals Bx and Cx are always capable of distinguishing between
 201 the different hardnesses, but this is not true for signal A. The results in Figures 4 to 6 were
 202 obtained when products are grasped from a fixed cradle and the relative position between
 203 gripper and cylinders is the same. The responses of these methods are different if the relative
 204 position between gripper and product varies. Figure 7 analyzes the V_{tot} parameter (Equation
 205 4) versus the variation in product hardness when the relative position between the gripper and
 206 the cylinder change in direction X (Figure 1). With a fixed position between the gripper and
 207 the cylinder it is always possible to distinguish its hardness, but the results are different if the
 208 same product is grasped in different positions. This also happens if the cylinders are rotated
 209 around the Z axis.



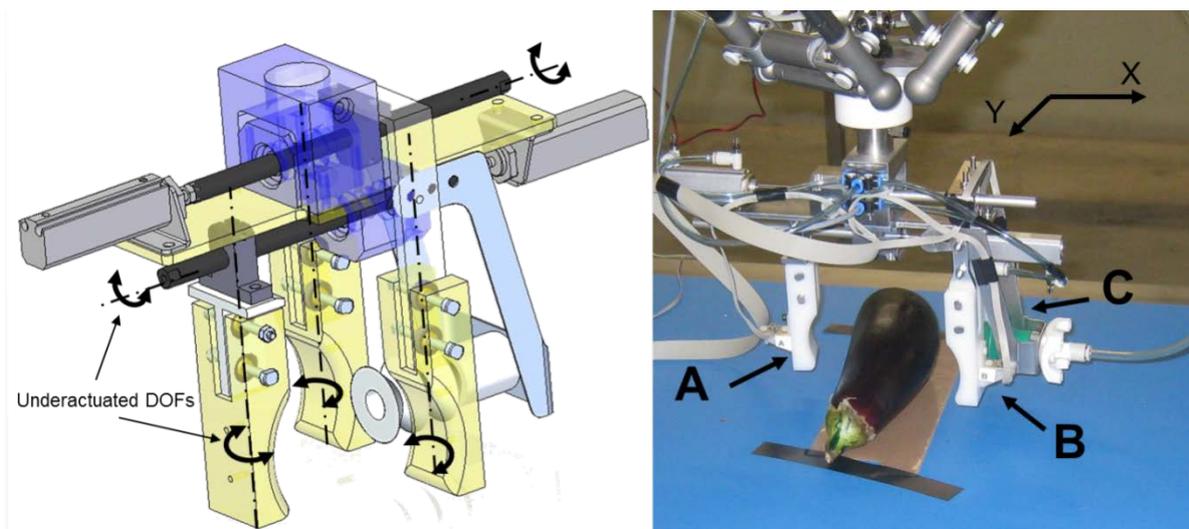
210

211 *Figure7. V_{tot} recorded by accelerometers (Equation 4) while cylinders, with different*
 212 *hardnesses, are displaced in direction X. Error bars denote the standard deviation over 40*
 213 *samples.*

214 **3. Embedded accelerometers in parallel grippers**

215 The firmness of fruits and vegetables is related to their ripeness. Firmness is evaluated in
 216 horticulture by means of destructive methods like the Magness Taylor penetrometer. The
 217 industry has an interest in and an opportunity to develop robot grippers capable of handling
 218 and sorting fruits and vegetables by their firmness, without the need for destructive tests.

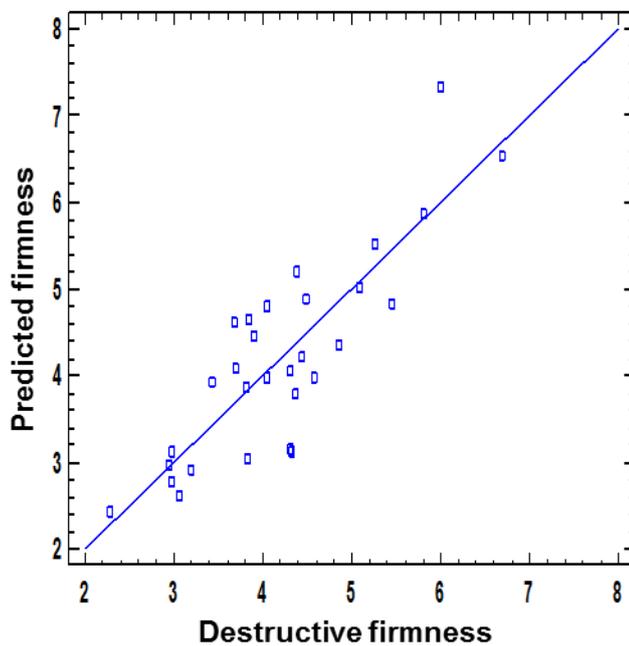
219 Estimation of the hardness by gripper I is clearly affected by the relative position of the
220 product gripper and its use is restricted to products with cylindrical shapes. Gripper II (Figure
221 8, [35]) was developed for grasping eggplants and assessing their firmness regardless of the
222 relative position between eggplant and gripper. The motion of the gripper fingers is
223 underactuated, and they can rotate around a vertical axis and also around the pneumatic
224 cylinder rod. The rotations improve the adaptation of the gripper fingers to grasp products
225 with different shapes, like eggplants. One pneumatic cylinder moves finger A and the other
226 pneumatic cylinder moves fingers B and C and a suction cup.



227
228 *Figure 8. From left to right: gripper II, its axis configuration and degrees of freedom (DOF),*
229 *location of accelerometers A, B and C.*

230 The gripper grasps eggplants located on the conveyor belt. The gripper fingers rotate around
231 their vertical axis until they are parallel to the surface of the eggplants. The robot moves the
232 gripper up with the eggplant, activates the suction cup to maintain the eggplant attached to
233 fingers B and C, and starts a loop that quickly opens and closes the gripper fingers five times.
234 The gripper analyzes the decelerations of its fingers during the open/close loop when the
235 product is not in contact with the conveyor and the surfaces of the eggplant and the fingers
236 remain parallel to each other. This process reduces the noise in the deceleration signals
237 because there are no interferences from the friction forces between the conveyor belt and the
238 eggplant. The tactile sensing response is related to the area where the fingers are in contact
239 with the eggplant and it is not influenced by the relative orientation between the gripper and
240 the eggplant. To estimate the firmness of the eggplant, more time is needed than with the
241 previous gripper. Eggplants received one impact when grasped from the conveyor belt and

242 five more to assess their firmness. Despite the number of impacts, no damage was found in
243 the eggplants.
244 With a forward stepwise multiple regression model (Figure 9) to estimate the slope of the line
245 of the deformation force in the compression test and all the parameters extracted from the
246 three accelerometers of the gripper, the model achieves an adjusted $R^2=72.45$. In this case the
247 model was developed with 30 eggplants.

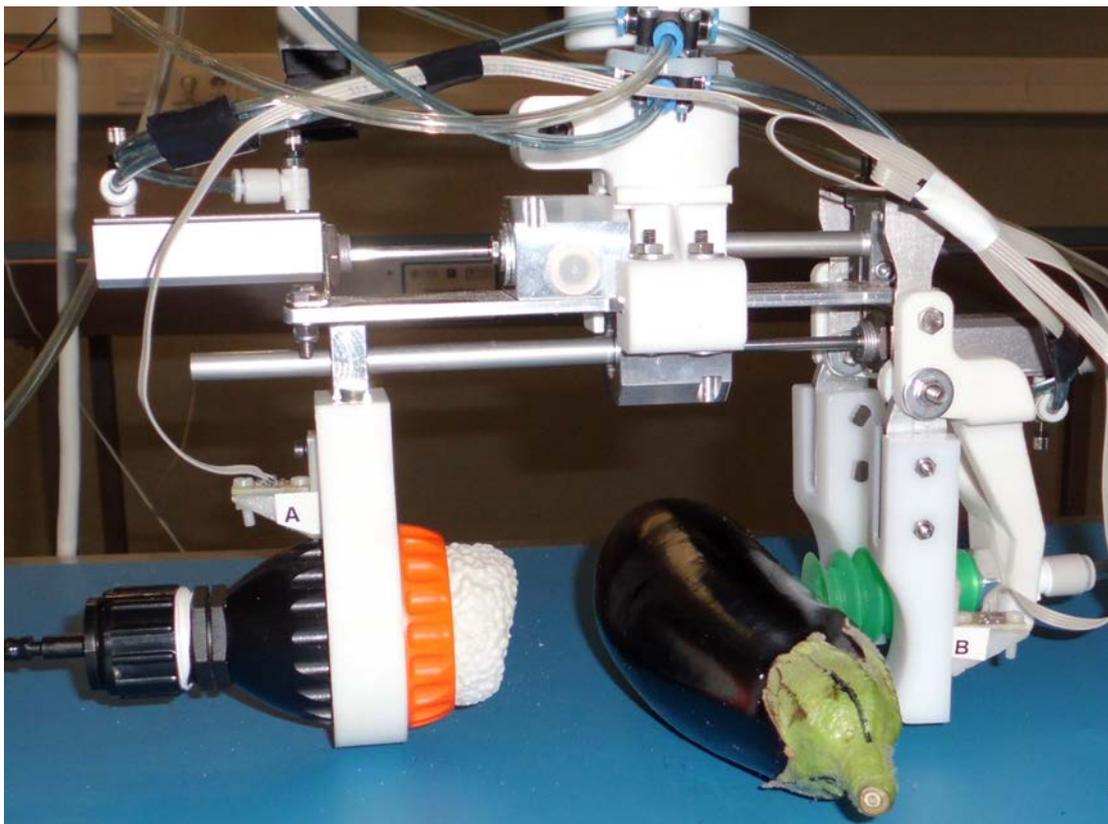


248
249 *Figure 9. Firmness predicted by a multiple regression model of all the parameters obtained*
250 *from the accelerometers of gripper II and the observed values from the destructive test of the*
251 *eggplants.*

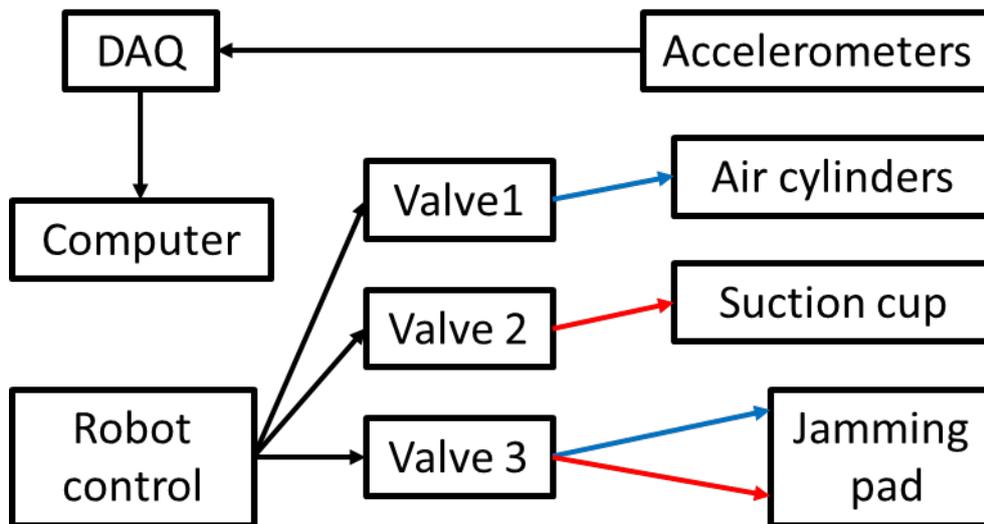
252 This gripper is capable of grasping eggplants gently and assessing their firmness if the
253 eggplants remain attached to fingers B and C by means of the suction cup. Assessment of the
254 firmness of the eggplant can be estimated several times during the cycle loop. The shapes of
255 the fingers are rigid and cannot always ensure a wide contact surface. Compared to gripper I,
256 gripper II needs more time to assess the firmness of eggplants, but the process could be
257 optimized if the eggplants were hit while the robot motion goes from pick to place.

258 **3.1. Gripper improvement using jamming-based adaptation to product**
259 **surface**

260 Gripper III (Figure 10 [17]), which was built with a new finger A that is covered with a latex
261 membrane filled with granular material, was constructed as an improvement on gripper II.
262 The jamming transition of the granular material offers the possibility of changing the surface
263 of finger A from fluid-like to solid-like. This shift is controlled by valve 3 (Figure 11), which
264 controls the pneumatic pressure from positive to vacuum. Before eggplants are grasped, a
265 positive pressure is exerted for 0.03 seconds inside the membrane of finger A, thereby
266 ensuring a soft surface. This soft state is used during the grasping action and during the first
267 impact of the open/close loop. The fluid-like state is soft enough to copy the shapes of the
268 eggplants and to ensure a gentle grasp. A solid-like state is achieved when there is a vacuum
269 inside the membrane of finger A, thus ensuring a hard parallel surface between eggplants and
270 the membrane of finger A. This state is maintained during the cycle loop for sensing the
271 firmness of eggplants.



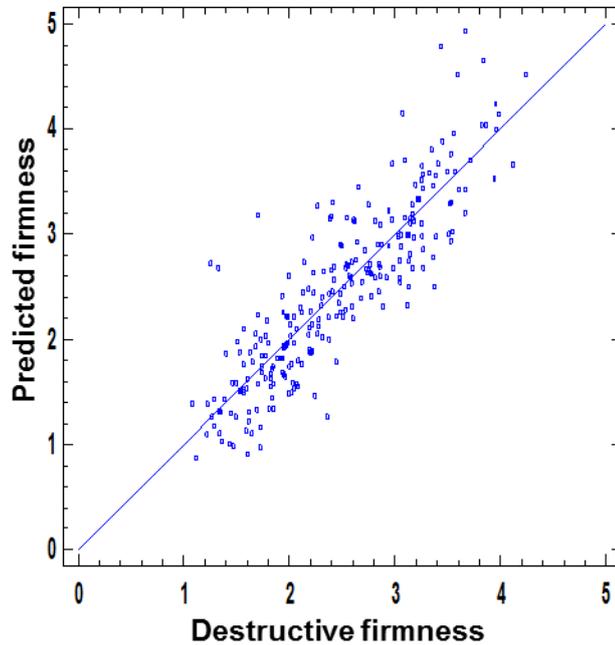
272
273 Figure 10. Gripper III with the new design of finger A.



274

275 *Figure 11. A diagram of the devices for controlling gripper III. Electrical connections are*
 276 *shown in black, positive air pressure in blue, and vacuum in red.*

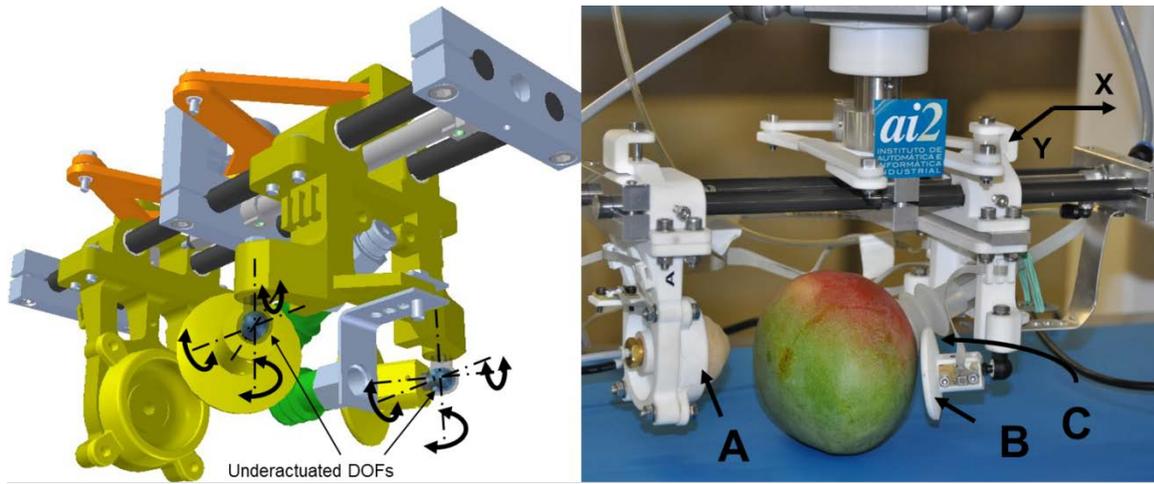
277 With gripper III it becomes possible to ensure a larger, more rigid contact area between
 278 eggplants and finger A. If the membrane of finger A adapts to the lower side of the eggplants,
 279 then the forces needed to lift the eggplants can be reduced. As happened with the previous
 280 gripper, fingers B and C adapt to the eggplant because they rotate freely around their vertical
 281 axis. With the same procedure as in the case of gripper II, gripper III can estimate the
 282 firmness of the eggplants with an $R^2=76.00$ (Figure 12). The prediction model that can be
 283 obtained with only the parameters extracted from the accelerometer on finger A is $R^2=64.50$,
 284 from finger B it is $R^2=24.07$, and from finger C it is $R^2=33.58$. In this case the model was
 285 developed with 234 eggplants.



286
 287 *Figure 12. Firmness predicted with a multiple regression model of all the parameters*
 288 *obtained from the accelerometers of gripper III and the values observed from the destructive*
 289 *testing of the eggplants.*

290 **3.2. Gripper enhancement for firmness estimation and mango fruit test**

291 Gripper III was tested with mangoes but some difficulties were encountered in the adaptation
 292 of fingers B and C because mango fruits have different shapes from eggplants ([36]). Gripper
 293 IV (Figure 13 [16]) was designed and manufactured for handling mangoes, and it estimates
 294 their firmness. The fingers of gripper III have parallel movements without any rotation around
 295 the pneumatic cylinder rod. The motion of the fingers is linked mechanically and hence the
 296 products are self-centering at the same relative gripper/product position. The configuration of
 297 gripper IV is similar to that of gripper III with three fingers. In gripper IV, fingers B and C are
 298 connected by ball joints and can rotate freely around their three rotations. The pad of finger A
 299 has the same membrane as the previous gripper.

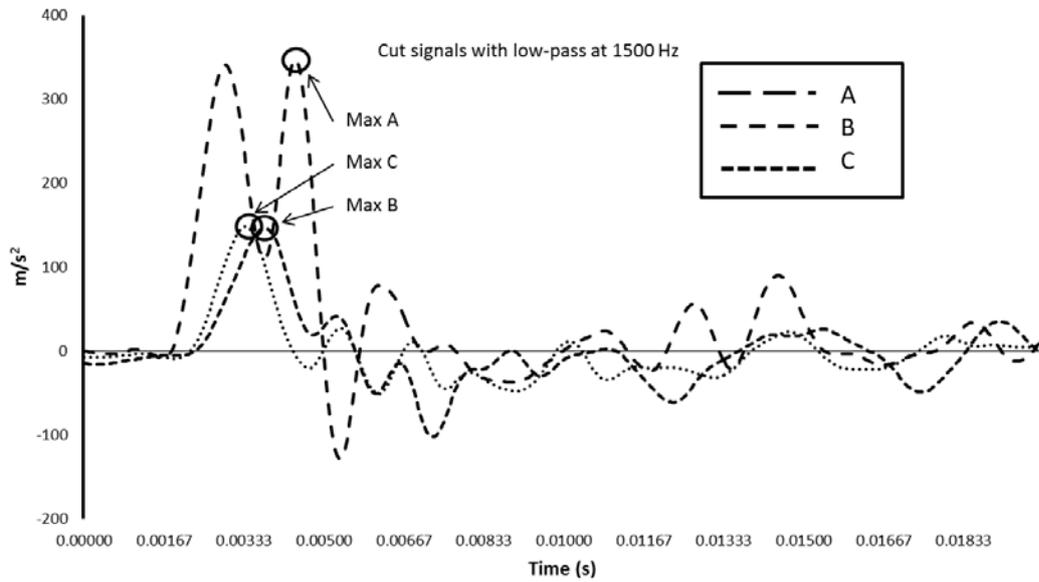


300
 301 *Figure 13. Gripper IV. On the left, the original CAD model with its linked bars mechanism*
 302 *and the underactuated degrees of freedom of the gripper fingers. On the right, the final model*
 303 *used during the experimental test.*

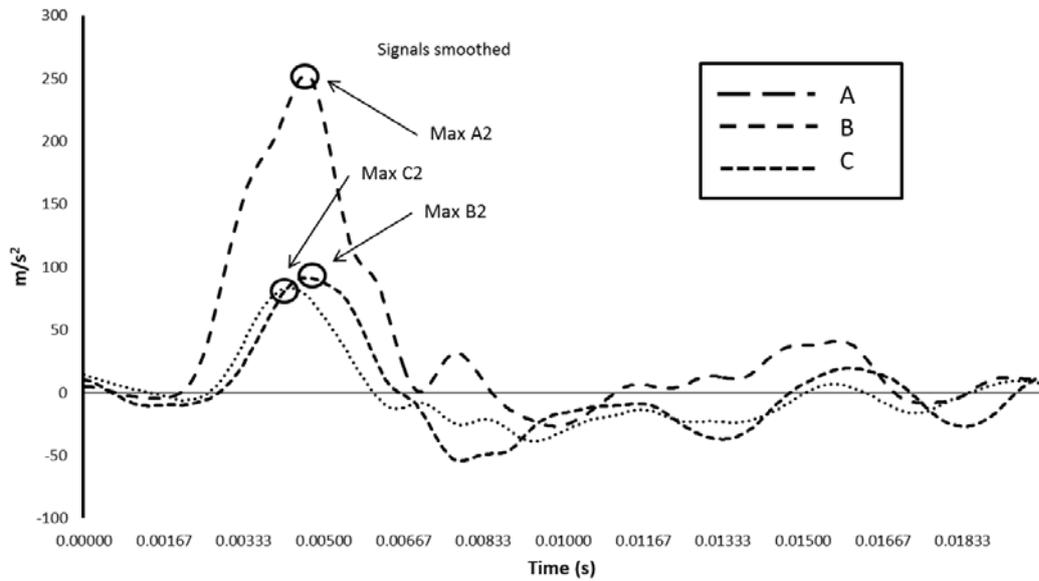
304 In the first test of gripper IV, with the original setup (Figure 13, left), all the fingers are
 305 moved by the same pneumatic cylinder. With this configuration some difficulties are
 306 encountered when it comes to handling and sensing the firmness of mangoes. The pneumatic
 307 cylinder moves finger A directly, and a mechanism of linked bars transmits the motion to
 308 fingers B and C. Due to the kinematics of this mechanism, the deceleration signals are
 309 influenced by the dynamics of the articulated bars. In this case the decelerations of the fingers
 310 have noise from the gripper mechanism, which not only collects information about the
 311 impacts between fingers and mangoes, and hence it is more difficult to distinguish when
 312 mangoes are more or less firm. In order to mitigate those noises, fingers B and C are fixed and
 313 only finger A moves (Figure 13, right). This mechanical configuration reduces the noise. In
 314 the original design, with two suction cups, sometimes one of them does not adjust to the shape
 315 of the mangoes, thus producing vacuum leakage. The best results are obtained with only one
 316 suction cup that helps to lift the mangoes a little bit while keeping them in contact with
 317 fingers B and C.

318 Figure 14 shows the deceleration of the fingers of gripper IV while the fingers hit one mango.
 319 In this example the deceleration of finger A had two peaks due to rebounds during the impact.
 320 The second deceleration peak could sometimes be higher than the first one, such as the case in
 321 Figure 14. In those cases the severity of the deceleration after the first contact varies if the
 322 position of the highest peak varies. In order to improve this situation the signals are smoothed
 323 (Figure 15) until a signal with a single peak is obtained. With the smoothed signals it was
 324 possible to achieve a single peak for estimating the slopes of the line of the first deceleration

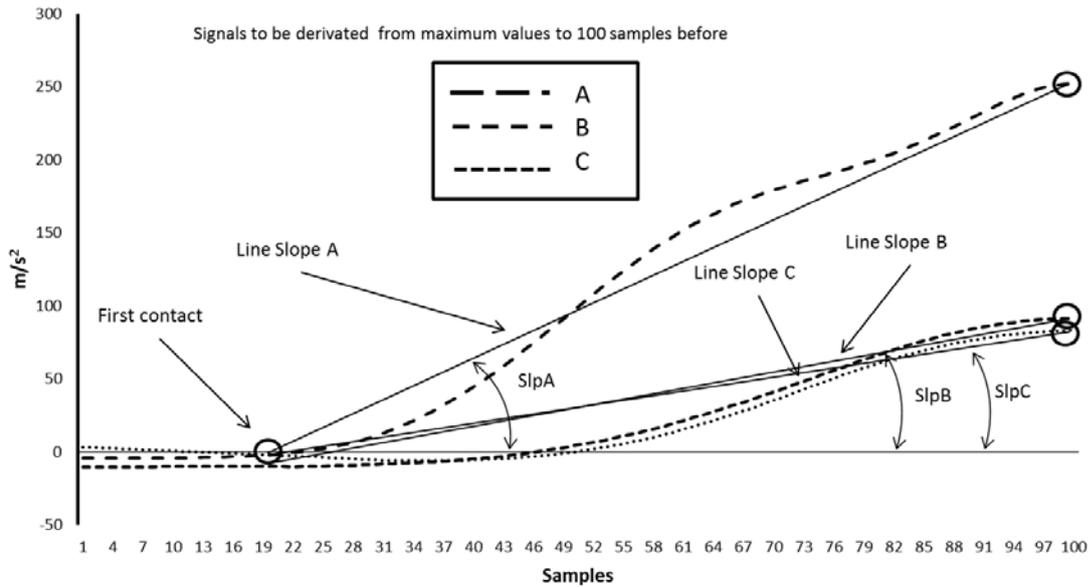
325 peak (Figure 16) as the slope of the line between the maximum value and the value 80
 326 samples earlier. Deceleration signals are sampled at 30 KHz.



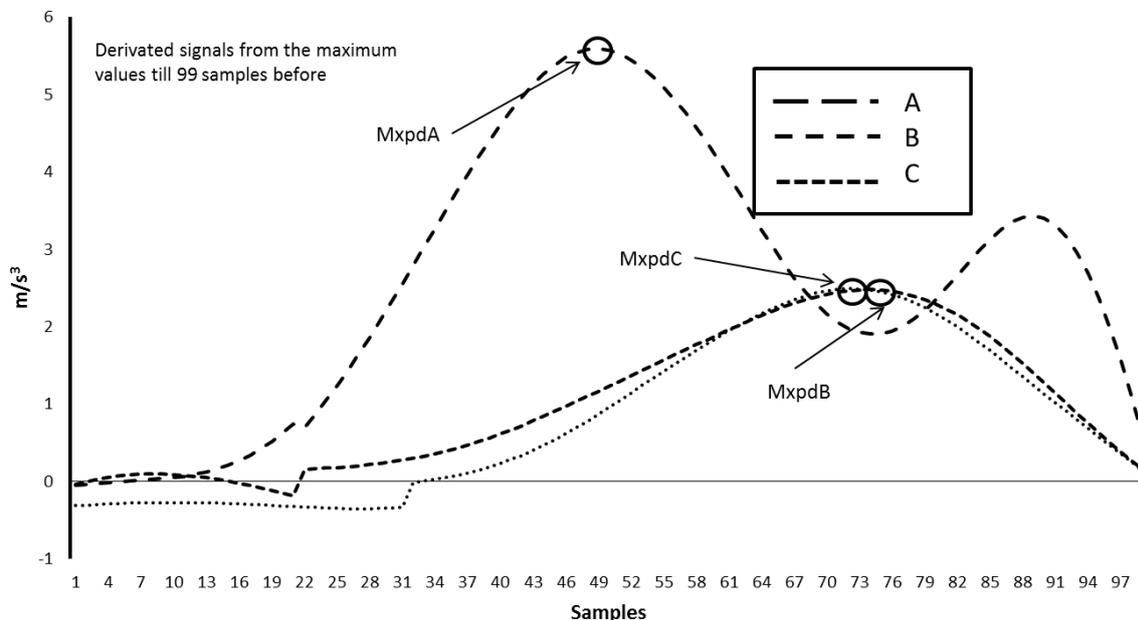
327
 328 *Figure 14. The decelerations of phase 2 of gripper IV during a mango gripping action.*



329
 330 *Figure 15. Smoothed decelerations of phase 2 of gripper IV during a mango gripping action.*

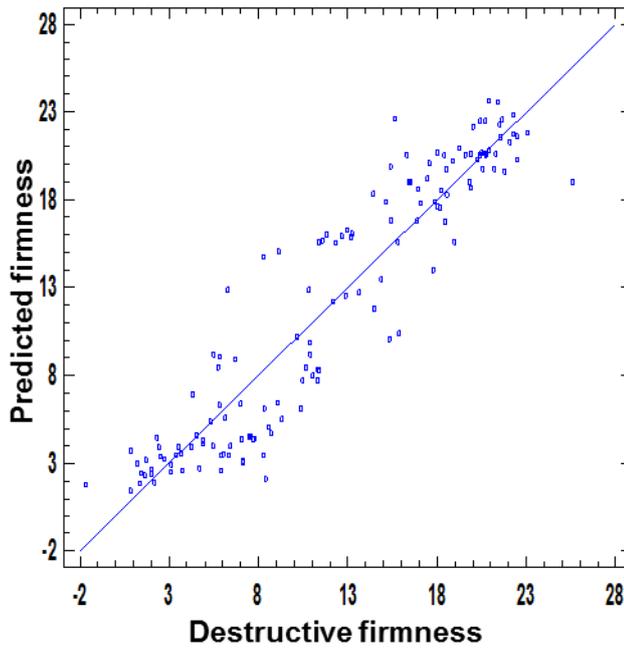


331
 332 *Figure 16. Line slopes of the decelerations of gripper IV after the first contact with a mango.*
 333 With the use of accelerometers it is difficult to define, with a robust algorithm, the exact point
 334 of the first finger/mango contact. Due to this difficulty, the algorithm could add some errors
 335 during the calculation of the line slope. The derivative function of the decelerations (Figure
 336 17) represents the fluctuations in the line slopes. In these signals it is easy to compute the
 337 maximum values of the slopes of the lines, and the area is an estimation of the average of the
 338 slopes.



339
 340 *Figure 17. The derivative function of the decelerations during the first finger/mango contact.*
 341 In this trial the width of the mangoes ranges from 73 to 92 mm and the length from 113 to
 342 141 mm. Following the same method as for the other grippers, the multiple regression model

343 achieves an adjusted $R^2=87.18$. In this case the prediction model (Figure 18) that can be
344 obtained with the use of the parameters extracted from the accelerometer of finger A is
345 $R^2=78.63$, finger B: $R^2=79.99$, and finger C: $R^2=52.23$. In this case the model was developed
346 with 140 mangoes.



347
348 *Figure 18. Firmness predicted with a multiple regression model of all the parameters*
349 *obtained from the accelerometers of gripper IV and the values observed from the destructive*
350 *test of the mangoes.*

351 The results of the firmness estimation are fairly good for fingers A and B. The concave
352 semispherical shape of those fingers adapts well to the mangoes. Even when fingers B and C
353 do not move, the results are still good.

354 **4. Results and discussion**

355 This article shows and compares the design of four grippers developed for grasping and
356 sensing the firmness or hardness of products dynamically by means of accelerometers
357 attached to their fingers. The fingers of the grippers studied have both parallel and angular

358 motion. With a parallel gripper motion it is possible to ensure the same grasp force regardless
359 of the size of the products.

360 The motion of the fingers of gripper I is angular and it is capable of grasping cylinders from
361 30 to 60 mm in diameter. The gripper can grasp conical shapes because its finger A can rotate
362 freely around its underactuated DOF, and it is capable of estimating the hardness of cylinders
363 while gripping them. With this gripper the major issue for estimating the hardness of
364 cylinders with accelerometers is the response variability when the relative position between
365 gripper and product changes. The finger decelerations are influenced by the friction forces
366 between the cylinders and conveyor belt or cradle and by the inertial effects when the product
367 is grasped in different positions. In grippers developed at a later stage, this issue is solved by a
368 new robot gripper process and the incorporation of a suction cup that keeps the product in
369 contact with the fingers. Products are grasped from the conveyor belt but estimation of the
370 firmness is carried out by hitting the products in the air while a suction cup holds the product
371 in contact with some of the gripper fingers.

372 The motion of the fingers of gripper II is parallel, each finger having one extra underactuated
373 DOF, and it was designed for grasping eggplants. The estimation of the firmness of eggplants
374 achieves an R^2 of 72.45. With this gripper the relative position between eggplants and the
375 gripper tool center point could be displaced during the robot movements. This is because the
376 product can rotate around the pneumatic cylinder rods and the motion of the fingers is not
377 mechanically linked. With the robot gripper process it is possible to estimate the firmness of
378 products several times during a pick-and-place process, each estimation of firmness taking
379 0.25 seconds to perform.

380 Gripper III is an improvement on gripper II. For example, it adapts better to eggplants because
381 finger A has jamming fluid inside it, and the tactile sensing for estimating eggplant firmness
382 is improved, $R^2=76.00$. Finger A, with its jamming transition, needs time to ensure an
383 adequate adaptation to the eggplants and to change from fluid-like to solid-like states.

384 Firmness estimation is affected by the residual shearing forces between the membrane of
385 finger A and eggplants. During the time that finger A adapts to the shapes of the eggplants,
386 the membrane deflates while it is in contact with the eggplant and some residual shearing
387 forces are maintained between the membrane and the eggplants. This affects the estimation of
388 the firmness during the first open/close cycle process.

389 The finger motion of gripper IV is parallel and it is capable of grasping and sensing the
390 firmness of mangoes. Gripper IV achieves a better estimation of firmness than grippers II and
391 III: $R^2=87.18$. The most significant differences between the two designs are: (i) gripper IV

392 uses only one actuator, which does not move the product; (ii) the mechanical design of
393 gripper IV is simpler than the others; and (iii) fingers B and C adapt better to the products
394 because they are more underactuated, with three underactuated DOFs instead of one. In
395 gripper IV, the estimation of the firmness of fingers A or B is similar, which means that finger
396 A could be simplified using the same mechanical joint as finger B without affecting the
397 results. Finger B is fixed to the gripper chassis and achieves similar results to finger A, which
398 is linked to the rod of the pneumatic cylinder. Assessment of the firmness of mangoes can be
399 performed in a gripper with a finger that is not linked to the pneumatic actuator.

400 The kinematics of grippers II, III and IV always maintain the relation of the forces between
401 the piston and the fingers constant. With the designs of grippers II, III and IV, if during the
402 open period finger A does not achieve the maximum open position then, during the close
403 period, finger A will have the same speed and this speed is regardless of the size and the
404 shape of the product.

405 The method developed to assess the firmness of eggplants and mangoes with accelerometers
406 in robot grippers requires the use of suction cups and hence is limited to products capable of
407 being handled with such cups.

408 **5. Conclusions**

409 The configuration of the degrees of freedom of the gripper fingers and their shapes is critical
410 to ensure suitable manipulation of irregular products like eggplants or mangoes. The best
411 results are obtained when the fingers increase their degrees of freedom.

412 With an adequate pneumatic gripper and accelerometers attached to its fingers it becomes
413 possible to assess the firmness of eggplants and mangoes or the hardness of the cylinders, to
414 analyze the grasping process in detail, to monitor the position of the fingers, and to estimate
415 the pneumatic pressure.

416 The tactile sensing capabilities of accelerometers are influenced by interferences and noise
417 produced during the grasping process. These interferences and noise disturb the tactile sensing
418 responses of the accelerometer. The most significant sources of noise are from the friction
419 forces that arise between the product and conveyor or cradle and the mechanical configuration
420 of the gripper. The robot gripper operation and the configuration of the mechanical gripper
421 should be designed to reduce the potential disturbances of the decelerations. Different finger
422 configurations have been tested to adapt the fingers to the surfaces of irregular products. The
423 jamming transition of a granular fluid located on the pad of the fingers, and fingers with three
424 free rotations yield the best performance for adapting the gripper fingers to irregular shapes.

425 Better performance of the inertial sensor is achieved when the gripper fingers increase their
426 adaptability to the shapes of the products grasped and better estimation of the hardness is
427 achieved when the mechanical configuration of the gripper is simpler.
428 The software for processing the signals needs to be adjusted to each gripper configuration and
429 the results exert an influence if the gripper adjustments change, because the decelerations of
430 the gripper fingers will be affected.
431 Accelerometers as tactile sensors for robot grippers have a fast time response, a low cost, and
432 are easy to integrate into industrial robot grippers by embedding accelerometers inside gripper
433 fingers. Accelerometers can be used with different gripper forces, gripper finger speeds, and
434 product properties because they are not in direct contact with the product and are therefore
435 free of the risk of suffering from wear and tear.

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