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## Evaluation of robot-assisted MRI-guided prostate biopsy: needle path analysis during clinical trials

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Disclosure of Conflicts of Interest

NH has a financial interest in Harmonus, a company developing Image Guided Therapy products. KT received grant support through the institution provided by Canon USA. NH and KT's interests were reviewed and are managed by Brigham and Women's Hospital and Partners HealthCare in accordance with their conflict of interest policies.

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**Abstract**

**Purpose:** While the interaction between a needle and the surrounding tissue is known to cause a significant targeting error in prostate biopsy leading to false-negative results, few studies have demonstrated how it impacts in the actual procedure. We performed a pilot study on robot-assisted MRI-guided prostate biopsy with an emphasis on the in-depth analysis of the needle-tissue interaction *in vivo*.

**Methods:** The data were acquired during in-bore transperineal prostate biopsies in patients using a 4 degrees-of-freedom (DoF) MRI-compatible robot. The anatomical structures in the pelvic area and the needle path were reconstructed from MR images, and quantitatively analyzed. We analyzed each structure individually and also proposed a mathematical model to investigate the influence of those structures in the targeting error using the mixed-model regression.

**Results:** The median targeting error in 188 insertions (27 patients) was 6.3mm. Both the individual anatomical structure analysis and the mixed-model analysis showed that the deviation resulted from the contact between the needle and the skin as the main source of error. On contrary, needle bending inside the tissue (expressed as needle curvature) did not vary among insertions with targeting errors above and below the average. The analysis indicated that insertions crossing the bulbospongiosus presented a targeting error lower than the average. The mixed-model analysis demonstrated that the distance between the needle guide and the patient skin, the deviation at the entry point, and the path length inside the pelvic diaphragm had a statistically significant contribution to the targeting error ( $p < 0.05$ ).

**Conclusions:** Our results indicate that the errors associated with the elastic contact between the needle and the skin were more prominent than the needle bending along the insertion. Our findings will help to improve the preoperative planning of transperineal prostate biopsies.

**Keywords**

in-bore prostate biopsy; robot-assisted biopsies; MRI-guided biopsy; needle path analysis

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**I. INTRODUCTION**

Prostate cancer (PCa) is the most common type of cancer among men in the U.S. accounting for 27,540 estimated deaths annually<sup>1</sup>. While the current standard approach to confirming prostate cancer is through transrectal ultrasound (TRUS)-guided biopsy, magnetic resonance imaging (MRI)-guided biopsy has also been investigated. MRI offers better tissue contrast and higher resolution of anatomical details than TRUS<sup>2-4</sup> allowing physicians to sample tissues specifically from suspected lesions.

Currently, there are two forms of MRI-guided prostate biopsies: magnetic resonance (MR)-fusion biopsy and in-bore biopsy. MR-fusion biopsy guides the procedure by fusing diagnostic MR images with TRUS to highlight suspected lesions on regular TRUS images. This approach is emerging because it requires little changes to the clinical workflow of the standard TRUS-guided biopsy. However, automatic registration of MR and TRUS images remains a major technical challenge<sup>5,6</sup>. The in-bore MRI-guided biopsy has been practiced at several institutions since early 2000. In-bore MRI-guided biopsy has several advantages over MR-fusion biopsies; its diagnostic performance is not limited by the accuracy of image registration; intraprocedural MR images can visualize the biopsy needles and the lesions allowing direct correlation of radiological and pathological findings.

MRI-guided biopsy is performed either transrectally<sup>7,8</sup>, transperineally<sup>9–11</sup>, or transgluteally<sup>12</sup>. The transrectal approach is most commonly used thanks to its similarity to the standard TRUS-guided biopsy. On the other hand, the transperineal approach presents advantages such as better access to anterior and apical prostate regions and lower risk of sepsis over the transrectal approach<sup>9,13,14</sup>. The approach can also be applicable to post-colectomy patients, who are not eligible for either standard TRUS biopsy or MR-guided transrectal biopsy.

In the last decade, several robotic systems have been presented to assist the physician during MRI-guided in-bore prostate biopsies<sup>5,15–21</sup>. Both transrectal and transperineal approaches have been used for robot-assisted prostate biopsy. The transperineal approach typically requires longer needle insertion length than the transrectal approach, and is more vulnerable to targeting error due to the tissue-needle interaction even if the needle is guided by a robotic needle-guide device. While the effect of needle-tissue interaction has been extensively studied in mathematical models and phantoms<sup>22–26</sup>, it has not been extensively studied in clinical cases. Such knowledge is extremely critical, given the discrepancy in targeting accuracies between phantom studies<sup>27</sup> and clinical studies.<sup>28</sup>

The goal of this study is to identify the factors that influence the accuracy of needle placement *in vivo*. To achieve the goal, we performed MRI-guided transperineal biopsies in 27 patients with the assistance of a 4 degrees-of-freedom (DoF) robot,<sup>29</sup> and analyzed resultant needle paths along with the surrounding anatomical structures reconstructed from MR images acquired during the procedures. We evaluated impacts of needle path curvature, anatomical structures and deviation at the skin entry point on the targeting accuracy.

## II. MATERIALS AND METHODS

### A. Clinical setup

**1. MRI-Compatible Needle Guide Robot**—The MRI-compatible robot has 4 DoF and is able to align the needle guide with the target location in the MRI bore. The robot has two trapezoidal frames actuated by four piezoelectric motors (USR60-S4N, Shinsei Corp., Tokyo, Japan). The needle guide is attached to the trapezoidal stages using ball and linear joints. The robot is equipped with limit switches, emergency kill switch, and foot pedal to enhance the safety. The foot pedal is placed in front of the bore entrance, and activates the robot motion ensuring that the robot only moves under physician's direct observation. The

robot is manufactured using nonmagnetic materials and it is labeled as MR-conditional, according to the standard F2503–05 of the American Society of Testing and Materials (ASTM).<sup>29</sup> The robot has an average translational error of 0.33mm in right-left (R-L) axis and 0.14mm in anterior-posterior (A-P) axis, while the angular accuracy about R-L and A-P axes are 0.13° and 0.01° respectively.<sup>29</sup> A fiducial frame (Z-frame)<sup>30</sup> is used to register the robot position with respect to the MRI coordinate system. Further details regarding the system architecture and robot validation can be found in our previous study.<sup>31</sup>

**2. Subjects**—The study has been approved by the Institutional Review Board (IRB) of the Brigham and Womens Hospital and is HIPPA compliant. The IRB determined that the system is classified as a *Non-significant Risk Device* based on the Code of Federal Regulations Title 21 812.2(b). A total of 27 men were enrolled (50–80yo, average 64 yo), including 13 men with prior negative TRUS biopsy and elevated PSA, 6 men on active surveillance (AS) for low-risk prostate cancer, and 3 men who were not candidates for TRUS-guided biopsy.

## B. Clinical workow

All procedures were performed in a 3-Tesla wide-bore (70cm)MRI scanner (MAGNETOM Verio, Siemens AG, Erlangen, Germany) in the Advanced Multi-modality Image Guided Operating (AMIGO) suite at Brigham and Womens Hospital following the workflow shown in FIG.1. The workflow was adapted from the regular template-based in-bore prostate biopsy<sup>28</sup>.

The robot aligned the needle guide with a target specified on an intraprocedural MR image by the physician using either planning software (3D Slicer<sup>32</sup>) or navigation software (RadVision, AcousticMed Systems, Savoy, IL, USA). Once the needle guide reached the desired position, local anesthetic was administered using a syringe inserted through the needle guide. An MRI-compatible core biopsy gun (18-gauge Fully Automatic Biopsy Gun, 150 mm or 175 mm, Invivo Corporation, Gainesville, FL) was manually inserted through the needle guide by the physician. Confirmation images were acquired using a T2-weighted multi-slice turbo spin echo (TSE) sequence to confirm the location of the needle tip. The physician visually evaluated if the target was reached. Additionally, an MRI scan covering the area between the prostate and the perineum was acquired using a volume interpolated breath-hold examination (VIBE) sequence for the detailed analysis on the needle path and placement accuracy. The imaging parameters are as listed in TABLE I.

## C. Analysis of Targeting Accuracy

The targeting accuracy was assessed based on the targeting error of each insertion. The targeting error was defined as the minimum three-dimensional (3D) distance from the reconstructed needle path (see section II D) to the target. The targeting errors were compared between regions and zones in the prostate using either a one-way or a Welch ANOVA, depending on the Levene's test.

## D. Needle Path Analysis

The goal of the analysis is to understand how the surrounding anatomical structures impact the targeting accuracy. The 3D needle paths were reconstructed by segmenting the artifacts of the needle on the validation images using the Needle Finder plug-in for 3D Slicer<sup>33</sup>, which automatically traces the needle artifacts from a single seed location manually specified at the needle tip. Additionally, the anatomical structures in the pelvic region were segmented on the planning image using the 3D Slicer software (FIG. 2). For each subject, the following structures were segmented: (1) prostate; (2) pelvic diaphragm; (3) bulbospongiosus; (4) bulb of the penis / corpus spongiosus; (5) ischiocavernosus; (6) crus of the penis / corpus cavernosum; (7) transverse perineal; (8) obturator internus and (9) rectum.

Misalignments between the the anatomical structures segmented on the planning image and the needle trajectories reconstructed from the validation images were corrected using an intensity-based rigid image registration algorithm available in 3D Slicer<sup>34</sup>. The registration result was visually confirmed, and manually adjusted when necessary. In our study, the average absolute translation required to register the planning (where the structures were segmented) and the validation images (where the needle path was reconstructed) was (0.8mm, 1.7mm, 5.7mm) in the RAS coordinate system.

The radius of curvature, total insertion depth, needle length inside each structure and insertion angles into each structure were calculated. Additionally, the deviation of the needle path at the entry point was also calculated. The deviation was considered as the two-dimensional (2D) Euclidean distance between the resultant needle path and the desired path on the MRI slice crossing the perineum as depicted in FIG. 3. The following analyses were performed using the segmented anatomical structures and needle trajectories.

**1. Insertion depth vs targeting error**—The relationship between the insertion depth and the targeting error was assessed by dividing the paths into two groups: (1) “large-error” group and (2) “small-error” group using the mean targeting error as the threshold. The means and the standard deviations were calculated for each group. The statistical difference between the groups was evaluated using the t-test after checking the equality of variances of the groups using the Levene’s test.

**2. Needle path curvature**—Needle bending has been known to be one of the major causes for targeting errors in prostate biopsies<sup>35</sup>. It occurs as a result of the interaction between the bevel tip and the tissue<sup>36</sup>, observed as a curved needle path. Therefore, the magnitude of needle bending can be quantified by the needle’s radius of curvature. In order to verify the influence of the needle bending on the targeting error, we compare the radius of curvature of the needle paths between the “small-error” and “large-error” groups. A Mann-Whitney U test was used to check if the needle curvatures of the two groups are statistically different.

**3. Impact of individual anatomical structures**—The impact of each anatomical structure was assessed by comparing the targeting errors between “intersecting” and “non-intersecting” groups, where the groups were divided based on whether the needle path

intersects the given structure. Since the data were not normally distributed, the differences between the groups were tested using the Mann-Whitney U test.

**4. Deviation at the entry point**—The needle path can be deviated at the skin entry point due to the interaction between the needle tip and the patient’s skin. The thrust of the needle against the skin during punctuation deforms the skin and the underlying tissue layers. The deformation, in return, causes reaction forces against the needle due to the elasticities of the skin and the tissue, and may result in bending of the needle (FIG. 3).

In order to verify the impact of the deviation at the entry point, the deviations were compared between the “small-error” and “large-error” groups. The deviation of the entry point is calculated as the 2D distance between the needle and the intended path on the RA plane at the perineum (FIG. 3). The differences between the groups were tested using the non-parametric Mann-Whitney U test.

**5. Statistical analysis using mixed-model regression**—Additionally, we performed a regression analysis using a mixed model to evaluate the influence of individual structures to the targeting error. Our assumption is that the influence of a given structure to the targeting error also depends on the path length inside the structure. Therefore, the targeting error  $e_{tg}$  can be modeled as:

$$\hat{e}_{tg} = b_0 L_{dev} + b_1 L_{guide} + \sum_{i=0}^5 (a_i L_i) + c_{patient} \quad (1)$$

where,  $a_i$ ,  $b_i$  and  $c_{patient}$  are the estimated parameters,  $L_1$ ,  $L_2$ ,  $L_3$ ,  $L_4$  and  $L_5$  are the needle length inside the prostate, pelvic diaphragm, bulbospongiosus, bulb of the penis and ischiocavernosus, respectively.  $L_0$  and  $L_{dev}$  are the insertion depth into tissue that was not segmented (e.g. fat tissue) and the deviation at the entry point, respectively. The model also includes the distance between the needle guide and the patient skin ( $L_{guide}$ ). The patient constant ( $c_{patient}$ ) was considered the random effect, while the insertion depths and deviation at entry point were defined as the fixed effects. The p-values and the mean squared estimation error were used to evaluate the influence of each parameter. In this analysis, insertions with targeting error above 20mm were considered outliers and excluded. The structures that are involved in at least 10% of the insertions were included in the modeling analysis (see TABLE III).

### III. RESULTS

The robot was successfully used in 27 patients (FIG. 4). In two patients, the targets were outside the range and manually targeted. Besides the 27 cases, another two patients underwent non-targeted systematic biopsy and were not included in the study.

#### A. Targeting Accuracy

The mean targeting error was 7.4mm (4.6mm) [mean (SD)] with median value of 6.3mm and range of [0.2mm, 30.3mm]. TABLE II presents the targeting error for each prostate region and zone. While the one-way ANOVA showed no significant difference between the

prostate regions ( $F_{2,184} = 6.203$ ,  $p = 0.214$ ), the Bonferroni post-hoc analysis revealed that the targeting error at the apex region was statistically lower than the error at the base and mid-gland ( $p = 0.019$  and  $p = 0.002$ , respectively). In contrast, the one-way ANOVA showed a significant difference between the prostate zones ( $F_{2,184} = 4.845$ ,  $p = 0.009$ ).

## B. Needle Path Analysis

1. **Insertion depth vs targeting error**—The t-test showed that the insertion depths were significantly different between the “large-error” group and the “small-error” group ( $t_{(184)} = -2.521$  and  $p = 0.013$ ). The average insertion depths were 76mm (14mm) [mean (SD)] and 82mm (13mm) for the “small-error” and “large-error” groups, respectively.
2. **Needle curvature**—The mean radius of curvature considering all insertions was 1447mm (1356mm), which represents a mean curvature of  $6.9 \times 10^{-4} \text{mm}^{-1}$ . The radius of curvatures for “small-error” and “large-error” groups were 1450mm (1415mm) and 1443mm (1286mm), respectively. There was no significant difference between the two groups ( $U = 4010$  and  $p = 0.48392$ ). The result indicates that, in our case, the needle bending inside the tissue was not a determinant factor for the targeting error.
3. **Impact of individual anatomical structures**—The involvement of each anatomical structure in the insertions is summarized in TABLE III. The bulbospongiosus and the bulb of the penis presented significant difference in targeting error between the “intersecting” and “non-intersecting” groups (both  $p < 0:001$ ), while the pelvic diaphragm, ischiocavernosus, crus of the penis and transverse perineal did not present significant difference ( $p > 0:05$ ). The analysis was not performed for the prostate since the targets were all inside the prostate.
4. **Deviation at the entry point**—The mean needle deviation at the entry point among the insertions with targeting error below the average was 2.2mm (1.4mm). On the other hand, among the insertions with targeting error above the average, the mean deviation was 3.3mm (1.7mm). The Mann-Whitney U test showed a clear statistically significant difference between the two groups ( $U = 2735$  and  $p < 0:001$ ).
5. **Statistical analysis using mixed-model regression**—The average estimation error ( $\|\hat{e}_{tg} - e_{tg}\|$ ) was 2.22mm (1.87mm). TABLE IV summarizes the estimated parameters and their p-values. The parameters  $L_0$ ,  $L_2$  and  $L_{dev}$  had p-values lower than 0.05. It is interesting to notice that the parameter related to the deviation at the entry point are greater than any other parameter, which indicates that the deviation at the entry point had the highest influence on the targeting error. In addition, the result suggests that the path length inside the pelvic diaphragm is also statistically relevant.

## IV. DISCUSSION

The proposed system demonstrated a similar accuracy (median error of 6.3mm) when compared to our previous work using the manual template-based approach (median error of 5.7mm)<sup>37</sup>. In the current study, the whole procedure was completed, on average, in 105

min. However, the procedure time can be significantly reduced by installing several components in the room permanently, simplifying adjustment mechanisms and skipping research-related steps, such as additional scans to validate the needle trajectory.

The statistical analysis showed that there was no significant difference in targeting accuracy between the prostate regions. Regarding the prostate zones, targeting error in the transitional zone was larger than in the central zone. It is worth noting that our targeting evaluation was influenced by the accuracy of the MRI-compatible robot and image registration. In our previous work, the maximum robot positioning error was reported to be 0.73mm for translational movements and 0.272° for angular movements, which can result in a targeting error of 2 to 3mm<sup>37</sup>. Furthermore, the average Z-frame registration error was reported to be 1.1mm and 1.4mm on the right-left (RL) and anterior-posterior (AP) axes, respectively.

Despite the sources of error mentioned above, the targeting accuracy is also affected by several undesirable factors, such as needle bending and target motion<sup>20,35</sup>. In our study, the in-tissue bending due to the interaction between the needle and the soft tissue was not relevant for the targeting accuracy ( $p = 0.48$ ). However, one of the consistent findings from our study is that the needle deviation during transperineal prostate biopsy was primarily influenced by the interaction between the needle and the skin, which was represented by the deviation at the entry point since the needle path outside the tissue cannot be captured by the MR images. The influence of the deviation outside the tissue was drawn based on the results presented in sections III.B (where the statistical analysis demonstrated the significance of this deviation) and III.C (where the deviation at the entry point had the highest degree of influence). It is also possible to observe in FIG. 3 the Sagittal view of a representative skin deformation due to the interaction with the needle. The elastic contact during the puncture deviated the needle from the intended path at the beginning of the needle path. On average, the needle was 2.7mm away from the intended path just after the puncture.

A possible approach to cope with this issue is to perform an incision at the perineum before the insertion. Stoianovici *et al.* made a 1cm incision to facilitate the insertion of the needle<sup>38</sup>. The incision may have reduced the needle deviation and contributed to the accuracy achieved in their study (targeting error of 2.5mm). However, performing such an incision might increase patient trauma and discomfort. Another possible solution is to limit the deformation of the skin entry point due to the needle-skin interaction. In the current implementation, the needle guide was not in contact with the patient skin in order to allow the robot to move without scratching the patient's skin, but a possible solution is to use a passive device to stabilize the patient skin and minimize tissue deformation during puncture.

Our analysis also confirms that the insertion depth has an influence on the targeting error; longer insertion depths increased the chances of having targeting errors above the average. Additionally, the trajectories crossing the bulbospongiosus seem to result in lower targeting errors ( $p < 0.001$ ). On the other hand, the path length inside the pelvic diaphragm had a statistical relevance in the mixed-model analysis, which suggests that longer paths inside the pelvic diaphragm may increase the targeting error. The results indicate that it is preferable to plan a needle path crossing the bulbospongiosus. Our results also suggest that minimizing the path length inside the pelvic diaphragm and reducing the deviation at the entry point will



reduce the final targeting errors. These observations can support a path planner algorithm to define the best needle path and its probability of success.

It is important to note that this study used static MR images acquired just after the insertion to analyze the needle path. Many authors considered that the shaft of the needle follows the tip path, especially for needle steering applications<sup>39</sup>; nonetheless, this might not be true in clinical cases, where the needle is subjected to internal tissue pressure and lateral motions. A more comprehensive trajectory analysis using real-time MR images will allow us to see the exact location of maximum needle deviation, yet tracking the needle tip and controlling the image plane position in real-time are still challenges to be addressed.

There are other limitations in this study. First, the needle paths were reconstructed from the susceptibility artifacts produced by the needle in the MR images. These artifacts are, in general, larger than the actual needle, which can lead to errors in the needle path reconstruction. Second, the number of estimated parameters in the mixed-model regression was relatively large for the given number of samples in the dataset; a larger dataset of needle insertions would improve the analysis. Furthermore, it is known that the geometry of the needle tip can also influence the results. During our study we could not observe any influence of different needle tip orientations in the targeting error, but different tip geometries will have a different interaction with anatomical structures and tissues as already observed by several studies.<sup>40,41</sup> Therefore, future work should also address the influence of different tip geometries in the accuracy of transperineal biopsies.

## V. CONCLUSION

We performed a clinical study to evaluate our needle-guide robot for MRI-guided prostate biopsy in human and presented a detailed analysis of the needle path to define the impact of different path characteristics on the targeting error using the clinical data. The evaluation indicated that the robot was able to achieve a similar accuracy when compared to our previous work. We also identified critical structures and provided a mathematical model to support the pre-operative planning.

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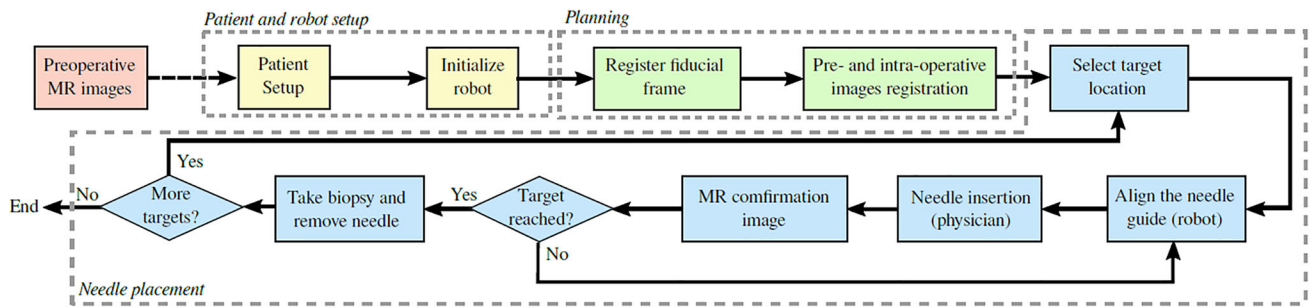
## References

1. Siegel RL, Miller KD, and Jemal A, "Cancer statistics," *CA. Cancer J. Clin.*, vol. 1, no. 65, pp. 5–29, 2015.
2. Panebianco V, Barchetti F, Sciarra A, Ciardi A, Indino EL, Papalia R, Gallucci M, Tombolini V, Gentile V, and Catalano C, "Multiparametric magnetic resonance imaging vs. standard care in men being evaluated for prostate cancer: a randomized study," *Urol. Oncol.*, vol. 33, no. 1, 2015

3. de Rooij M, Hamoen EHJ, Fütterer JJ, Barentsz JO, and Rovers MM, "Accuracy of multiparametric MRI for prostate cancer detection: A meta-analysis," *AJR Am J Roentgenol*, vol. 202, no. 2, pp. 343–351, 2014. [PubMed: 24450675]
4. Barentsz JO, Weinreb JC, Verma S, Thoeny HC, Tempany CM, Shtern F, Padhani AR, Margolis D, Macura KJ, Haider MA, Cornud F, and Choyke PL, "Synopsis of the PI-RADS v2 guidelines for multiparametric prostate magnetic resonance imaging and recommendations for use," *Eur. Radiol*, vol. 29, no. 1, pp. 41–49, 2016.
5. Stoianovici D, Kim C, Srimathveeravalli G, Sebrect P, Petrisor D, Coleman J, Solomon SB, and Hricak H, "MRI-safe robot for endorectal prostate biopsy," *IEEE/ASME Trans. Mechatron*, vol. 4, no. 19, pp. 1289–99, 2014.
6. Churukanti G and Siddiqui MM, "Prostate cancer: MRI-TRUS fusion biopsy versus 12-core systematic biopsy," *Nat. Rev. Urol*, no. 12, pp. 369–371, 2015. [PubMed: 26077997]
7. Ismail MT and Gomella LG, "Transrectal prostate biopsy," *Urol. Clin. North Am*, vol. 40, no. 4, pp. 457–472, 2013 *Office Procedures in Urology*. [PubMed: 24182969]
8. Hong CW, Amalou H, Xu S, Turkbey B, Yan P, Kruecker J, Pinto PA, Choyke PL, and Wood BJ, "Prostate biopsy for the interventional radiologist," *J. Vasc. Interv. Radiol*, vol. 25, no. 5, pp. 675–684, 2014. [PubMed: 24581731]
9. Penzkofer T, Tuncali K, Fedorov A, Song S, Tokuda J, Fennessy F, Vangel M, Kibel A, Mulkern R, Wells W, Hata N, and Tempany C, "Transperineal in-bore 3-t MR imaging-guided prostate biopsy: A prospective clinical observational study," *Radiology*, vol. 274, no. 1, pp. 170–180, 2015. [PubMed: 25222067]
10. Webb JAW, Shanmuganathan K, and McLean A, "Complications of ultrasound-guided transperineal prostate biopsy a prospective study," *Br. J. Urol*, vol. 72, no. 5, pp. 775–777, 1993. [PubMed: 8281411]
11. Gaziev G, Germani S, and Miano R, *Transperineal Prostate Biopsy*, pp. 281–288. London: Springer London, 2017.
12. Zangos S, Eichler K, Engelmann K, Ahmed M, Dettmer S, Herzog C, Pegios W, Wetter A, Lehnert T, Mack M, and Vogl T, "MR-guided transgluteal biopsies with an open low-field system in patients with clinically suspected prostate cancer: technique and preliminary results," *Eur. Radiol*, vol. 15, pp. 174–182, 1 2005. [PubMed: 15351902]
13. Pepe P and Aragona F, "Prostate biopsy: results and advantages of the transperineal approach—twenty-year experience of a single center," *World J. Urol*, vol. 32, no. 2, pp. 373–377, 2014. [PubMed: 23743734]
14. Sartor OA, Hricak H, Wheeler TM, Coleman J, Penson DF, Carroll PR, Rubin MA, and Scardino PT, "Evaluating localized prostate cancer and identifying candidates for focal therapy," *Urology*, vol. 72, no. 6, pp. S12–S24, 2008. [PubMed: 19095124]
15. Goldenberg AA, Trachtenberg J, Yi Y, Weersink R, Sussman MS, Haider M, Ma L, and Kucharczyk W, "Robot-assisted MRI-guided prostatic interventions," *Robotica*, vol. 28, no. 02, pp. 215–234, 2010.
16. Muntener M, Patriciu A, Petrisor D, Schur M, Ursu D, Song DY, and Stoianovici D, "Transperineal prostate intervention: Robot for fully automated MR imaging-system description and proof of principle in a canine model," *Radiology*, vol. 247, no. 2, pp. 543–549, 2008. [PubMed: 18430882]
17. Su H, Shang W, Cole G, Li G, Harrington K, Camilo A, Tokuda J, Tempany CM, Hata N, and Fischer GS, "Piezoelectrically actuated robotic system for MRI-guided prostate percutaneous therapy," *IEEE ASME Trans. Mechatron*, vol. 20, no. 4, pp. 1920–1932, 2015. [PubMed: 26412962]
18. van den Bosch MR, Moman MR, van Vulpen M, Battermann JJ, Duiveman E, van Schelven LJ, de Leeuw H, Lagendijk JJ, and Moerland MA, "MRI-guided robotic system for transperineal prostate interventions: proof of principle," *Phys. Med. Biol*, vol. 55, no. 5, pp. 133–140, 2010. [PubMed: 20009183]
19. Moreira P, van de Steeg G, Krabben T, Zandman J, Hekman EEG, van der Heijden F, Borra R, and Misra S, "The MIRIAM robot: A novel robotic system for MR-guided needle insertion in the prostate," *J. Med. Robot. Research*, vol. 2, no. 4, p. 1750006, 2017.

20. Schouten M, Bomers J, Yakar D, Huisman H, Rothgang E, Bosboom D, Scheenen T, Misra S, and Futterer J, "Evaluation of a robotic technique for transrectal MRI-guided prostate biopsies," *Eur. Radiol*, vol. 22, pp. 476–483, 2 2012. [PubMed: 21956697]
21. Krieger A, Song S, Cho NB, Iordachita I, Guion P, Fichtinger G, and Whitcomb LL, "Development and evaluation of an actuated MRI-compatible robotic system for MRI-guided prostate intervention," *IEEE ASME Trans. Mechatron*, vol. 18, pp. 273–284, 2 2013.
22. Xu H, Lasso A, Guion P, Krieger A, Kaushal A, Singh A, Pinto P, Coleman J, Grubb R, Lattouf J, Menard C, Whitcomb L, and Fichtinger G, "Accuracy analysis in MRI-guided robotic prostate biopsy," *Int. J. Comput. Assist. Radiol. Surg*, vol. 8, no. 6, pp. 937–944, 2013. [PubMed: 23532560]
23. Tadayyon H, Lasso A, Kaushal A, Guion P, and Fichtinger G, "Target motion tracking in MRI-guided transrectal robotic prostate biopsy," *IEEE. Trans. Biomed. Eng*, vol. 58, pp. 3135–3142, 11 2011. [PubMed: 21824841]
24. Moreira P, Peterlik I, Herink M, Duriez C, Cotin S, and Misra S, "Modelling prostate deformation: Sofa versus experiments," *Mechanical Engineering Research*, vol. 3, pp. 64–72, 12 2013.
25. Jahya A, Herink M, and Misra S, "A framework for predicting 3d prostate deformation in real time," *Int. J. Med. Robot*, vol. 9, pp. e52–e60, 12 2013. [PubMed: 23495193]
26. Behringer PA, Herz C, Penzkofer T, Tuncali K, Tempany CM, and Fedorov A, "Open-source platform for prostate motion tracking during in-bore targeted MRI-guided biopsy," *Clin Image Based Proced*, pp. 122–129, 2016. [PubMed: 27135064]
27. Song S-E, Tokuda J, Tuncali K, Tempany CM, Zhang E, and Hata N, "Development and preliminary evaluation of a motorized needle guide template for MRI-guided targeted prostate biopsy," *IEEE Trans. Biomed. Eng*, vol. 60, pp. 3019–3027, 11 2013. [PubMed: 23335658]
28. Tokuda J, Tuncali K, Iordachita I, Song S, Fedorov A, Oguro S, Lasso A, Fennessy F, Tempany C, and Hata N, "In-bore setup and software for 3T MRI-guided transperineal prostate biopsy," *Phys Med Biol*, vol. 57, no. 18, pp. 5823–5840, 2012. [PubMed: 22951350]
29. Eslami S, Shang W, Li G, Patel N, Fischer G, Tokuda J, Hata N, Tempany C, and I. Iordachita, "In-bore prostate transperineal interventions with an MRI-guided parallel manipulator: system development and preliminary evaluation," *Int. J. Med. Robot*, vol. 12, no. 2, pp. 199–213, 2016. [PubMed: 26111458]
30. Tokuda J, Song S-E, Tuncali K, Tempany C, and Hata N, "Configurable automatic detection and registration of fiducial frames for device-to-image registration in MRI-guided prostate interventions," *Med. Image Comput. Comput. Assist. Interv*, vol. 16, pp. 355–362, Jan. 2013. [PubMed: 24505781]
31. Patel NA, Li G, Shang W, Wartenberg M, Heffter T, Burdette EC, Iordachita I, Tokuda J, Hata N, Tempany CM, and Fischer GS, "System integration and preliminary clinical evaluation of a robotic system for MRI-guided transperineal prostate biopsy," *Journal of Medical Robotics Research*, vol. 0, no. 0, p. 1950001, 0.
32. Fedorov A, Beichel R, Kalpathy-Cramer J, Finet J, Fillion-Robin J, Pujol S, Bauer C, Jennings D, Fennessy F, Sonka M, Buatti J, Aylward S, Miller J, Pieper S, and Kikinis R, "3D slicer as an image computing platform for the quantitative imaging network," *Magn. Reson. Imaging*, vol. 30, pp. 1323–1341, 11 2012. [PubMed: 22770690]
33. Pernelle G, Mehrtash A, Barber L, Damato A, Wang W, Seethamraju R, Schmidt E, Cormack R, Wells W, Viswanathan A, and Kapur T, "Validation of catheter segmentation for MR-guided gynecologic cancer brachytherapy," *Med. Image Comput. Comput. Assist. Interv*, vol. 16, no. Pt 3, pp. 380–387, 2013.
34. Fedorov A, Tuncali K, Fennessy FM, Tokuda J, Hata N, Wells WM, Kikinis R, and Tempany CM, "Image registration for targeted MRI-guided transperineal prostate biopsy," *Journal of Magnetic Resonance Imaging*, vol. 36, no. 4, pp. 987–992, 2012. [PubMed: 22645031]
35. Blumenfeld P, Hata N, DiMaio S, Zou K, Haker S, Fichtinger G, and Tempany C, "Transperineal prostate biopsy under magnetic resonance image guidance: A needle placement accuracy study," *J. Magn. Reson. Imaging*, vol. 26, no. 3, pp. 688–694, 2007. [PubMed: 17729363]
36. Rossa C, Sloboda R, Usmani N, and Tavakoli M, "Estimating needle tip deflection in biological tissue from a single transverse ultrasound image: application to brachytherapy," *International*

- Journal of Computer Assisted Radiology and Surgery, vol. 11, pp. 1347–1359, 7 2016. [PubMed: 26615430]
37. Tilak G, Tuncali K, Song S, Tokuda J, Olubiyi O, Fennessy F, Fedorov A, Penzkofer T, Tempany C, and Hata N, “3T MR-guided in-bore transperineal prostate biopsy: A comparison of robotic and manual needle-guidance templates,” *J. Magn. Reson. Imaging*, vol. 42, no. 1, pp. 63–71, 2015. [PubMed: 25263213]
  38. Stoianovici D, Kim C, Petrisor D, Jun C, Lim S, Ball M, Ross A, Macura K, and Allaf M, “MR safe robot, FDA clearance, safety and feasibility of prostate biopsy clinical trial,” *IEEE ASME Trans. Mechatron*, vol. 22, pp. 115–126, 2 2017. [PubMed: 28867930]
  39. Webster III RJ, Kim JS, Cowan NJ, Chirikjian GS, and Okamura AM, “Nonholonomic modeling of needle steering,” *Int. J. Rob. Res.*, vol. 25, no. 5–6, pp. 509–525, 2006.
  40. Podder T, Clark D, Sherman J, Fuller D, Messing E, Rubens D, Strang J, Zhang Y, O’Dell W, Ng W, and Yu Y, “Modeling cutting edge geometry for plane and curved needle tips,” in *Proc. IFMBE*, vol. 11, no. 1, pp. 1727–1983, 2005.
  41. van de Berg NJ, de Jong TL, van Gerwen DJ, Dankelman J, and van den Dobbelsteen JJ, “The influence of tip shape on bending force during needle insertion,” *Sci. Rep.*, vol. 7, p. 40477, 2017. [PubMed: 28074939]



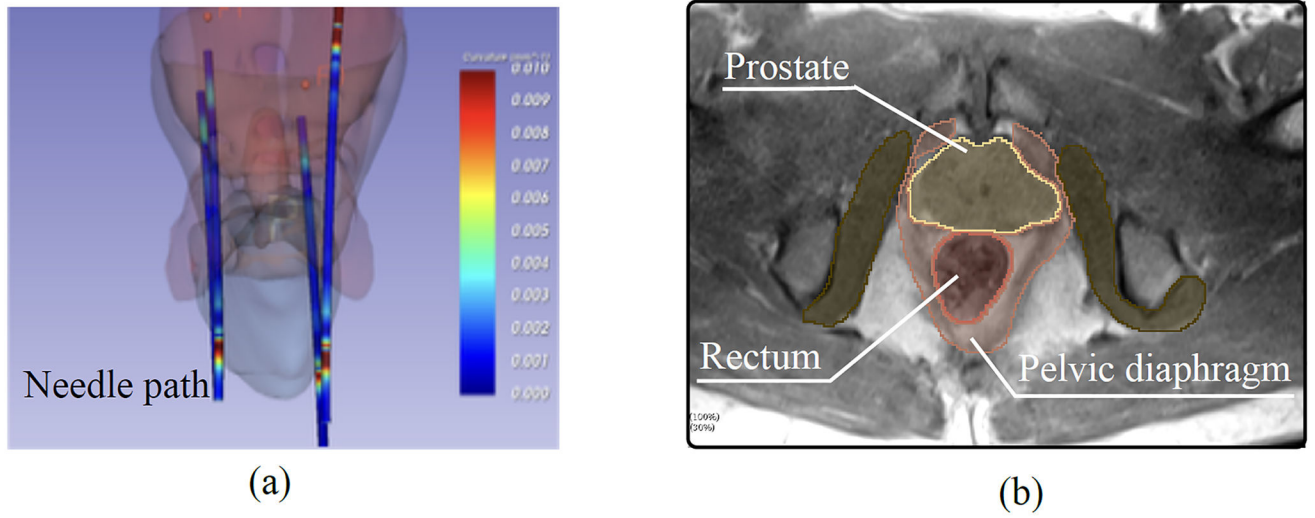
**FIG. 1:** Workflow of the proposed robot-assisted prostate biopsy. The yellow box represent the patient and robot setup, the green boxes represent the planning phase and the blue boxes are the main steps during the needle placement.

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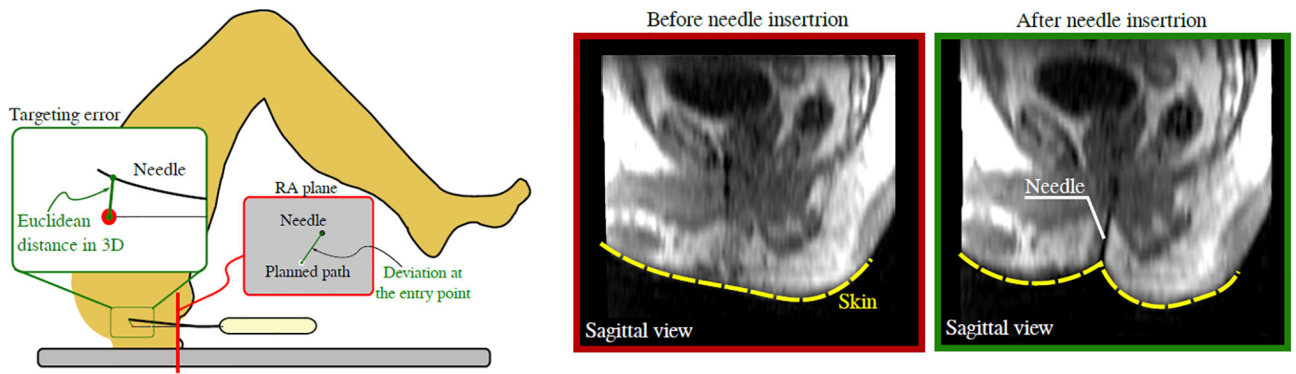
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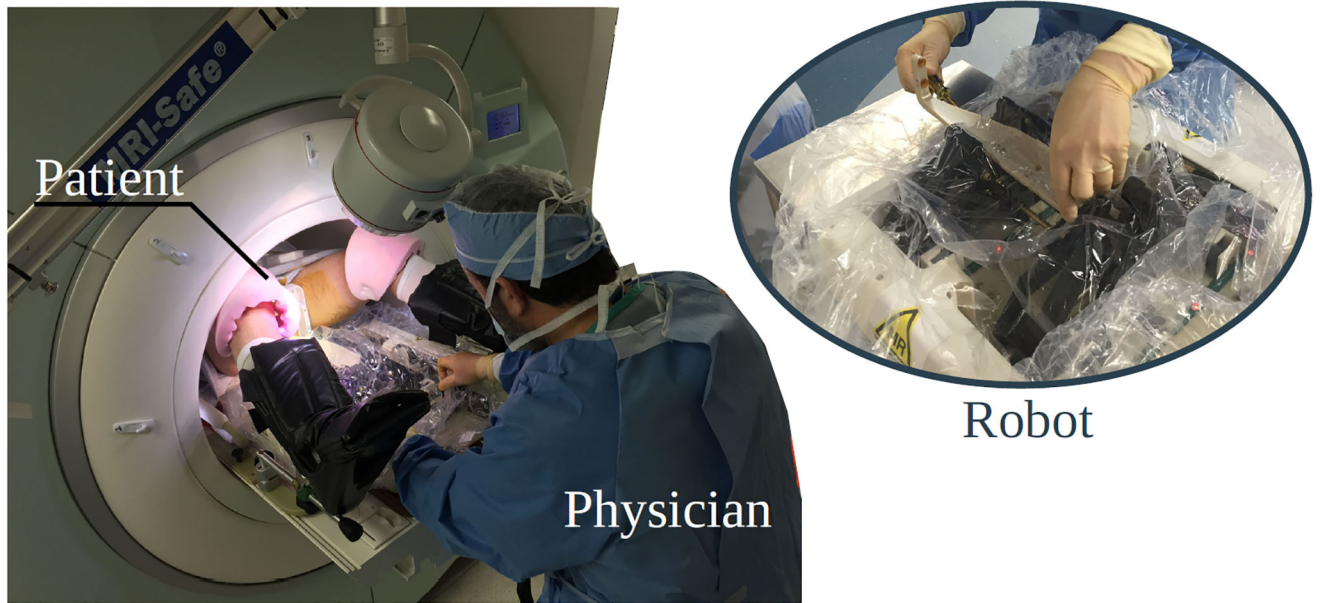
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**FIG. 2:**  
(a) Segmented needle paths in 3D Slicer of a representative patient. (b) Anatomic structures segmented using planning and validation MR images.



**FIG. 3:** Left: The deviation at the entry point is computed as the distance between the needle and the intended path on the MRI slice. The targeting error is the 3D distance between the needle tip and the center of the target. Right: Representative skin deformation during the needle insertion. The elastic contact between the needle and the skin before the puncture deviates the needle from the desired path.



**FIG. 4:** MRI-guided in-bore prostate biopsy performed with the assistance of a 4 degree-of-freedom robot. The system was tested in 27 patients.



**TABLE I:**

MR pulse sequences and parameters used during the robot-assisted prostate biopsy.

<b>Images</b>	<b>Seq.</b>	<b>TR/TE (ms)</b>	<b>Matrix</b>	<b>Slices</b>	<b>FA (°)</b>	<b>FOV (mm)</b>	<b>BW (Hz)</b>	<b>ST (mm)</b>
Z-frame	TSE	3000/111	256×256	20	120	180×180	260	2.0
Planning	TSE	4800/100	320×224	40	150	160×160	203	2.0
Confirmation	TSE	3000/106	320×205	20	120	240×192	260	3.0
Validation	VIBE	4.65/2.46	320×168	52	10	280×210	601	4.0

Seq.: Type of pulse sequence; TR: Repetition Time; TE: Echo Time; FA: Flip Angle; FOV: Field of View; BW: Bandwidth; ST: Slice thickness; TSE: Turbo Spin Echo; VIBE: Volume Interpolated Breath-hold Examination.

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**TABLE II:**

Mean targeting errors (with standard deviation) divided by prostate zone and region

	Base	Mid	Apex
Targeting error	8.3mm (5.9mm)	7.7mm (4.3mm)	5.0mm (2.8mm)
	Central	Peripheral	Transitional
Targeting error	5.9mm (3.2mm)	7.5mm (4.4mm)	9.9mm (6.4mm)

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**TABLE III:**

Number and percentage of insertions crossing the anatomical structures

Structure	Number	Percentage	Structure	Number	Percentage
Prostate	144	76%	Crus of the penis	5	2%
Pelvic Diaphragm	132	70%	Transverse perineal	14	7%
Bulbospongiosus	66	35%	Obturator internus	0	0%
Bulb of the Penis	33	17%	Rectum	12	6%
Ischiocavernosus	28	14%			

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**TABLE IV:**

Estimated fixed-effect parameters

	$b_0$	$b_1$	$a_0$	$a_1$	$a_2$	$a_3$	$a_4$	$a_5$
Parameter	0.48	0.09	0.06	0.03	0.14	0.06	0.06	-0.05
p-value	0.004*	0.011*	0.028*	0.336	<0.001*	0.136	0.377	0.520
sum of sq.	132.1	20.5	124.9	6.8	79.3	12.3	97.6	33.2

p-values represent whether to reject the hypothesis that the structure actually has an impact on the error, while the parameter and the sum of the squares represent the degree of the structure influence. ( $b_0$ -distance between the needle guide and the patient skin;  $b_1$ -Deviation at entry point;  $a_1$ -prostate;  $a_2$ -pelvic diaphragm;  $a_3$ -bulbospongiosus;  $a_4$ -Bulb of the Penis;  $a_5$ -Ischiocavernosus)

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