

1 **Optimized Preoperative Planning of Double Outlet Right Ventricle Patients by 3D**
2 **Printing and Virtual Reality: A Pilot Study**

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23

24 **Graphical abstract**

25

26 **Key question:** What is the added value of 3D-Virtual Reality (3D-VR) and 3D printed
27 models over 2D imaging techniques for the surgical planning of complex DORV patients?

28

29 **Key findings:** Spatial relationships of anatomical structures needed for surgical planning
30 were better visible in the 3D visualization methods, compared to conventional 2D imaging.

31

32 **Take home message:** The use of 3D-VR and 3D printed models can improve patient-
33 specific surgical planning of complex DORV surgeries. This resulted in better prediction of
34 the performed surgical procedure.

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36 Abstract

37 **Objectives:** In complex double outlet right ventricle (DORV) patients, the optimal surgical
38 approach may be difficult to assess based on conventional two-dimensional (2D) ultrasound
39 (US) and computed tomography (CT) imaging. The aim of this study is to assess the added
40 value of 3D printed and 3D Virtual Reality (VR) models of the heart used for surgical planning
41 in DORV patients, supplementary to the gold standard 2D imaging modalities.

42 **Methods:** Five patients with different DORV-subtypes and high-quality CT scans were
43 selected retrospectively. 3D prints and 3D-VR models were created. Twelve congenital
44 cardiac surgeons and pediatric cardiologists, from three different hospitals, were shown 2D-
45 CT first, after which they assessed the 3D print and 3D-VR models in random order. After
46 each imaging method, a questionnaire was filled in on the visibility of essential structures and
47 the surgical plan.

48 **Results:** Spatial relationships were generally better visualized using 3D methods (3D
49 printing/3D-VR) than in 2D. The feasibility of VSD patch closure could be determined best
50 using 3D-VR reconstructions (3D-VR 92%, 3D print 66%, and US/CT 46%, $P<.01$). The
51 percentage of proposed surgical plans corresponding to the performed surgical approach was
52 66% for plans based on US/CT, 78% for plans based on 3D printing, and 80% for plans based
53 on 3D-VR visualization.

54 **Conclusions:** This study shows that both 3D printing and 3D-VR have additional value for
55 cardiac surgeons and cardiologists over 2D imaging, because of better visualization of spatial
56 relationships. As a result, the proposed surgical plans based on the 3D visualizations matched
57 the actual performed surgery to a greater extent.

58

59 **Keywords:** Virtual Reality; 3D printing; surgical planning; double outlet right ventricle;
60 congenital heart disease; congenital cardiac surgery

61 **Abbreviations**

| | | |
|----|------|---|
| 62 | 2D | two dimensional |
| 63 | 3D | three dimensional |
| 64 | Ao | aorta |
| 65 | CHD | congenital heart disease |
| 66 | CT | computed tomography |
| 67 | DORV | double outlet right ventricle |
| 68 | IQR | interquartile range |
| 69 | LMM | linear mixed-effect model |
| 70 | LR | likelihood ratio |
| 71 | TGA | transposition of the great arteries |
| 72 | VSD | ventricular septum defect |
| 73 | US | ultrasound |
| 74 | USE | usefulness, satisfaction, and ease of use |
| 75 | VR | Virtual Reality |

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78 1 Introduction

79 Double outlet right ventricle (DORV) is a complex congenital heart disease (CHD), in which
80 both the pulmonary artery and the aorta originate predominantly (> 50%) or completely from
81 the morphologically right ventricle. Of all patients with CHD, DORV has an incidence of 1.0-
82 1.5%, and it is diagnosed in 1/10.000 live births (1). For surgical planning of each individual
83 DORV patient, thorough and accurate evaluation of the intracardiac anatomy and relationships
84 is required to determine whether biventricular repair or univentricular palliation is the best
85 possible approach. Eleven important anatomical structures, called *essential modifiers*, are
86 relevant for the surgical planning and clinical outcomes of DORV (2). An adequate surgical
87 plan based on this anatomical information is of utmost importance; it increases precision,
88 minimizes the amount of unexpected findings, avoids intraoperative improvisation, decreases
89 intraoperative time and associated comorbidities, and therefore results in better outcomes (3-
90 5). However, accurate preoperative planning is difficult, since the surgical approach is different
91 for each individual in this heterogenous patient group (6). Moreover, often these patients
92 require multiple surgical procedures, increasing the complexity even more by scar tissue,
93 fibrosis, and adhesions during reoperations (7,8).

94
95 Currently, diagnosis and preoperative surgical planning of DORV is achieved based on
96 ultrasound (US) images (**Figure 1A**), which in some cases is insufficient to visualize the
97 complex anatomy and spatial intracardiac relationships of the heart (9). In these cases, cross-
98 sectional contrast enhanced computed tomography (CT) images (**Figure 1B**), Magnetic
99 Resonance Imaging can be acquired (10). These modalities are generally visualized on a 2D
100 screen and need to be mentally translated to a 3D volume to understand the anatomy (9). For
101 this mental 3D reconstruction, experience and advanced knowledge of the anatomy and 3D
102 spatial orientation is required, especially with the abnormal anatomy in DORV patients
103 (7,11,12).

104

105 Several 3D visualization technologies have been suggested to facilitate surgical planning,
106 including 3D printing (**Figure 1C,D**) and 3D Virtual Reality (3D-VR) (**Figure 1E,F**). The
107 applications of 3D printing and 3D-VR reconstructions are already being explored, however,
108 studies comparing these different 3D visualizations are still scarce, and use of 3D is currently
109 not implemented as standard surgical planning in CHD surgery (13,14). The aim of this study
110 is to assess the added value of these 3D visualization methods (3D-VR models and 3D printed
111 models) for surgical planning in DORV patients, supplementary to the gold standard 2D
112 imaging modalities, in a retrospective clinical setting.

113

114 **2 Patients and methods**

115 Ethics statement

116 The Erasmus MC Medical Ethical Review Committee approved the research protocol (MEC-
117 2020-0891). Participants provided verbal informed consent before participating.

118

119 3D model reconstructions

120 Operated DORV patients were selected retrospectively for 3D reconstruction if the decision of
121 the surgical strategy was difficult based on anatomical complexity. In order to reconstruct the
122 3D printed and 3D-VR models, the CT images were collected, anonymized and exported as
123 DICOM files (Digital Imaging and Communications in Medicine) from the Picture Archiving and
124 Communication System. The 3D printed models were fabricated according to a previously
125 published protocol (15). To create 3D-VR reconstructions, segmentation of cardiac structures
126 was performed semi-automatically by using grey value thresholding, region growing
127 algorithms, and manual editing using 3D Slicer software (16) (**Figure 2**). Segmentations were
128 exported as binary Nifti masks and were directly loaded in combination with the DICOM CT
129 images in 3D-VR visualization software using a MedicalVR workstation and software
130 (MedicalVR, Amsterdam, The Netherlands).

131 Study participants and study setup

132 All participants were congenital cardiothoracic surgeons and pediatric cardiologists.
133 Participants were blinded for the executed surgical procedure of the patients. An overview of
134 the hereafter described workflow and outcomes is shown in **Figure 3**. The participants were
135 shown all images and 3D models of the selected patients. For each retrospective patient case,
136 the participants were first shown the gold standard imaging (diagnostic preoperative US and
137 CT images). Subsequently, the participant assessed the 3D visualization methods (3D printed
138 and 3D-VR models) of the corresponding patient. The order of assessment of the two 3D
139 visualization methods was random, to overcome sequence bias. Right after assessing each
140 image visualization method, the participants filled in a questionnaire based on the visibility of
141 the essential modifiers (3 point Likert-scale: poor, neutral, good), and proposed a surgical
142 plan. This surgical plan was then compared in retrospect with the actually performed surgery.
143 Moreover, participants rated their certainty on the proposed surgical plan on a scale from 0
144 (completely unsure) to 10 (100% sure) (**Supplementary File A**). Above mentioned steps were
145 performed for all five patient cases. When a participant had finalized all patient cases, a
146 questionnaire was filled in on the usefulness, satisfaction and ease of use (USE) (17).
147 Advantages and disadvantages were filled out for both 3D printing and 3D VR reconstruction
148 (**Supplementary File B**).

149 **2.1 Statistical analysis**

150 Statistical analysis was performed using R (R Core Team, Vienna, Austria, www.R-
151 project.org). Because the twelve participants assessed five imaging datasets of complex
152 DORV patients, clustering could exist within data filled in by one participant and also within
153 the data of one patient. Therefore, for the essential modifiers a linear mixed-effect model
154 (LMM) with random intercept for patients and participants was used to account for clustering.
155 A null-model was compared to a model containing the different imaging methods as covariates
156 using a likelihood ratio test based on Galbraith et al. (18). Data was divided in three groups
157 (CT/US, VR, 3D printing) with different clusters (participants and patients). First, a null-model
158 was made, in which only the patient and participant clustering was taken into account. This

159 was done by specifying a random intercept for patient and participant (crossed random
160 effects). Moreover, a second model was made, including also the three imaging methods as
161 fixed effects, besides the clustering of patients and participants. These two models were
162 compared using a likelihood-ratio (LR) test, in order to calculate the P-value. Next, to assess
163 between which two groups the results are statistically significantly different, a post-hoc
164 analysis was performed using these models and a clustered Wilcoxon signed rank test from
165 the package “clusrank” (19). Moreover, Bonferroni correction was performed to correct for
166 multiple testing, such that a P value <0.00119 was considered statistically significant.
167 Continuous data are presented as median with interquartile range (IQR) and categorical data
168 are presented as percentage (frequency).

169 **3 Results**

170 Twelve participants, five congenital cardiothoracic surgeons and seven pediatric cardiologists,
171 working in three different medical centers, were included in this study (**Table 1**). The
172 participants had a median work experience of 16 years (IQR: 13-25). Eleven complex DORV
173 patients with preoperatively available 3D printed models were identified. Five representative
174 patient cases were selected, since these patients had various anatomical DORV variants,
175 underwent different repair surgeries, and sufficient CT scan quality for 3D-VR reconstructions
176 (contrast enhanced CT with a maximum slice thickness of 0.6 mm). The segmentations of the
177 cardiac structures took approximately 60-120 min per patient, depending on anatomical
178 complexity. All 5 patients underwent successful surgery, the patient characteristics are shown
179 in **Table 2** and the opinion towards future use of the 3D methods in **Figure 4**. Nine of the
180 participants assessed all five patient cases, the other participants assessed one to three
181 patient cases.

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185 3.1 Essential modifiers

186 The visibility of the four essential modifiers that are most important for DORV surgery are
187 visualized in **Figure 5**. The spatial relationships were generally visible best using both 3D
188 modalities. The location of the VSD (good visible: US/CT 64%, VR 90%, 3D print 78%, $P=.003$)
189 and the feasibility of VSD patch closure were best visible on the VR 3D reconstructions (good
190 visible: US/CT 46%, VR 92%, 3D print 66%, $P<.00119$). The great arterial relationship was
191 visible best on the 3D printed models (good visible: US/CT 78%, VR 92%, 3D print 96%,
192 $P=.026$). Contrarily, the sizes of the mitral and tricuspid valves were best visible using US/CT
193 (good visible: US/CT 58%, VR 52%, 3D print 40%, $P=.020$). Systemic and pulmonary venous
194 connections were similarly visible on all three modalities (**Supplementary Figure 1**).

195

196 3.1 Surgical plan

197 The median time for surgical planning was 14 minutes (IQR 8-20) for conventional imaging, 7
198 minutes (IQR 4-11) for VR, and 4 minutes (IQR 2.5-6) for 3D printing. The proposed surgical
199 plans were compared with the performed surgical procedures. After VR visualization, most
200 surgical plans were corresponding to the performed procedure (correct estimated surgical
201 plans based on: CT/US 66%, VR 80%, and 3D printing 78%, **Figure 6**). For example
202 discrepancy between the surgical plans occurred in cases where participants answered that
203 a Nikaidoh or Rastelli would have been performed where an intraventricular tunnel was
204 performed during surgery. Furthermore, we compared the results regarding surgical plan
205 between the two specialisms, both surgeons and cardiologists proposed a strategy that was
206 in accordance with the performed surgery in 75% (**Supplementary Table S1**). The
207 participants were least sure formulating a surgical plan based on the conventional imaging
208 compared with both 3D visualization methods (certainty scores; CT/US: 7.0 (IQR 5.3-8), VR:
209 8.0 (IQR 7.8-9.0), and 3D print: 8.0 (IQR 7.0-9.0), $P<.00119$).

210

211 **3.2 Usefulness, Satisfaction, Ease of use**

212 Nine participants filled in the questionnaire on the usefulness, satisfaction, ease of use, and
213 ease of learning of the two 3D visualization methods (**Supplementary Figure 2-5**). According
214 to the participants, both 3D visualization methods were useful for surgical planning (3D printing
215 72%, 3D-VR 100%) and helped with the understanding of the complex anatomy of the DORV
216 patients (3D printing 63%, 3D-VR 100%). Furthermore, most participants prefer to use both
217 3D visualization methods as additional surgical planning tools (3D printing 72%, 3D-VR
218 100%), but 81% of the participants disagreed to use these methods as a replacement of the
219 gold standard. 3D printed models were easier to use than the 3D-VR reconstructions (3D print
220 82%, 3D-VR 54%), but both methods were applicable without instructions, based on most of
221 the participants' opinions (3D printing 90%, 3D-VR 82%).

223 **4 Discussion**

224 In this pilot study, we investigated the additional value of both 3D-VR and 3D printing for
225 surgical planning of complex DORV patients. The use of both additional 3D modalities was
226 found very useful for congenital cardiac surgeons and cardiologists. Spatial relationships
227 needed for surgical planning were better visible in the 3D visualization, and the surgical plans
228 based on the 3D visualizations were more often corresponding to the actual performed
229 surgical procedure. Moreover, the specialists were more certain of their proposed surgical
230 plans after assessing the 3D methods. Based on these observations, we demonstrated the
231 importance of 3D visualization for surgical planning of these complex cases.

232
233 For all DORV patients included in this study, both 3D visualizations were found useful and
234 gave more insight in the anatomy and possible surgical reparations than the conventional 2D
235 imaging. The participants' mental interpretation of the anatomy was confirmed or adjusted
236 through 3D visualization. The proposed surgical plans were more corresponding to the

237 performed surgical procedures, based on 3D printing and 3D-VR. This ability to indicate the
238 right surgical plan prior to the procedure, based on preoperative imaging could diminish the
239 amount of exploration needed intraoperatively. This could save intraoperative time, avoid
240 unnecessary incisions, and associated comorbidities, and therefore may result in better
241 outcomes (3–5).

242 In VR, the intracardiac structures could be assessed more completely, because both the
243 model and the cutting plane can be moved and visualized in all arbitrary angles easily, using
244 the VR controllers and virtual cutting planes (20). Furthermore, navigation and orientation was
245 easy in the 3D-VR models because of the color coding of cardiac segmentations. Thus, 3D-
246 VR models are highly interactive to view extra- and intracardiac structures, dimensions, and
247 relationships (21). For the 3D printed models, the cutting planes were fixed by the designer of
248 the model and therefore some intracardiac structures were only partially accessible. Moreover,
249 due to limited printing resolution, in some models small structures such as coronary arteries
250 could not be printed, which could have affected the results regarding 3D printing. The 3D prints
251 provided true sized and tactile information, resembling the actual cardiac size intraoperatively.
252 Although, in VR the 3D models could be scaled up, compared to the scaling by the loupe
253 glasses of the surgeons (22,23).

254 Functional and quantitative data, such as the size and straddling of cardiac valves was better
255 visible on conventional imaging. This is because 3D visualization is limited by the underlying
256 image quality. Because of the limited temporal and spatial resolution of CT, the highly dynamic
257 valves and small structures are often invisible on 2D cross-sectional CT images, making it
258 also impossible to visualize them in physical or virtual 3D reconstructions (24). This underlines
259 the importance of multimodality imaging. In the future it could be useful to combine functional
260 and spatial information from multiple imaging modalities, so all necessary information can be
261 obtained in a glance presented preferably in three dimensions.

262 Despite most of the participants being early adopters or early majority with regards to new
263 technology (**Table 1**), most of them didn't prefer to replace the gold standard with the 3D
264 visualizations, but would use it as an addition to the gold standard. Currently, the 3D print and

265 3D-VR are both based on the CT scans and are thus designed as an addition to the CT and
266 US imaging.

267 **4.1 Limitations**

268 A limitation of this pilot study is the limited number of study subjects (n=5) as well as the small
269 (n=12) and heterogeneous (surgeons and pediatric cardiologists) number of participants. The
270 initial dataset consisted of eleven DORV patients, of which only five patients had a
271 preoperative CT scan with adequate spatial and contrast resolution for VR visualization.
272 Because of the variation in the types of DORV patients and surgical approaches, the patient
273 group was suitable for this pilot study, comparing conventional 2D imaging, 3D printing, and
274 3D-VR in terms of visualization. Even though we acknowledge the fact that 3D printing is a
275 technique that has been presented as a possible pre-operative surgical planning tool for this
276 challenging patient population, we aimed to compare the added value of 3D printing with the
277 more recently introduced immersive VR-technology that potentially has other benefits than 3D
278 printing. Moreover, we included a relatively small number of participants. Despite the
279 multicenter study design, including both cardiothoracic surgeons as cardiologists, still only
280 75% of the participants were able to rate all patient cases due to busy working schedules, as
281 it took approximately 25 minutes for them to analyze each patient case. We also do
282 acknowledge the limitation that we asked cardiologists to propose a 'surgical repair' strategy.
283 However, this is resembling the heart team multidisciplinary meetings, in which cardiologists
284 and surgeons discuss the treatment options and surgical strategy for these complex cases. In
285 this study we demonstrated that also cardiologists are able to estimate the surgical plan
286 correctly. Considering the positive findings regarding both 3D modalities in this retrospective
287 pilot study, the next step is a prospectively designed clinical study including more study
288 subjects and participants. Hence, objective evidence could be gathered on the value of the
289 3D visualization methods for surgical planning of DORV patients, investigating outcomes such
290 as cardiopulmonary bypass time, intraoperative exploration time, intraoperative changes of
291 plan, residual defects, complications, and mortality (15,25). However, operative time and

292 patient outcomes are depending on many other patient and surgeon related factors, so it
293 remains difficult to study this in this heterogeneous patient population. Currently, we only
294 compared 2D vs 3D printing and 3D-VR. Additionally, direct volume rendering techniques (not
295 requiring segmentation of structures) on a computer monitor could be added as an extra
296 comparison.

297 In the end, the operative strategy is chosen by the attending surgeon, not necessarily
298 precluding a possibly different other surgical choice. Furthermore, some of the participating
299 surgeons operated on the included DORV patient cases, so they could have recognized these
300 patients' imaging. This could have resulted in a higher percentage of correctly determined
301 surgical plans. However, this will be higher for all groups (CT, VR, and 3D printing), since they
302 assessed all imaging data of the patient cases.

303 Due to the heterogeneity of DORV patients, various scanning protocols are used within
304 different centers, which may have contributed to the exclusion of six cases. It is important to
305 investigate the optimal scanning parameters and use a standardized protocol to obtain
306 comparable and good quality CT images. Furthermore, both statistical tests used (Wilcoxon
307 signed rank and LMM tests) were actually suboptimal for this dataset. The Wilcoxon signed
308 rank test is only able to test two groups, instead of the three groups (US/CT, VR, 3D print)
309 compared in this study. Moreover, the LR test of the LMM is originally described for continuous
310 data, as the Likert-scale results were ordinal data. This could have resulted in more statistical
311 significant results, since more value is assigned to the ordinal data.

312

313 **4.2 Future perspectives**

314 Since most CHDs are very variable with highly individual anatomy, it can be beneficial to
315 perform 3D surgical planning for various other CHDs besides DORV patients (for example
316 pulmonary stenosis with collateral arteries, TGA, or tracheomalacia). At last, the possibilities
317 of extended reality beyond virtual reality, such as augmented or mixed reality, could be
318 explored. Augmented or mixed reality could be used to create an overlay of the surgical

319 planning on the intraoperative view and serve as intraoperative navigation (21). In this way,
320 the virtual 3D models are valuable not only pre-operatively, but also intra-operatively.

321

322 **5 Conclusion**

323 Concluding, this study showed that both 3D printing and 3D-VR have additional value for
324 cardiac surgeons and pediatric cardiologists over 2D imaging, because of better visualization
325 of spatial relationships. As a result, the proposed surgical plans based on the 3D visualizations
326 matched the actual performed surgery to a greater extent. However, a larger and prospective
327 cohort of patients is needed in future research, to quantify results such as patient outcomes,
328 operative time, complications, and survival objectively.

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336

337 **Conflict of Interest**

338 Sadeghi is co-inventor of the virtual reality-based technology presented in this article. All
339 other authors reported no conflict of interest. All authors declare that the research was
340 conducted in the absence of any commercial or financial relationships that could be
341 construed as a potential conflict of interest.

342 **Author Contribution**

343 JP: Conceptualization; Data curation; Formal analysis; Investigation; Methodology;
344 Resources; Software; Visualization; Writing—original draft. WB: Supervision; Validation;
345 Writing—review & editing. AS: Conceptualization; Methodology; Software; Supervision;
346 Validation; Writing—review & editing. KV: Data curation; Formal analysis; Software;
347 Validation; Writing—review & editing. MH: Conceptualization; Methodology; Resources;
348 Supervision; Writing—review & editing. AR: Conceptualization; Methodology; Resources;
349 Supervision; Writing—review & editing. NB: Conceptualization; Methodology; Supervision;
350 Writing—review & editing. TwW: Conceptualization; Methodology; Supervision; Writing—
351 review & editing. AB: Conceptualization; Methodology; Resources; Supervision; Writing—
352 review & editing.

353

354 **Data Availability Statement:** The data underlying this article cannot be shared publicly due
355 to privacy of the patients and participants. The data will be shared on reasonable request to
356 the corresponding author.

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358 **Figure Legends**

359 **Figure 1 - Imaging modalities used in Double Outlet Right Ventricle patients**

360 A) Ultrasound four chamber overview, B) Axial CT image, C) anterior view of the 3D printed
361 model, D) lateral view of the 3D printed model. E) right lateral view of the 3D-VR
362 reconstruction, F) anterior view of the 3D-VR reconstruction, Ao = aorta, LA = left atrium,
363 LV = left ventricle, RA = right atrium, RV = right ventricle, PA = pulmonary artery, ^ =
364 coronary artery, * = ventricle septum defect.

365
366 **Figure 2 - CT scan with segmentations of the cardiac structures** An axial (A), coronal
367 (B) and sagittal (C) cross-sectional slice are shown, together with the highlighted cardiac
368 segments. Ao = aorta, LA = left atrium, LV = left ventricle, RA = right atrium, RV = right
369 ventricle, PA = pulmonary artery, ^ = coronary artery, * = ventricle septum defect

370
371 **Figure 3 - Overview of the workflow; creating 3D models, performing experiments, and**
372 **outcomes**

373
374 **Figure 4 - Participants' opinion towards future use of 3D visualization**

375
376 **Figure 5 - Visibility of the most important essential modifiers for surgical planning**

377 Based on 2D ultrasound and computed tomography images (US/CT), 3D-Virtual Reality (3D-
378 VR) and 3D printing. The P values are based on the LR test, based on the LMM. * =
379 $P < .00111$ of the post-hoc analysis between the groups.

380

381 **Figure 6 - Number of surgical plans corresponding to the actual performed procedure,**
382 **based on ultrasound and CT images (conventional 2D imaging), 3D printed models, and the**
383 **3D-VR models (left to right).**

384 **Central image** - Graphical abstract explaining the key question, key findings and take home
385 message

386 **Video 1** – Overview of the 2D-US, axial 2D-CT images, 3D printed, and 3D-VR models.

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465 **Table 1 - Participant characteristics**

| | All participants n = 12 | Congenital cardiothoracic surgeons n = 5 | Pediatric cardiologists n = 7 |
|--|----------------------------|---|----------------------------------|
| Work experience | 16.0 years (IQR: 13-25) | 17.5 years (IQR: 8-28) | 16.0 years (IQR: 14-24) |
| Gaming experience | | | |
| Never | 25% (3) | 0% (0) | 43% (3) |
| Few times | 75% (9) | 100% (5) | 57% (4) |
| Regular basis | 0% (0) | 0% (0) | 0% (0) |
| Attitude towards new technologies | | | |
| Innovators | 0% (0) | 0% (0) | 0% (0) |
| Early adopters | 42% (5) | 60% (3) | 29% (2) |
| Early majority | 25% (3) | 0% (0) | 43% (3) |
| Late majority | 33% (4) | 40% (2) | 29% (2) |
| Laggards | 0% (0) | 0% (0) | 0% (0) |
| Virtual reality experience | | | |
| Never | 8% (1) | 0% (0) | 14% (1) |
| Few times | 92% (11) | 100% (5) | 86% (6) |
| Regular basis | 0% (0) | 0% (0) | 0% (0) |
| Expert | 0% (0) | 0% (0) | 0% (0) |
| 3D print experience | | | |
| Never | 0% (0) | 0% (0) | 0% (0) |
| Few times | 75% (9) | 80% (4) | 71% (5) |
| Regular basis | 25% (3) | 20% (1) | 29% (2) |

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Table 2 – Patient characteristics

| Patient | Type DORV | Associated anomalies | Surgical approach | Performed procedure | Previous palliative surgeries | Age at surgery (days) |
|---------|------------|---|-------------------|--|-----------------------------------|-----------------------|
| 1 | TOF type | ASD type 2, right AA, hypoplastic PA, single coronary ostium, double VCS, azygos continuation | Biventricular | Intraventricular tunnel, RVOT enlargement with TAP | Central shunt | 254 |
| 2 | ncVSD type | ASD type 2, CoA | Biventricular | Intraventricular tunnel | PA banding, coarctectomy | 600 |
| 3 | TGA type | LVOTO, ASD type 2 | Biventricular | Nikaidoh procedure | MBTS | 319 |
| 4 | ccTGA type | PS, single coronary ostium, Ebstein TV | Univentricular | Fontan procedure | Bidirectional Glenn, ASD creation | 2468 |
| 5 | TGA type | Subpulmonary accessory tissue without obstruction | Biventricular | Intraventricular tunnel, arterial switch | | 84 |

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473 **Table Legends**

474 **Table 1 - Participant characteristics**

475 Based on self-completed questionnaires, the following characteristics of participants were
476 collected. Inconsistencies in the sum of percentages is due to the rounding of the percentages.
477 IQR: interquartile range.

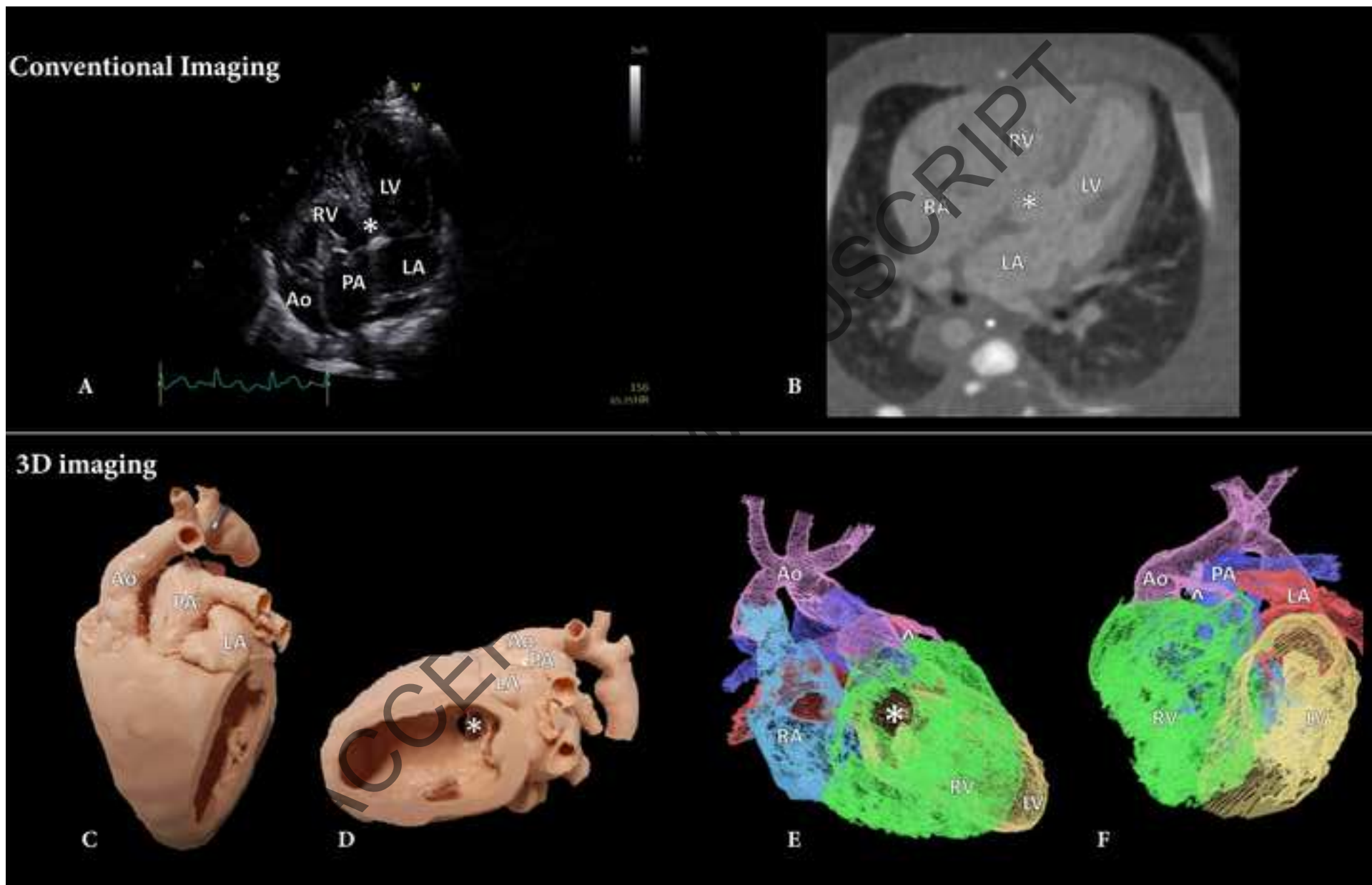
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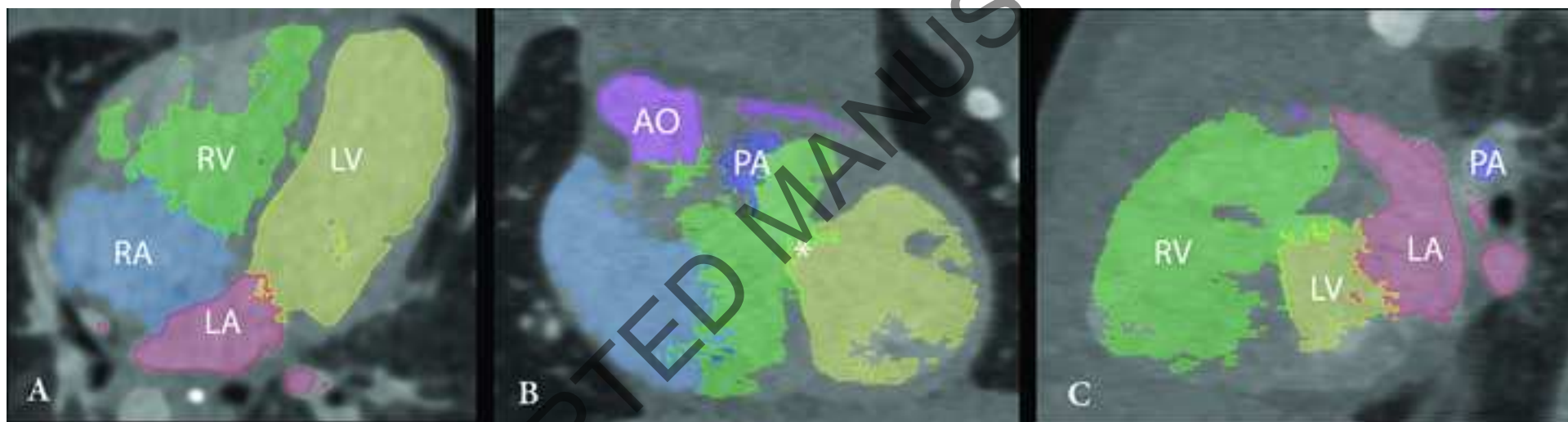
479 **Table 2 – Patient characteristics**

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481 AA = aortic arch, ASD = atrial septum defect, CoA = coarctation aortae, LVOTO = left
482 ventricular outflow tract obstruction, MBTS = modified Blalock-Taussig Shunt, ncVSD = non-
483 committed ventricular septum defect, PA = pulmonary artery, PS = pulmonary valve
484 stenosis, PFO = persistent foramen ovale, RVOT = right ventricular outflow tract, TAP =
485 transannular patch, TGA = transposition of the great arteries, ccTGA = congenitally
486 corrected TGA, TOF = Tetralogy of Fallot, TV = tricuspid valve, VCS = vena cava superior
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1. Creating 3D models

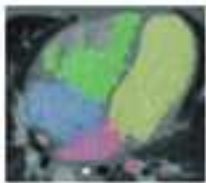
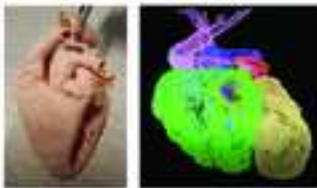


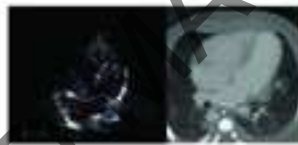
Image acquisition, segmentation,
post processing, and colorisation



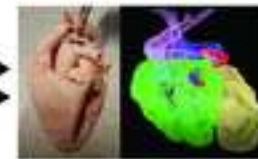
2. Experiments



Congenital cardiac surgeons
& Paediatric cardiologists



1. Conventional imaging

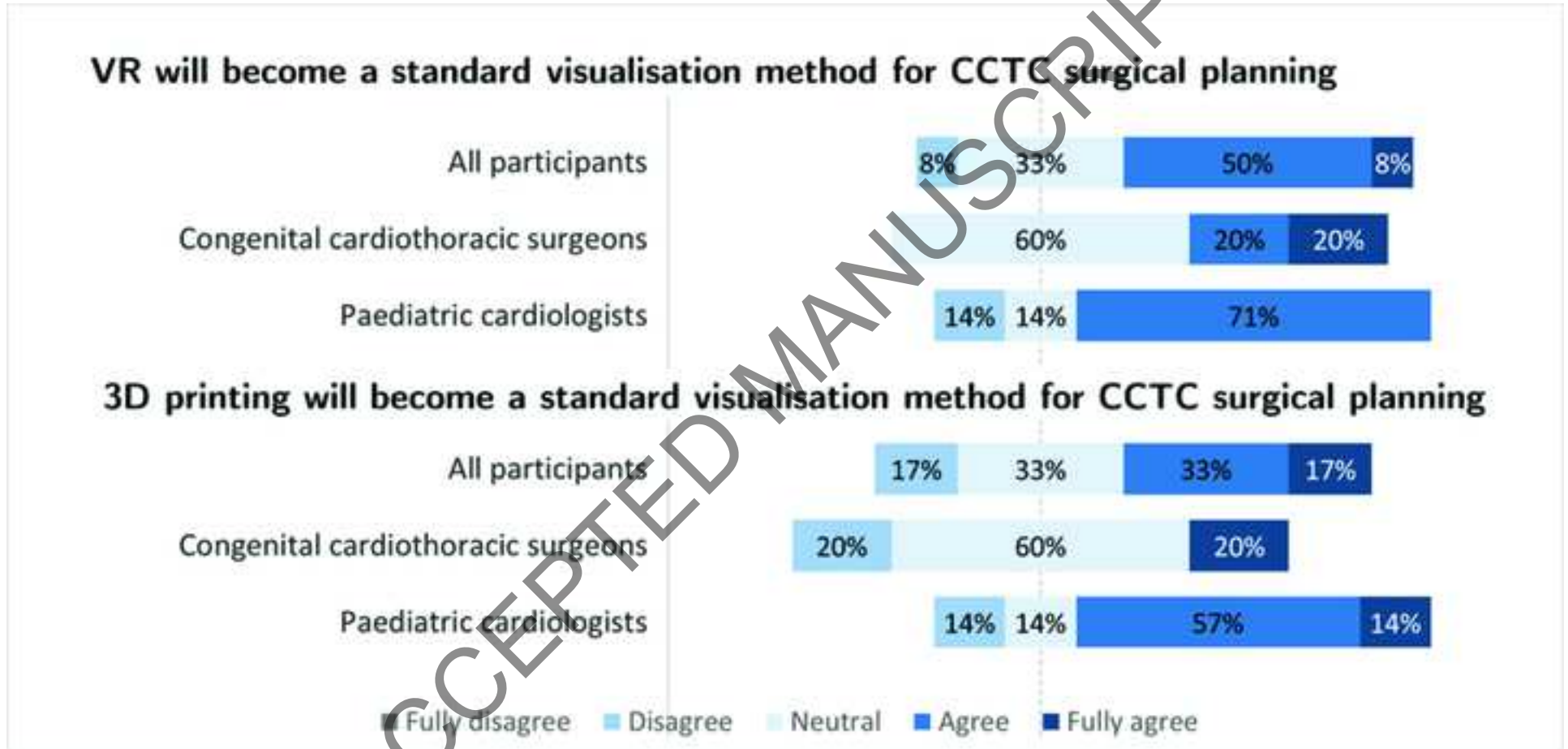


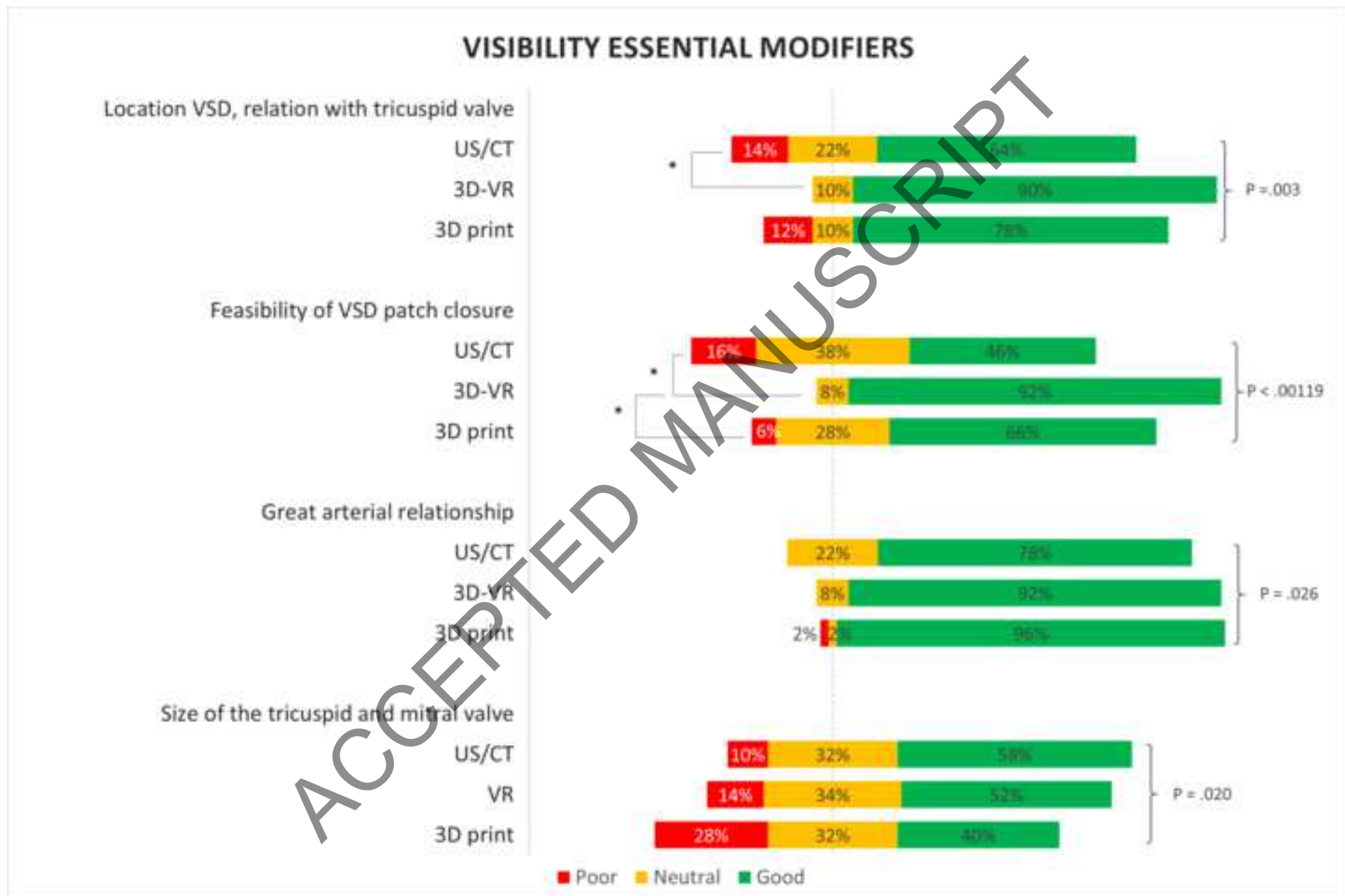
2. VR & 3D print
- Randomized order -

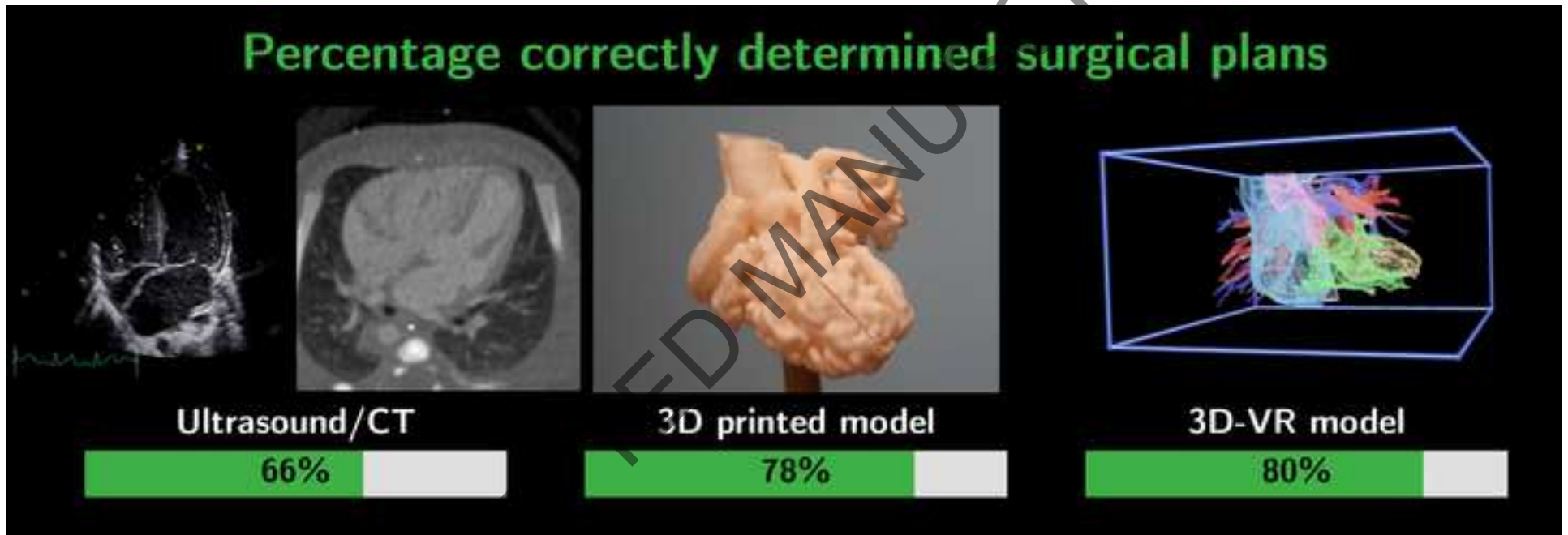
3. Outcomes

-  Visible structures and relationships
-  Percentage correct estimated surgical plans
-  Surgical planning time
-  Ease of use, Satisfaction & Usefulness

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SCRIPT

Optimized preoperative planning of double outlet right ventricle (DORV) patients by 3D printing and virtual reality: a pilot study

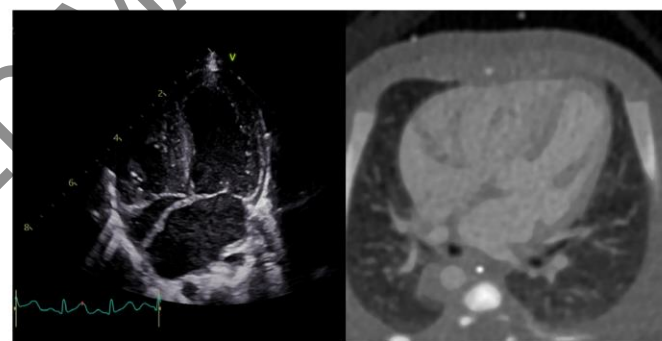
Summary

Key question: What is the added value of 3D-Virtual Reality (3D-VR) and 3D printed models over 2D imaging techniques for the surgical planning of complex DORV patients?

Key findings: Spatial relationships of anatomical structures needed for surgical planning were better visible in the 3D visualization methods, compared to conventional 2D imaging.

Take home message: The use of 3D-VR and 3D printed models can improve patient-specific surgical planning of complex DORV surgeries. This resulted in better prediction of the performed surgical procedure.

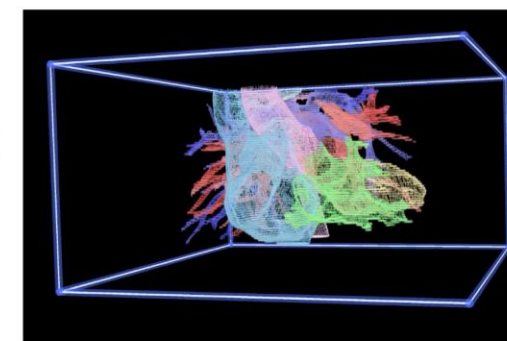
Percentage correctly determined surgical plans



Conventional 2D imaging



3D printed model



3D-Virtual Reality

