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# **BMJ Open**

# Oncologic big-data platform in promoting digital competencies and professionalism in Chinese medical students: a cross-section study

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2	professionalism in Chinese medical students: a cross-section study
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#### 25 Abstract

Objectives: Advancements in big data technology are reshaping the health care system
in China. However, medical students' attitude for big data technology, as well as their
professionalism in the big data age were poorly investigated. This study aims to explore
the role of medical big data in promoting the digital competencies and professionalism
in Chinese medical students.

31 Design, setting and participants: This cross-sectional study was performed among 32 274 medical students who attended a workshop about medical big data conducted on 33 July 8, 2021 in Tongji Hospital, Tongji Medical College, Huazhong University of 34 Science and Technology, Wuhan, China. The workshop was based on the first national-35 wide multi-function gynecologic oncology medical big data platform in China, the 36 National Union of Real-World Gynecologic Oncology Research & Patient 37 Management Platform (NUWA platform).

38 Outcome measures: The knowledge and attitude towards big data technology and a
39 Professionalism Mini-Evaluation Exercise (P-MEX) instrument were collected before
40 and after the workshop.

**Results:** 274 students participated in this workshop and completed all surveys. Before the workshop, only 27% of them knew the detailed content of medical big data platforms and 64% knew its potential application. The majority of students believed that big data technology is practical in their clinical practice (77%), medical educations (85%), and scientific researches (82%). Over 80% of participants showed positive attitudes towards big data platforms. They also exhibited sufficient professionalism before the workshop. Meanwhile, the workshop has significantly promoted students' knowledge of medical big data (P < 0.05), and lead to more positive attitudes to big data platforms and higher levels of professionalism.

50 Conclusions: Chinese medical students have primitive acquaintance and positive
51 attitudes toward big data technologies. They also yield sufficient levels of
52 professionalism. And the NUWA platform-based workshop was useful in furthering
53 their understanding of big data and enhancing professionalism.

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54 Keywords: Big data; Chinese medical education; Digital competencies;
55 Professionalism; Workshop.

### 57 Strengths and limitations of this study

- This study depicted the cognition and professionalism of medical big data among
  Chinese medical students in the era of big data for the first time.
- This study provided a vivid example of how big data assists medical education,
  based on the first nation-wide gynecologic oncology medical big data platform in
  China, NUWA platform.

• The limited sample size may restrict the generalization of the conclusion.

# 65 Background

Electronification of medical records is the signature of the modern health care system.<sup>1-3</sup> Massive clinical and omics data were produced to enable more detailed depictions of patients and diseases. Medical big data is thus reshaping our appreciation of the modern medical system. Technological advancements in data storage, processing, and analysis accelerated the clinical application of big data-driven products and contributed to personalized disease management,<sup>4, 5</sup> early diagnosis,<sup>6-8</sup> and treatment decision.<sup>9, 10</sup> Especially in the COVID-19 pandemic setting, achieving rapid application for medical big data would meet the pressing clinical need to predict the progression of diseases by data characteristics.<sup>11-13</sup> 

Meanwhile, big data has brought with its new challenges for doctors.<sup>14</sup> Information overload is posed to every healthcare worker, since they have to acclimate the nature of big data, including extraordinary value, volume, velocity, variety, and variability.<sup>15</sup> Challenges can also be expected on medical professionalism in the age of big data. Because big data valued realistic health-related information more than ever, the illusion that digital data overweigh face-to-face physician-patient interactions may motivate doctors to ignore the importance of professionalism.<sup>16, 17</sup> The situation may be worse in China, because of the explosive development in big data-based technology in the last years and the well-known heavy workloads of Chinese doctors.<sup>18, 19</sup> So extra lectures and workshops in obtaining insights into big data and remaining respectful for patients are necessary. 

In this study, we carried on a workshop for Chinese clinical and pre-clinical students to further their knowledge of medical big data and to improve their professionalism in the big data era. The workshop was based on the National Union of Real-World Gynecologic Oncology Research & Patient Management Platform (NUWA platform), which is the first national-wide multi-function gynecologic oncology medical big data platform in China.

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# 94 Methods

#### 95 Study design

We performed a cross-sectional study on Chinese medical students' learning and
application of big data in healthcare. The survey was conducted among students
attending a workshop on medical big data.

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#### 100 Workshop design

The workshop was conducted on July 8, 2021 in Tongji Hospital, Tongji medical school,
Huazhong University of Science and Technology, Wuhan, China. It is a part of the
series class of "Medical big data platform learning and applying".

The workshop was delivered by two senior doctors (QLG and SQZ), who have over 5 years of experience in medical big data platform development and application. The workshop consisted of three major parts, (i) a lecture on the content and application of medical big data; (ii) a lecture on professionalism for doctors in the big data era; (iii) learners are allowed to explore the NUWA platform freely according to their interest. The first and second sections would last for about 45 minutes, and section three for 30 minutes.

In section one, five major parts were included in Dr. Zeng's speech, (i) the 111 development of medical big data in China and the world, (ii) the application and 112 113 potential of big data in clinical practice, medical education, and scientific researches; (iii) the construction and content of the NUWA platform, (iv) how to use the NUWA 114 platform; (v) plans for the NUWA platform development. For the second section, Prof. 115 116 Gao gave a lecture about (i) the attitude health care workers should have when 117 communicating with patients and colleagues considering that big data have already reshaped our medical system, (ii) the importance of detailed and continuous patients' 118 119 information for the development of big data platform, (iii) how to protect patient privacy on the databases and (iv) how to use NUWA platform to satisfy patients' needs. 120 121 For section 3, all students would be given a temporary account for the NUWA platform and have the access to all deidentified patient information. They were allowed to 122

explore the medical data freely and view structured health care information for half anhour.

#### 126 Data collection

127 Clinical and pre-clinical students in Tongji Medical school were invited to attend a 2128 hour class by email or roadshows between June 8, 2021 and July 7, 2021. The contents
129 and speakers for the workshop were presented in the email or during the roadshow.
130 Besides, all 5th- (n=50, pre-clinical) and 6th-grade (n=49, clinical) students of 8-year
131 undergraduate education in Tongji Medical School took part in this workshop as an
132 additional course.

The participants should finish two surveys, one of which should be completed before and the other after the workshop. Both questionnaires contain their basic knowledge and attitude towards big data technology and a Professionalism Mini-Evaluation Exercise (P-MEX) instrument. The attitude towards big data platform was measured by 8 questions, namely, (i) Big data platform could assist future medical education; (ii) Big data platform could assist future medical researches; (iii)Big data platform could assist future clinical practice; (iv) I am willing to learn how to use big data platform; (v) I am willing to use big data platform in the future; (vi) I am willing to recommend big data platform to my colleagues; (vii) Big data platform could benefit my career; (viii) Big data platform could benefit all medical careers. For each question, students should choose from "Totally agree", "agree", "disagree", and "totally disagree". For the applicability of conclusions, "Totally agree" and "agree" were regarded as "positive attitude", "disagree" and "totally disagree" were considered as "negative attitude". The P-MEX consists of 24 items that represent four skill categories. including Doctor-Patient Relationship skills, Reflective skills, Time Management, and Inter-Professional Relationship skills.<sup>20, 21</sup> Besides, the first survey also contained students' baseline information, and the second one contained a satisfaction questionnaire. Meanwhile, the browsing histories for participants in section 3 were also recorded and analyzed to reflect students' interest. 

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The data collection and analysis plan were acknowledged and agreed by all participants at the beginning of the workshop and the study has been approved by the Research Ethics Commission of Tongji Hospital of Huazhong University of Science and Technology (2020-S201). 

**NUWA** platform

The NUWA platform is the first nationwide Gynecological Oncology data-sharing platform launched by the National Clinical Research Center for Gynecological Oncology in August 2019. This platform integrated inpatient/outpatient clinical data, genomic data, and follow-up data to develop a patient-level longitudinal clinico-genomic database. Information was de-identified and extracted from electronic medical records. A rigorous data quality check was performed to ensure the accuracy of the data entries. Since its foundation in 2019, 17 first-class hospitals from different provinces or cities in China participated in the NUWA platform until August 2021. 

#### **Statistics analysis**

Descriptive statistics were presented by counts and percentages to describe the demographic information. The Chi-square test was used to compare the changes in knowledge and understanding of big data and professionalism before and after the workshop. To acquire more practical results, the categories "not at all important" and "not important" were combined for analysis, as well as "important" and "very important". *P-values* <0.05 were considered significant. The data were analyzed using R Version 4.03.

#### **Patient and Public Involvement**

No patients or members of the public were involved in this study. 

Results 

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#### 181 Characteristics of students

A total of 274 students participated in this workshop and completed two surveys. All
of them were included in the final analysis. Participants were aged between 22 and 28,
with 148 (54%) pre-clinical students and 126 (46%) clinical ones. Among them, 130
(47.4%) were males and 144 (52.4%) were females (Table 1).

The majority of participants (207, 75.5%) used to know at least one big data platform in China or the world. And over two-thirds of them (183, 66.8%) also acknowledged its application. However, only 17.2% (47) of them have been involved in any project related to medical big data (**Table 1**).

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191 Knowledge for big data platform

Before the workshop, about a quarter of the students (74, 27%) knew the detailed content of medical big data platforms while near 64% (174) knew the potential application of it. After attending the lessons, almost all students could understand the content (253, 92%) and the potential application (253, 92%) of medical big data (**Figure 1 and Table S1**).

Meanwhile, no matter before or after the workshop, the majority of students
believed that big data technology is practical in medical educations, clinical practice,
and scientific researches (85%, 77%, 82% before the workshop; 99%, 87%, 95% after
the workshop, respectively) (Figure 1 and Table S1).

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#### 202 Students' attitude towards big data platform

Even before the workshop, most students hold a positive attitude on the potential of the big data platform in promoting medical educations (237, 86%), medical researches (256, 93%), and clinical practices (247, 90%). And they are also willing to learn and use the big data platform (250, 91%, and 218, 80% respectively). 74% (202) of them are enthusiastic to introduce big data platforms to their colleagues. Interestingly, most students were convinced that big data platform could benefit their careers (248, 91%), but they were not sure if it would yield the same effect on the others (128, 47%) (**Figure** 

#### **2 and Table S2**).

When the workshop was finished, almost all students have positive attitudes towards the big data platform (**Figure 2 and Table S2**). However, there are still 12% (34) and 18% (48) of students who are not sure if the big data platform could benefit their and others' medical careers.

216 Professionalism

Generally, positive attitudes to all the professionalism items were demonstrated, with more than three-quarters of the students agree that all professionalism attributes are "important" or "very important" before the workshop. The three items with most students thought are "not at all important" or "not important" were maintaining patient confidentiality (66, 24% of students choose "not important" or "not at all important"), maintaining appropriate appearance (60, 22% students choose "not important" or "not at all important") and respecting rules and procedures of the system (55, 20% students choose "not important" or "not at all important") (Figure 3A and Table S3). 

After the lectures, students exhibited a more positive attitude on most professionalism items (p<0.05). The most significant improvements happened on "Maintaining patient confidentiality" (from 76% to 95%), "Listen actively to patient" (from 89% to 100%), and "Accepting feedback" (from 89% to 98%) (**Figure 3B and Table S3**).

231 Interest in medical data

In the free exploration section, most students (253, 92.3%) viewed the patients' hospitalization logs. 76.3% (209) of them are interested in the history of illness. Meanwhile, many students were interested in medicine usages (56.2%), surgery reports (52.9%), and diseases of rare pathologies (58.6%). Only about one-third of students viewed the image diagnosis (37.6%) and follow-up records (32.5%) (**Table 2**).

238 Satisfactory survey

When finished, 95.6% (262) of participants were "satisfied" or "extremely satisfied" with this workshop, and only 7 out of 274 students were not at all satisfied. However, we failed to get feedback from them in the next three months. Most students thought the workshop informative (249, 90.9%) and understandable (255, 94.1%). The majority of students were also willing to recommend this seminar to other students (257, 93.8%) and to participant in similar classes in the future (254, 92.7%). As for the duration of this workshop, only 7 (2.6%) of students thought 2 hours was too long (**Table 3**).

# **Discussion**

Our study demonstrated that Chinese medical students have primitive acquaintance and positive attitudes toward big data technologies. They also yield expertise in professionalism. Meanwhile, workshops based on big data platforms could further strengthen their digital competencies and improve doctor-patient communication capabilities, which would lead to better fitness during the expansion of medical big data.

In this workshop, the basic knowledge of big data platforms in China was measured. Although a large fraction of students knew about the big data platform and its utility, only a few of them could apprehend its composition or how to use it. This situation may be caused by the rapid development of big data technology in China recently and comparatively lagged relevant educations.<sup>22, 23</sup> Besides, ethical challenges that hinder medical and public health data sharing may also exacerbate the situation.<sup>24</sup> Therefore, aside from conducting big data-related workshops, promoting medical and public health data sharing policy and evolving relevant legal and ethical implications were also of great importance.

Students' enthusiasm towards medical big data was also taken into consideration. As expected and consistent with previous reports,<sup>25</sup> the majority of students exhibited positive attitudes towards the big data platform and were willing to acquire further proficiency. They believed that big data would play a vital role in future medical Page 13 of 28

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education, clinical practice, and scientific researches, which are the main tasks for all Chinese doctors. However, not all of them believed big data could benefit medical careers in any case. The popularity of information technology in China recently may contribute to the big-data-friendly intention in medical students.<sup>26</sup> Meanwhile, their limited understanding of related fields may hamper the belief that it could be used productively.<sup>27-29</sup> In the meantime, we were delighted to see that almost all students recognized the significance of big data after our workshop. We thus believed that proper education may be an efficient way to diminish the misunderstanding and to achieve the full potential in big data platforms.

Professionalism was related to the development of big data in our study for the first time in China. Under the consideration that big data could reshape medical activities in all aspects including doctors' attitudes towards their colleagues and patients.<sup>30</sup> a lecture about "professionalism in the age of big data" was presented in the current workshop. Before the seminar, students demonstrated sufficient professionalism similar to previous reports, with high scores in almost all items. Several important professionalism levels were significantly increased in many elements after the workshop, indicating that this workshop could be a preliminary attempt for promoting professionalism when the digital data have changed the way we communicate and doctors have to spend more time with electronic records rather than patients. These changes our workshop brought deserve more attention in China since Chinese doctors were well-known to be overburdened.<sup>18, 31</sup> These improvements could also help increase the reliability of medical records and produce convincing and effective medical information. 

Another interesting fact in the result is that about 60% of students noticed rare diseases in the free-exploration section, which is hardly involved in routine medical classes.<sup>32, 33</sup> We believe this is another strength of big data-based medical education. In traditional medical classes, it is arduous for teachers to grant detailed depictions for every type of rare disease. As a result, students may not have easy access to these exceptional cases, not to mention pay a visit to their medical records thoroughly. The

big data platform makes it possible for every user to browse cases with rare pathologiesconveniently, which would benefit patients as well as reduce misdiagnosis.

Our workshop has some limitations. The most important one is that the NUWA platform is still under development and the omics data was not included currently. Therefore, another investigation should be performed when the construction of NUWA was completed. Furthermore, narrow geographical distributions of study participants interfere with the generalization of results to other populations. Meanwhile, there are concerns that students who volunteered to participate in the workshop may be more enthusiastic about big data technology than those who did not. We thus included all 5th- (pre-clinical) and 6th-grade (clinical) students of 8-year undergraduate education in Tongji Medical School to make the study sample more representative. 

**Conclusion** 

This study depicted Chinese students' knowledge of medical big data for the first time and the NUWA platform-based workshop was proven useful in promoting their understanding of big data and enhancing professionalism.

315 List of abbreviations

P-MEX, Professionalism Mini-Evaluation Exercise instrument; NUWA platform, the
National Union of Real-World Gynecologic Oncology Research & Patient
Management Platform.

# 320 Declarations

*Ethics approval and consent to participate* 

The data collection and analysis plan were acknowledged and agreed by all participants
and the study has been approved by the Research Ethics Commission of Tongji Hospital
of Huazhong University of Science and Technology (2020-S201).

9 325 Consent for publication

2		
3 4	326	Not applicable.
5 6	327	Availability of data and materials
7 8 9	328 329	The data used in the current study are available from the corresponding author on reasonable request via e-mail (qingleigao@hotmail.com).
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12 13	331	The authors declare that they have no competing interests.
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19 20	335	of Medical Education (20A0769).
21 22	336	Authors' contributions
23 24	337	QLG, JHL and XFJ designed the study and survey. QLG, JHL, XFJ, ML, ZKP, YBH
25 26	338	and SQZ conducted the workshop. PJ, HYL, JHC, XYL, YY, and SQZ analyzed and
27 28	339	interpreted the data. YJZ and GCM performed interpretation of data and discussion of
29 30	340	findings. QLG conceptualized and designed the study, supervised the project, analyzed
31 32	341	and interpreted the data, and wrote the paper. All authors approved the final version of
33 34	342	the manuscript and agreed to the submission of this manuscript.
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39 40	345	
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#### Tables

Characteristics		Numb	Number of participants		
Age, years					
	22 (n, %)		27,	9.9%	
	23 (n, %)		16,	5.8%	
	24 (n, %)		67,	24.5%	
	25 (n, %)		66,	24.1%	
	26 (n. %)		50.	18.2%	

# 

$\begin{array}{c c c c c c c c c c c c c c c c c c c $	26 (n, %)	50, 18.2%
Gender       male (n, %)       130, 47.4%         female (n, %)       144, 52.6%         Study stage       pre-clinical (n, %)         clinical (n, %)       126, 46%         Acknowledgment of any kind of big data       platform         yes (n, %)       207, 75.5%         no (n, %)       67, 24.5%         Know the applications of big data       technology         yes (n, %)       183, 66.8%         no (n, %)       91, 33.2%         Involved in any big data-related projects       yes (n, %)         yes (n, %)       47, 17.2%         no (n, %)       227, 82.8%	27 (n, %)	28, 10.2%
male (n, %)130, 47.4%female (n, %)144, 52.6%Study stagepre-clinical (n, %)clinical (n, %)148, 54%clinical (n, %)126, 46%Acknowledgment of any kind of big data $207, 75.5\%$ platform $207, 75.5\%$ wes (n, %) $67, 24.5\%$ Know the applications of big data $47, 17.2\%$ technology $91, 33.2\%$ Involved in any big data-related projects $47, 17.2\%$ yes (n, %) $47, 17.2\%$ no (n, %) $227, 82.8\%$	28 (n, %)	20, 7.3%
female (n, %)       144, 52.6%         Study stage       pre-clinical (n, %)       148, 54%         clinical (n, %)       126, 46%         Acknowledgment of any kind of big data       platform         yes (n, %)       207, 75.5%         no (n, %)       67, 24.5%         Know the applications of big data       technology         yes (n, %)       183, 66.8%         no (n, %)       91, 33.2%         Involved in any big data-related projects       yes (n, %)         yes (n, %)       47, 17.2%         no (n, %)       227, 82.8%	Gender	
Study stage       pre-clinical (n, %)       148, 54%         clinical (n, %)       126, 46%         Acknowledgment of any kind of big data       platform         yes (n, %)       207, 75.5%         no (n, %)       67, 24.5%         Know the applications of big data       technology         yes (n, %)       183, 66.8%         no (n, %)       91, 33.2%         Involved in any big data-related projects       yes (n, %)         yes (n, %)       47, 17.2%         no (n, %)       227, 82.8%	male (n, %)	130, 47.4%
pre-clinical (n, %)       148, 54%         clinical (n, %)       126, 46%         Acknowledgment of any kind of big data          platform       207, 75.5%         no (n, %)       67, 24.5%         Know the applications of big data          technology       yes (n, %)         yes (n, %)       183, 66.8%         no (n, %)       91, 33.2%         Involved in any big data-related projects       yes (n, %)         yes (n, %)       47, 17.2%         no (n, %)       227, 82.8%	female (n, %)	144, 52.6%
clinical (n, %)126, 46%Acknowledgment of any kind of big data platform207, 75.5% 00 (n, %)yes (n, %)207, 75.5%no (n, %)67, 24.5%Know the applications of big data technology183, 66.8% 91, 33.2%Involved in any big data-related projects yes (n, %)47, 17.2% 227, 82.8%	Study stage	0
Acknowledgment of any kind of big data         platform         yes (n, %)         no (n, %)         67, 24.5%         Know the applications of big data         technology         yes (n, %)         183, 66.8%         no (n, %)         91, 33.2%         Involved in any big data-related projects         yes (n, %)         187, 17.2%         no (n, %)         227, 82.8%	pre-clinical (n, %)	148, 54%
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no (n, %) 227, 82.8%	Involved in any big data-related projects	
	yes (n, %)	47, 17.2%
Total 274, 100%	no (n, %)	227, 82.8%
	Total	274, 100%

	Content		Number of	of participa
	History of Ill	Iness		
		Yes (n, %)	209,	76.3%
		no (n, %)	65,	23.7%
	Hospitalizati	on logs		
		yes (n, %)	253,	92.3%
		no (n, %)	21,	7.7%
	Medicine usa	age		
		yes (n, %)	154,	56.2%
		no (n, %)	120,	43.8%
	Surgery reco	rd		
		yes (n, %)	145,	52.9%
		no (n, %)	129,	47.1%
	Image diagno	osis		6
		yes (n, %)	103,	37.6%
		no (n, %)	171,	62.4%
	Follow-up re	cords		
		yes (n, %)	89,	32.5%
		no (n, %)	185,	67.5%
	Rare patholo	gies		
		yes (n, %)	160,	58.4%
		no (n, %)	114,	41.6%
	Total (n, %)		274,	100%
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# ree-exploration section.

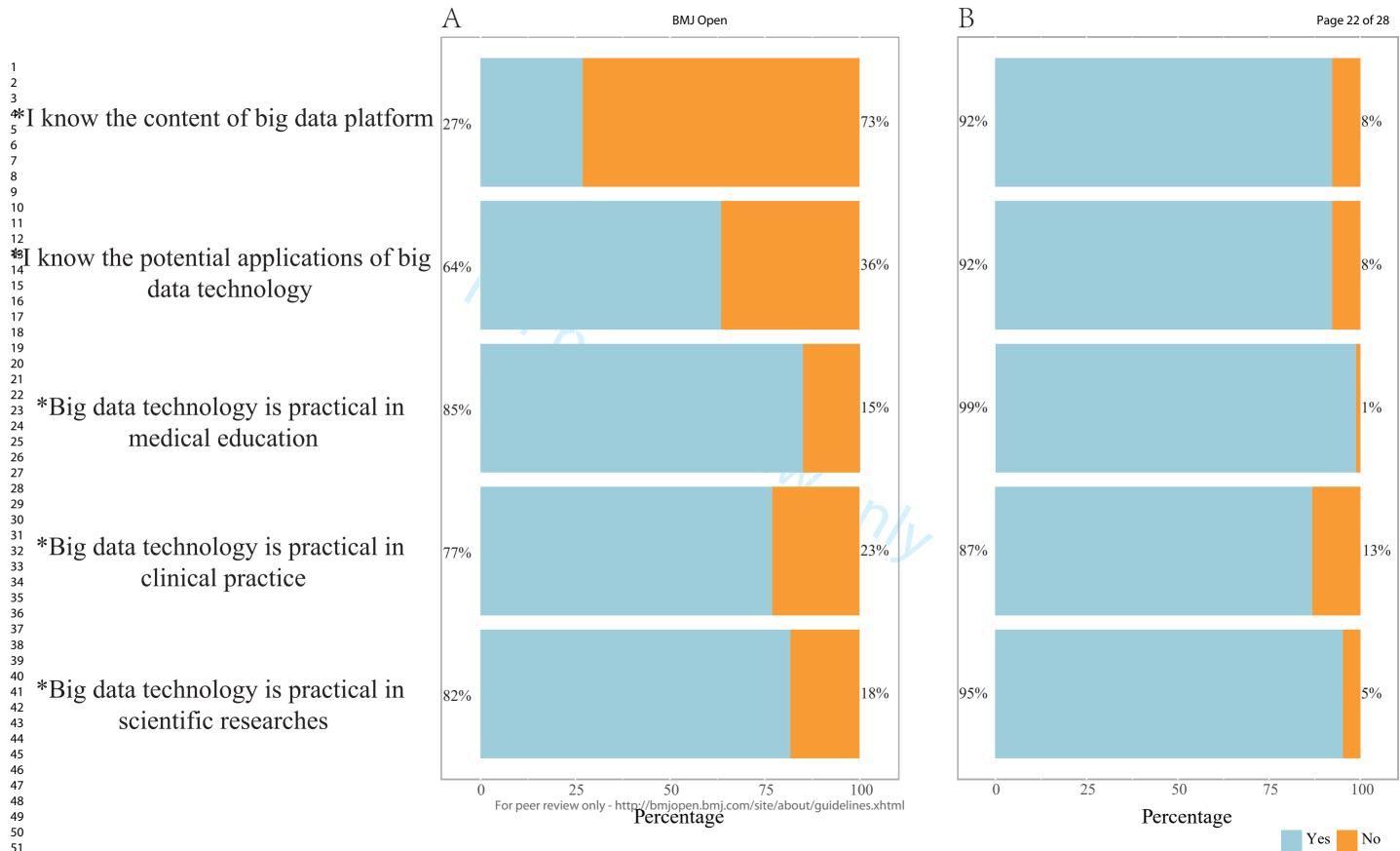
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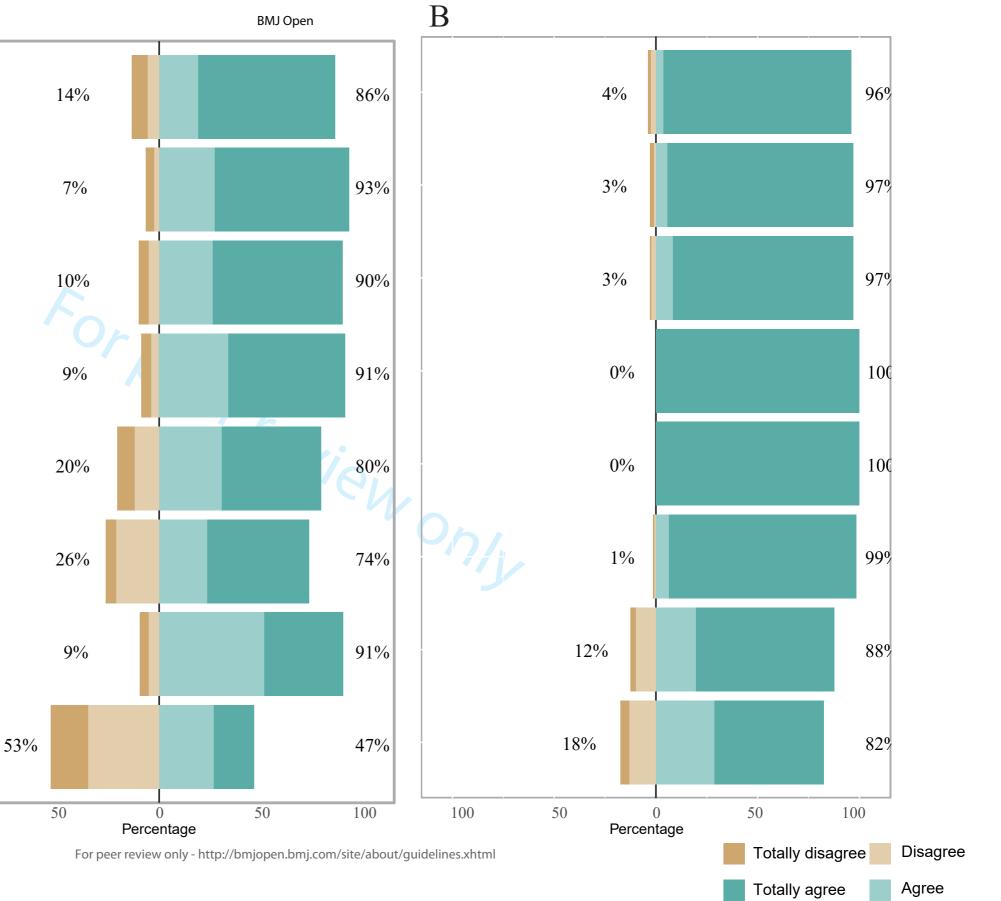
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427	Table 3. Participants 'answers to the workshop satisfaction survey	

	Not at a	all	No		Yes		Yes, ex	tremely
	(n, %)		(n, %)		(n, %)		(n, %)	
Overall, are you	7,	2.6%	5,	1.8%	57,	20.8%	205,	74.8%
satisfied with this course								
Did you think the course	10,	3.6%	15,	5.5%	101,	36.9%	148,	54%
are informative?								
Did you think the	121,	44.2%	118,	43.1%	28,	10.2%	7,	2.6%
duration of this courses								
is too long								
Was the course	11,	4%	8,	2.9%	121,	44.2%	134,	48.9%
understandable for you								
Would you recommend	6,	2.2%	11,	4%	144,	52.6%	113,	41.2%
these courses to other			4					
students?		•						
Are you willing to take	6,	2.2%	14,	5.1%	35,	12.8%	219,	79.9%
part in similar courses in								
the future?				4				
							1	

2		
3 4	439	Figure Legends
5 6	440	Figure 1. Basic knowledge for big data platform (A) before and (B) after the
7 8	441	workshop.
9 10	442	* means that there is a significant difference before and after the workshop.
11 12	443	Figure 2. Students' attitude towards big data platform (A) before and (B) after the
13 14	444	workshop.
15 16	445	* means that there is a significant difference before and after the workshop.
17 18	446	Figure 3. The professionalism for students (A) before and (B) after the workshop.
18         19         20         21         22         23         24         25         26         27         28         29         30         31         32         33         34         35         36         37         38         90         31         32         33         34         35         36         37         38         90         41         42         43         45         46         47         48         90         51         52         54         55         56         57         58	447	* means that there is a significant difference before and after the workshop.
59 60		





\*Big data platform could assist future medical education

A

Big data platform could assist future medical reserches

\*Big data platform could assist future clinical practice

\*I am willing to learn how to use big data platform

\*I am willing to use big data platform in the future

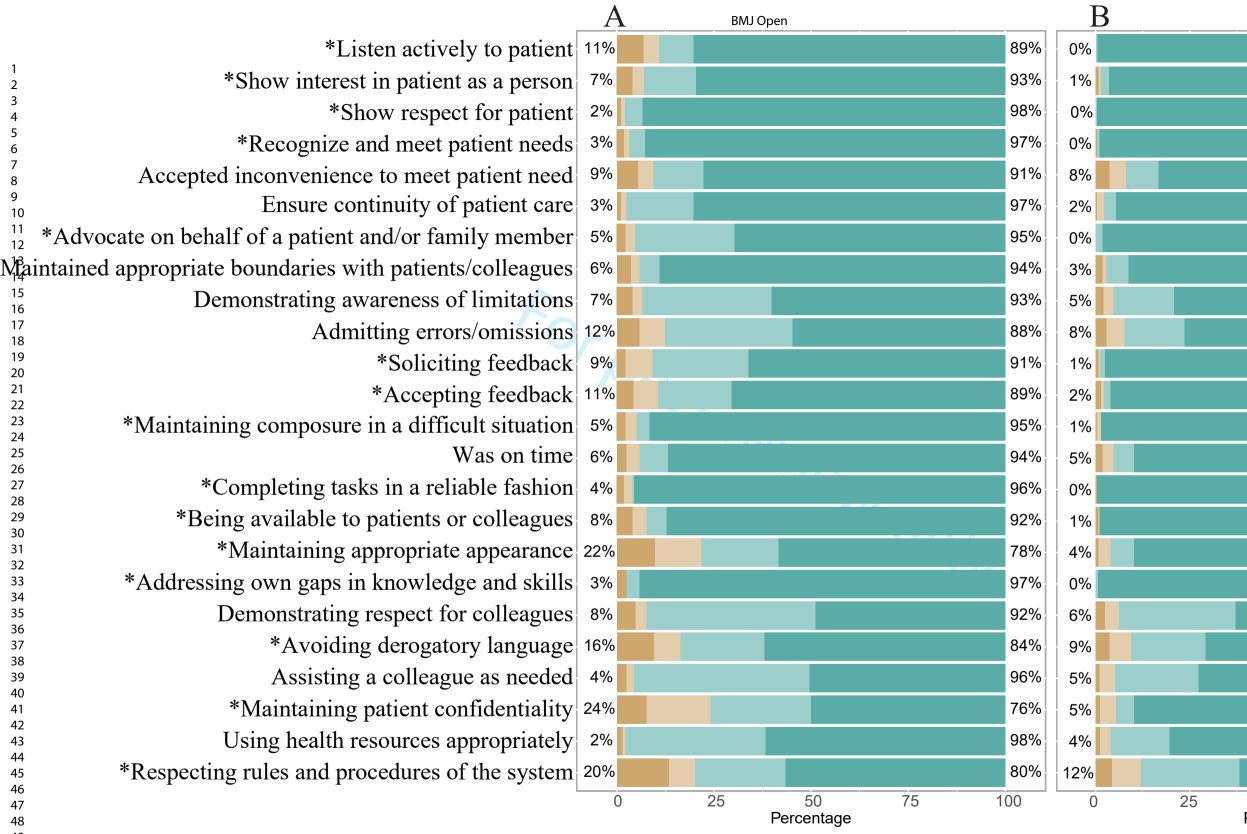
am willing to recommanded big
 data platform to my colleges

Big data platform could benefit my career

\*Big data platform could benefit all medical careers

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**F D** 

#### Page 24 of 28

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			88%
50 Percentage	75	1(	)0
Not at all important		Not importa	ant
Important		Verv impor	tant

# Supplemental tables

Table S1, basic knowledge for big data platform before and after the workshop.

	Before W	/orkshop	After Workshop		
Items	YES, n	NO, n	YES, n	NO, n	Р
I know the content of big data platform	74	200	253	21	<0.0001
I know the potential applications of big data technology	174	100	253	21	<0.0001
Big data technology is practical in medical education	233	41	271	3	<0.0001
Big data technology is practical in clinical practice	211	63	238	36	0.0039
Big data technology is practical in scientific researches	224	50	261	13	<0.0001

Table S2, students' attitude towards big data platform before and after the workshop.

	Before Workshop				After Workshop				
Items	Totally disagree, n	Disagree, n	Agree, n	Totally agree, n	Totally disagree, n	Disagree, n	Agree, n	Totally agree, n	Р
Big data platform could assist future medical education	21	16	53	184	4	7	10	253	0.0002
Big data platform could assist future scientific researches	11	7	75	181	5	3	16	250	0.0705
Big data platform could assist future clinical practice	13	14	72	175	2	6	23	243	0.0017
I am willing to learn how to use big data platform	13	11	93	157	0	0	0	274	<0.0001
I am willing to use big data platform in the future	23	33	84	134	0	0	0	274	<0.0001
I am willing to recommended big data platform to my colleagues	14	58	65	137	2	2	18	252	<0.0001
Big data platform could benefit my career	12	14	142	106	7	27	54	186	0.3382
Big data platform could benefit all medical careers	50	96	74	54	12	36	79	147	<0.0001

# Table S3, the professionalism for students before and after the workshop.

	Before workshop				After workshop				
Items	Not at all	Not important,	Important,	Very important,	Not at all	Not important,	Important,	Very important,	Р
	important, n	n	n	n	important, n	n	n	n	
Doctor-patient relationship skills		5							
Listen actively to patient	19	11	24	220	0	0	1	273	<0.000
		6							1
Show interest in patient as a person	11	8	37	218	2	2	6	264	0.0029
Show respect for patient	3	3	12	256	0	0	1	273	0.0401
Recognize and meet patient needs	5	4	11	254	1	0	2	271	0.0255
Accepted inconvenience to meet patient need	15	11	35	213	10	12	24	228	0.6503
Ensure continuity of patient care	3	4	47	220	1	5	9	259	1
Advocate on behalf of a patient and/or family member	6	7	70	191	0	0	5	269	0.0008
Maintained appropriate boundaries with	10	6	14	244	5	3	16	250	0.1.4.40
patients/colleagues									0.1440
Reflective skills									
Demonstrating awareness of limitations	11	7	91	165	6	7	44	217	0.4595
Admitting errors/omissions	16	18	90	150	8	13	44	209	0.0880
Soliciting feedback	6	19	68	181	2 t/guidelines.xhtml	1	4	267	<0.000

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Accepting feedback	12	17	52	193	4	2	5	263	0.000
Maintaining composure in a difficult situation	6	8	9	251	1	3	0	270	0.031
Time management									
Was on time	7	9	20	238	5	8	15	246	0.702
Completing tasks in a reliable fashion	5	6	1	262	1	0	0	273	0.008
Being available to patients or colleagues	11	10	14	239	2	1	0	271	0.000
Interprofessional relationship skills		6					·		
Maintaining appropriate appearance	27	33	54	160	2	9	17	246	<0.0
		6							1
Addressing own gaps in knowledge and skills	7	0	9	258	0	0	2	272	0.02
Demonstrating respect for colleagues	13	8	119	134	7	10	85	172	0.61.
Avoiding derogatory language	26	19	59	170	10	16	54	194	0.022
Assisting a colleague as needed	7	5	124	138	3	11	61	199	0.840
Maintaining patient confidentiality	21	45	71	137	3	12	13	246	<0.0
					2				1
Using health resources appropriately	4	2	99	169	3	8	43	220	0.32
Respecting rules and procedures of the system	37	18	64	155	12	21	72	169	0.01

Section/Topic	ltem #	Recommendation	Reported on page #
Title and abstract	1	(a) Indicate the study's design with a commonly used term in the title or the abstract	1
		(b) Provide in the abstract an informative and balanced summary of what was done and what was found	2
Introduction			
Background/rationale	2	Explain the scientific background and rationale for the investigation being reported	4
Objectives	3	State specific objectives, including any prespecified hypotheses	4
Methods			
Study design	4	Present key elements of study design early in the paper	5
Setting	5	Describe the setting, locations, and relevant dates, including periods of recruitment, exposure, follow-up, and data collection	5-6
Participants	6	(a) Give the eligibility criteria, and the sources and methods of selection of participants	5
Variables	7	Clearly define all outcomes, exposures, predictors, potential confounders, and effect modifiers. Give diagnostic criteria, if applicable	6
Data sources/ measurement	8*	For each variable of interest, give sources of data and details of methods of assessment (measurement). Describe comparability of assessment methods if there is more than one group	6
Bias	9	Describe any efforts to address potential sources of bias	NA
Study size	10	Explain how the study size was arrived at	6
Quantitative variables	11	Explain how quantitative variables were handled in the analyses. If applicable, describe which groupings were chosen and why	6
Statistical methods	12	(a) Describe all statistical methods, including those used to control for confounding	7
		(b) Describe any methods used to examine subgroups and interactions	NA
		(c) Explain how missing data were addressed	7
		(d) If applicable, describe analytical methods taking account of sampling strategy	7
		(e) Describe any sensitivity analyses	NA

# STROBE 2007 (v4) Statement—Checklist of items that should be included in reports of *cross-sectional studies*

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Participants	13*	(a) Report numbers of individuals at each stage of study—eg numbers potentially eligible, examined for eligibility,	8
		confirmed eligible, included in the study, completing follow-up, and analysed	
		(b) Give reasons for non-participation at each stage	All participants wer
			eligible and included
			in this study
		(c) Consider use of a flow diagram	NA
Descriptive data	14*	(a) Give characteristics of study participants (eg demographic, clinical, social) and information on exposures and potential	8
		confounders	
		(b) Indicate number of participants with missing data for each variable of interest	Very high response
			rates with no
			missing data, as
			shown in
			supplementary data
Outcome data	15*	Report numbers of outcome events or summary measures	8
Main results	16	(a) Give unadjusted estimates and, if applicable, confounder-adjusted estimates and their precision (eg, 95% confidence	In all tables and
		interval). Make clear which confounders were adjusted for and why they were included	figures.
		(b) Report category boundaries when continuous variables were categorized	In all tables and
			figures.
		(c) If relevant, consider translating estimates of relative risk into absolute risk for a meaningful time period	NA
Other analyses	17	Report other analyses done—eg analyses of subgroups and interactions, and sensitivity analyses	NA
Discussion			
Key results	18	Summarise key results with reference to study objectives	10
Limitations	19	Discuss limitations of the study, taking into account sources of potential bias or imprecision. Discuss both direction and	12
		magnitude of any potential bias	
Interpretation	20	Give a cautious overall interpretation of results considering objectives, limitations, multiplicity of analyses, results from	12
		similar studies, and other relevant evidence	
Generalisability	21	Discuss the generalisability (external validity) of the study results	12
Other information			
Funding	22	Give the source of funding and the role of the funders for the present study and, if applicable, for the original study on	13
		which the present article is based	

\*Give information separately for cases and controls in case-control studies and, if applicable, for exposed and unexposed groups in cohort and cross-sectional studies.

Note: An Explanation and Elaboration article discusses each checklist item and gives methodological background and published examples of transparent reporting. The STROBE checklist is best used in conjunction with this article (freely available on the Web sites of PLoS Medicine at http://www.plosmedicine.org/, Annals of Internal Medicine at http://www.annals.org/, and Epidemiology at http://www.epidem.com/). Information on the STROBE Initiative is available at www.strobe-statement.org.

# **BMJ Open**

# Oncologic big data platform for promoting digital competencies and professionalism in Chinese medical students: a longitudinal study

Journal:	BMJ Open
Manuscript ID	bmjopen-2022-061015.R1
Article Type:	Original research
Date Submitted by the Author:	13-Jul-2022
Complete List of Authors:	Liu, Jiahao; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Jiao, Xiaofei; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Zeng, Shaoqing; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Li, Huayi; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Jin, Ping; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Chi, Jianhua; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Liu, Xingyu; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Liu, Xingyu; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Yu, Yang; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Yu, Yang; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Ma, Guanchen; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Zhao, Yingjun; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Li, Ming; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Peng, Zikun; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Huo, Yabing; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Huo, Yabing; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology Gao, Qing-Lei ; Tongji Hospital of Tongji Medical College of Huazhong University of Science and Technology
<b>Primary Subject Heading</b> :	Medical education and training
Secondary Subject Heading:	Medical education and training
Keywords:	MEDICAL EDUCATION & TRAINING, Gynaecological oncology < GYNAECOLOGY, Gynaecological oncology < ONCOLOGY, Health informatics < BIOTECHNOLOGY & BIOINFORMATICS

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2 professionalism in Chinese medical students: a longitudinal study 3 Jiahao Liu<sup>1,2#</sup>, Xiaofei Jiao<sup>1,2#</sup>, Shaoqing Zeng<sup>1,2</sup>, Huayi Li<sup>1,2</sup>, Ping Jin<sup>1,2</sup>, Jianhua Chi<sup>1,2</sup>, 4 Xingyu Liu<sup>1,2</sup>, Yang Yu<sup>1,2</sup>, Guanchen Ma<sup>1,2</sup>, Yingjun Zhao<sup>1,2</sup>, Ming Li<sup>1,2</sup>, Zikun Peng<sup>1,2</sup>, 5 Yabing Huo<sup>1,2</sup>, Qinglei Gao<sup>1,2\*</sup> 6 7 8 9 <sup>1</sup>Department of Obstetrics and Gynecology, Tongji Hospital, Tongji Medical College, Huazhong University of Science and Technology, Wuhan 430030, Hubei, P. R. China. 10 <sup>2</sup> Cancer Biology Research Center (Key Laboratory of the Ministry of Education), 11 12 Tongji Hospital, Tongji Medical College, Huazhong University of Science and Technology, Wuhan 430030, Hubei, P. R. China. 13 14 <sup>#</sup> These authors contribute equally. 15 16 17 \* Correspondence to: Prof. Qinglei Gao, Cancer Biology Research Center (Key Laboratory of the Ministry 18 19 of Education), Tongji Hospital, Tongji Medical College, Huazhong University of 20 Science and Technology, 1095 Jiefang Ave, Wuhan 430030, Hubei, P. R. China. Tel: 21 +86-27-83662681; Fax: +86-27-83662681; E-mail: gingleigao@hotmail.com. 22

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#### 25 Abstract

Objectives: Advancements in big data technology are reshaping the health care system
in China. This study aims to explore the role of medical big data in promoting digital
competencies and professionalism among Chinese medical students.

Design, setting and participants: This study was conducted among 274 medical students who attended a workshop on medical big data conducted on July 8, 2021 in Tongji Hospital. The workshop was based on the first nationwide multifunction gynecologic oncology medical big data platform in China, at the National Union of Real-World Gynecologic Oncology Research & Patient Management Platform (NUWA platform).

Outcome measures: Data on knowledge, attitudes toward big data technology and professionalism were collected before and after the workshop. We have measured the four skill categories: doctor-patient relationship skills, reflective skills, time management, and interprofessional relationship skills using the Professionalism Mini-Evaluation Exercise (P-MEX) as a reflection for professionalism.

**Results:** A total of 274 students participated in this workshop and completed all the surveys. Before the workshop, only 27% of them knew the detailed content of medical big data platforms, and 64% knew the potential application of medical big data. The majority of the students believed that big data technology is practical in their clinical practice (77%), medical education (85%), and scientific research (82%). Over 80% of the participants showed positive attitudes toward big data platforms. They also exhibited sufficient professionalism before the workshop. Meanwhile, the workshop significantly promoted students' knowledge of medical big data (P < 0.05), and led to more positive attitudes toward big data platforms and higher levels of professionalism. **Conclusions:** Chinese medical students have primitive acquaintance and positive attitudes toward big data technologies. The NUWA platform-based workshop may potentially promote their understanding of big data and enhance professionalism, according to the self-measured P-MEX scale.

53 Keywords: Big data, Chinese medical education, Digital competencies,

1 2		
3 4	54	Professionalism, Workshop
5 6	55	
7 8	56	Strengths and limitations of this study
9 10	57	• This study depicted the knowledge and professionalism of medical big data among
11 12	58	Chinese medical students in the era of big data for the first time.
13 14	59	• This study provided a vivid example of how big data can assist medical education,
15 16	60	based on the first nationwide gynecologic oncology medical big data platform in
17 18	61	China (NUWA platform).
19 20	62	• The generalization of the findings is limited due to the sample representation and
21 22	63	longitudinal continuity of this study.
23 24	64	longitudinal continuity of this study.
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#### 65 Background

Electronification of medical records is the signature of the modern health care system.<sup>[1-3]</sup> Massive clinical and omics data have been produced to enable more detailed depictions of patients and diseases. Medical big data is thus reshaping our appreciation of the modern medical system. Technological advancements in data storage, processing, and analysis accelerated the clinical application of big data-driven products and contributed to personalized disease management,<sup>[4, 5]</sup> early diagnosis,<sup>[6-8]</sup> and treatment decision.<sup>[9, 10]</sup> Especially in the COVID-19 pandemic setting, achieving rapid application of medical big data would meet the pressing clinical need to predict the progression of diseases using data characteristics.<sup>[11-13]</sup> 

Big data has brought new challenges for doctors.<sup>[14]</sup> Information overload is a challenge for every healthcare worker, since they have to acclimate to the nature of big data, including extraordinary value, volume, velocity, variety, and variability.<sup>[15]</sup> Challenges can also be expected regarding medical professionalism in the age of big data. Because big data values realistic health-related information more than ever, the illusion that digital data outweigh face-to-face physician-patient interactions may motivate doctors to ignore the importance of professionalism.<sup>[16, 17]</sup> There is no precise definition of medical professionalism, which is reflected in the attitudes and behaviors directly related to clinical practice. Epstein RM et al. proposed the definition of professional competence as wisely using communication, knowledge, technical skills, clinical reasoning, emotions, values, and reflection in daily practice.<sup>[18]</sup> And Cain J et al. summarized professionalism as a series of attributes, such as altruism, respect, honesty, and so on.<sup>[19]</sup> Some studies have shown that digital medical education based on big data plays a positive effect in promoting professionalism.<sup>[16, 20, 21]</sup> However, there is a lack of research on the attitude and professionalism of Chinese healthcare workers regarding medical big data. Therefore, extra lectures and workshops about obtaining insights into big data and remaining respectful to patients are necessary. 

92 In this study, we aimed at depicting the knowledge of medical big data and93 professionalism in the era of big data among Chinese medical students. What's more,

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we conducted a workshop for Chinese clinical and preclinical students to improve their
knowledge of medical big data and their professionalism in the big data era, based on
the National Union of Real-World Gynecologic Oncology Research & Patient
Management Platform (NUWA platform), which is the first nationwide multifunction
gynecologic oncology medical big data platform in China.

100 Methods

#### 101 Study design

A workshop on the introduction of medical big data was conducted among clinical and preclinical students in Tongji Medical School. We conducted this study on Chinese medical students' learning and the application of big data in healthcare using pre- and post-course questionnaires.

#### 107 Workshop design

The workshop was conducted on July 8, 2021 in Tongji Hospital, Tongji Medical
School, Huazhong University of Science and Technology, Wuhan, China. It was part
of the series class of "Medical big data platform learning and applying".

The workshop was delivered by two senior doctors (QLG and SQZ), who have over 5 years of experience in medical big data platform development and application. The workshop consisted of three major parts, (i) a lecture on the content and application of medical big data; (ii) a lecture on professionalism for doctors in the big data era; and (iii) learners being allowed to explore the NUWA platform freely according to their interest. The first and second sections lasted for approximately 45 minutes, and the third section lasted for 30 minutes.

In section one, five major parts were included in lectures given by the senior doctors, (i) the development of medical big data in China and the world, (ii) the application and potential of big data in clinical practice, medical education, and scientific research, (iii) the construction and content of the NUWA platform, (iv) how to use the NUWA

platform, and (v) plans for the NUWA platform development. For the second section, the following four items were discussed: (i) the attitude health care workers should have when communicating with patients and colleagues considering that big data have already reshaped our medical system, (ii) the importance of detailed and continuous patient information for the development of big data platforms, (iii) how to protect patient privacy on the databases, and (iv) how to use the NUWA platform to satisfy patients' needs. For Section 3, all students were given a temporary account for the NUWA platform and have access to all deidentified patient information. They were allowed to explore the medical data freely and view structured health care information for half an hour. 

133 Data collection

134 Clinical and preclinical students in Tongji Medical School were invited to attend a 135 2-hour class by email or roadshows between June 8, 2021, and July 7, 2021. The 136 contents and speakers for the workshop were presented in the email or during the 137 roadshow. In addition, all 5th- (n=50, preclinical) and 6th-grade (n=49, clinical) 138 students of 8-year undergraduate education in Tongji Medical School took part in this 139 workshop as an additional course.

The participants completed two surveys, one before the workshop and the other after the workshop. Both questionnaires contain their basic knowledge and attitude toward big data technology and a Professionalism Mini-Evaluation Exercise (P-MEX) instrument. The P-MEX is developed from the mini-Clinical Examination Exercise (mini-CEX) format by Cruess R et al. in 2006 to evaluate professionalism in clinical training.<sup>[22]</sup> It consists of 24 items representing four skill categories: doctor-patient relationship skills, reflective skills, time management, and interprofessional relationship skills skills.<sup>[23, 24]</sup> And the reliability and validity of P-MEX have been confirmed in both Eastern and Western cultural backgrounds.<sup>[25-27]</sup> The attitude scale is a self-created scale focused on measuring participants' pedagogic evaluation, acceptance and expectation of the big data platform. It consisted of 8 questions: (i) Big

data platform could assist future medical education, (ii) Big data platform could assist future medical research, (iii)Big data platform could assist future clinical practice, (iv) I am willing to learn how to use big data platform, (v) I am willing to use big data platform in the future, (vi) I am willing to recommend big data platform to my colleagues, (vii) Big data platform could benefit my career, and (viii) Big data platform could benefit all medical careers. For each question, students chose from "totally agree", "agree", "disagree", and "totally disagree". For the applicability of conclusions, "totally agree" and "agree" were regarded as "positive attitude", and "disagree" and "totally disagree" were considered as "negative attitude". In addition, the first survey also contained students' baseline information, and the second survey contained a satisfaction questionnaire. Meanwhile, the browsing histories for participants in Section 3 were also recorded and analyzed to reflect students' interest.

163 The data collection and analysis plan were acknowledged and agreed upon by all 164 participants at the beginning of the workshop, and the study was approved by the 165 Research Ethics Commission of Tongji Hospital of Huazhong University of Science 166 and Technology (2020-S201).

## 168 NUWA platform

The NUWA platform is the first nationwide Gynecological Oncology data-sharing platform launched by the National Clinical Research Center for Gynecological Oncology in August 2019. This platform integrated inpatient/outpatient clinical data, genomic data, and follow-up data to develop a patient-level longitudinal clinico-genomic database. Information was deidentified and extracted from electronic medical records. A rigorous data quality check was performed to ensure the accuracy of the data entries. Since its foundation in 2019, 17 first-class hospitals from different provinces or cities in China have participated in the NUWA platform until August 2021. 

#### 178 Statistical analysis

179 Descriptive statistics were presented by counts and percentages to describe the

demographic information. The Chi-square test was used to compare the changes in knowledge and understanding of big data and professionalism before and after the workshop. To acquire more practical results, the categories "not at all important" and "not important" were combined for the analysis, as well as "important" and "very important". *P values* <0.05 were considered statistically significant. The data were analyzed using R Version 4.03.

#### 187 Patient and Public Involvement

188 No patients or members of the public were involved in this study.

**Results** 

191 Characteristics of students

A total of 274 students participated in this workshop and completed two surveys. All
of them were included in the final analysis. Participants were aged between 22 and 28,
with 148 (54.0%) preclinical students and 126 (46.0%) clinical students. Among them,
130 (47.4%) were males and 144 (52.4%) were females (Table 1).

The majority of participants (207, 75.5%) knew of at least one big data platform in
China or the world. Over two-thirds of them (183, 66.8%) also acknowledged its
application. However, only 17.2% (47) of them had been involved in any project related
to medical big data (Table 1).

#### 201 Table 1. Baseline characteristics for participants.

Characteristics	Number of participants
Age, years	
22 (n, %)	27, 9.9%
23 (n, %)	16, 5.8%
24 (n, %)	67, 24.5%
25 (n, %)	66, 24.1%
26 (n, %)	50, 18.2%

	27 (n, %)	28,	10.2%
	28 (n, %)	20,	7.3%
Gender			
	male (n, %)	130,	47.4%
	female (n, %)	144,	52.6%
Study stage			
	pre-clinical (n, %)	148,	54.0%
	clinical (n, %)	126,	46.0%
Acknowledgm	nent of any kind of big data		
platform			
	yes (n, %)	207,	75.5%
	no (n, %)	67,	24.5%
Know the a	applications of big data		
technology		-	
	yes (n, %)	183,	66.8%
	no (n, %)	91,	33.2%
Involved in an	ny big data-related projects		0,
	yes (n, %)	47,	17.2%
	no (n, %)	227,	82.8%
Total		274,	100%

#### 203 Knowledge of big data platforms

Before the workshop, approximately a quarter of the students (74, 27%) knew detailed content of at least one medical big data platform, while nearly 64% (174) knew the potential application of medical big data platforms. After attending the lessons, almost all students could understand the content (253, 92%) and the potential application (253, 92%) of medical big data (**Figure 1 and Table S1**).

209 Regardless of the survey completed (pre- or post-course), the majority of students210 believed that big data technology is practical in medical education, clinical practice,

and scientific research (85%, 77%, 82% before the workshop; 99%, 87%, 95% after the
workshop, respectively) (Figure 1 and Table S1).

#### 214 Students' attitudes toward big data platforms

Even before the workshop, most students hold a positive attitude on the potential of the big data platform in promoting medical education (237, 86%), medical research (256, 93%), and clinical practices (247, 90%). They were also willing to learn about and use the big data platform (250, 91%, and 218, 80% respectively). Of them, 74% (202) were enthusiastic to introduce big data platforms to their colleagues. Interestingly, most students were convinced that the big data platform could benefit their careers (248, 91%), but they were not sure if it would yield the same effect on the others (128, 47%) (Figure 2 and Table S2).

When the workshop was completed, almost all students had positive attitudes toward the big data platform (**Figure 2 and Table S2**). However, there were still 12% (34) and 18% (48) of students who were not sure if the big data platform could benefit their and others' medical careers, respectively.

#### 228 Professionalism

Generally, positive attitudes toward all the professionalism items were demonstrated, with more than three-quarters of the students agreeing that all professionalism attributes were "important" or "very important" before the workshop. The three items that most students thought were "not at all important" or "not important" were maintaining patient confidentiality (66, 24% of students chose "not important" or "not at all important"), maintaining appropriate appearance (60, 22% students chose "not important" or "not at all important") and respecting rules and procedures of the system (55, 20% students chose "not important" or "not at all important") (Figure 3A and Table S3).

After the lectures, students exhibited a more positive attitude on most
professionalism items (p<0.05). The most significant improvements occurred for</li>

240 "Maintaining patient confidentiality" (from 76% to 95%), "Listen actively to patient"
241 (from 89% to 100%), and "Accepting feedback" (from 89% to 98%) (Figure 3B and
242 Table S3).

- 244 Interest in medical data

In the free exploration section, most students (253, 92.3%) viewed the patients' hospitalization logs. A total of 76.3% (209) of students were interested in the patients' history of illness. Meanwhile, many students were interested in medicine usages (56.2%), surgery reports (52.9%), and diseases of rare pathologies (58.6%). Only approximately one-third of students viewed image diagnosis (37.6%) and follow-up records (32.5%) (**Table 2**).

#### **Table 2. Browser records in the free-exploration section.**

Content		Number o	of participants	
History of I	llness			-
	Yes (n, %)	209,	76.3%	
	no (n, %)	65,	23.7%	
Hospitaliza	tion logs			
	yes (n, %)	253,	92.3%	
	no (n, %)	21,	7.7%	U U
Medicine us	sage			
	yes (n, %)	154,	56.2%	
	no (n, %)	120,	43.8%	_
Surgery rec	ord			
	yes (n, %)	145,	52.9%	
	no (n, %)	129,	47.1%	_
mage diagi	nosis			
	yes (n, %)	103,	37.6%	
	no (n, %)	171,	62.4%	

89,	32.5%
185,	67.5%
160,	58.4%
114,	41.6%
274,	100%
	160, 114,

#### 254 Satisfactory survey

Upon completing the survey, 95.6% (262) of participants were "satisfied" or "extremely satisfied" with this workshop, and only 7 out of 274 students were not at all satisfied. However, we failed to obtain feedback from them in the next three months. Most students thought that the workshop was informative (249, 90.9%) and understandable (255, 94.1%). The majority of students were also willing to recommend this seminar to other students (257, 93.8%) and to participate in similar classes in the future (254, 92.7%). Regarding the duration of this workshop, only 7 (2.6%) students thought that 2 hours was too long (Table 3). 

#### **Table 3. Participants 'answers to the workshop satisfaction survey**

	Not at all	No	Yes	Yes, extremely	Mean	SD
	(n, %)	(n, %)	(n, %)	(n, %)	Wiedin	50
Overall, are you	7 2 60/	5 1.00/	57 20.00/	205 74.00/	2.00	0 ( 10
satisfied with this course	7, 2.6%	5, 1.8%	57, 20.8%	205, 74.8%	3.68	0.640
Did you think the course	10 2 60/	15 5 50/	101 36.9%	140 540/	2 41	0 757
are informative?	10, 3.6%	15, 5.5%	, 50.9%	148, 54%	3.41	0.757
Did you think the	101 440					
duration of this courses	121 44.2	118 43.1	28, 10.2%	7, 2.6%	2.07	0.954
is too long	, %	, %				
Was the course	11, 4%	8, 2.9%	121 44.2%	134, 48.9%	3.38	0.733

understandable for you					,					
Would you recommend					144					
these courses to other	6,	2.2%	11,	4%	144	52.6%	113,	41.2%	3.33	0.659
students?					,					
Are you willing to take										
part in similar courses in	6,	2.2%	14,	5.1%	35,	12.8%	219,	79.9%	3.70	0.666
the future?										

SD, Standard Deviation.

### **Discussion**

Our study demonstrated that Chinese medical students have little knowledge of and positive attitudes toward big data technologies. They also yield expertise in professionalism. Furthermore, workshops based on big data platforms could further strengthen their digital competencies and improve doctor-patient communication capabilities, which would lead to better fitness during the expansion of medical big data.

In this workshop, the basic knowledge of big data platforms in China was measured. Although a large fraction of students knew about the big data platform and its utility, only a few of them could apprehend its composition or how to use it. This situation may be caused by the recent rapid development of big data technology in China and comparatively lagging relevant education.<sup>[28, 29]</sup> In addition, ethical challenges that hinder medical and public health data sharing may have also exacerbated the situation.<sup>[30]</sup> Therefore, aside from conducting big data-related workshops, promoting medical and public health data sharing policies and evolving relevant legal and ethical implications are also of great importance. 

Students' enthusiasm toward medical big data was also taken into consideration. As expected and consistent with previous reports,<sup>[25]</sup> the majority of students exhibited positive attitudes toward the big data platform and were willing to acquire further proficiency. They believed that big data would play a vital role in future medical

education, clinical practice, and scientific research, which are the main tasks for all Chinese doctors. However, not all of them believed that big data could benefit all medical careers. The popularity of information technology of China recently may contribute to the big data-friendly intention in medical students.<sup>[31]</sup> Meanwhile, their limited understanding of related fields may hamper the belief that it could be used productively.<sup>[32-34]</sup> In the meantime, we were delighted to see that almost all students recognized the significance of big data after our workshop. We thus believe that proper education may be an efficient way to diminish misunderstandings and to achieve full potential in big data platforms.

Professionalism was related to the development of big data in our study for the first time in China. Considering that big data can reshape medical activities in all aspects, including doctors' attitudes toward their colleagues and patients,<sup>[35]</sup> a lecture about "professionalism in the age of big data" was presented in the current workshop. Before the seminar, students demonstrated sufficient professionalism similar to the findings of previous reports, with high scores on the majority of these items. Nevertheless, it is worth noting that nearly 1/4 of the participants did not pay enough attention to maintaining patient confidentiality. Protecting patients' privacy is an essential embodiment of medical ethics and humanities.<sup>[36]</sup> Participants mostly answered these questions from the perspective of big data users before our workshop, ignoring that those data represented thousands of actual patients. After we emphasized the importance of data privacy in the workshop, students realized that respect for patients is the foundation for improving their medical professionalism. Meanwhile, to enhance patient-data privacy protection, the privacy information, such as ID number, was privatized and converted into an alternative ID number using a hashing algorithm before being uploaded to the NUWA platform. Therefore, personal information of all included patients in NUWA platform is confidential and unreachable for all users. Several important professionalism levels were also significantly increased in many other elements after the workshop, indicating that this workshop could be a preliminary attempt to promote professionalism when the prominence of digital data has changed 

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the way we communicate and when doctors have to spend more time with electronic records than with patients. These changes our workshop brought deserve more attention in China since Chinese doctors are well-known to be overburdened.<sup>[37, 38]</sup> These improvements could also help increase the reliability of medical records and produce convincing and effective medical information.

Another interesting fact in the results is that approximately 60% of students noticed rare diseases in the free-exploration section, which is hardly involved in routine medical classes.<sup>[39, 40]</sup> We believe this is another strength of big data-based medical education. In traditional medical classes, it is arduous for teachers to grant detailed depictions for every type of rare disease. As a result, students may not have easy access to these exceptional cases and therefore are often not able to diagnose rare diseases when reviewing patients' medical records. The big data platform makes it possible for every user to conveniently browse through cases with rare pathologies, which would benefit patients as well as reduce misdiagnoses. 

Our workshop had some limitations. The most important one is that the NUWA platform is still under development, and the omics data are not currently included. Therefore, another investigation should be conducted when the construction of NUWA has been completed. Furthermore, narrow geographical distributions of study participants interfered with the generalization of results to other populations. Meanwhile, there are concerns that students who volunteered to participate in the workshop may be more enthusiastic about big data technology than those who did not. We thus included all 5th- (preclinical) and 6th-grade (clinical) students of 8-year undergraduate education in Tongji Medical School to make the study sample more representative. As for the measurement of attitudes and professionalism, a qualitative approach would have been more appropriate and should be considered in the future. Meanwhile, this workshop is too short to produce fundamental improvements in students' attitudes and professionalism. In the future, more long-term studies are wanted to draw a clear conclusion.

#### Conclusion

This study depicted Chinese students' knowledge of medical big data for the first time and the NUWA platform-based workshop had potential to improve their understanding of big data and enhance professionalism.

#### List of abbreviations

P-MEX, Professionalism Mini-Evaluation Exercise instrument. NUWA platform, the National Union of Real-World Gynecologic Oncology Research & Patient Management Platform.

#### **Contributorship**

QLG, JHL and XFJ designed the study and survey. QLG, JHL, XFJ, ML, ZKP, YBH and SQZ conducted the workshop. PJ, HYL, JHC, XYL, YY, and SQZ analyzed and interpreted the data. YJZ and GCM performed interpretation of data and discussion of findings. QLG conceptualized and designed the study, supervised the project, analyzed and interpreted the data, and wrote the paper. All authors approved the final version of the manuscript and agreed to the submission of this manuscript. 

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- **Competing of interests**
- The authors declare that they have no competing interests.

#### **Ethics** approval

1 2		
3 4	374	The data collection and analysis plan were acknowledged and agreed by all participants
5 6	375	and the study has been approved by the Research Ethics Commission of Tongji Hospital
7 8	376	of Huazhong University of Science and Technology (2020-S201).
9 10	377	
11 12	378	Data sharing
13 14	379	The data used in the current study are available from the corresponding author on
15 16	380	reasonable request via e-mail ( <u>qingleigao@hotmail.com</u> ).
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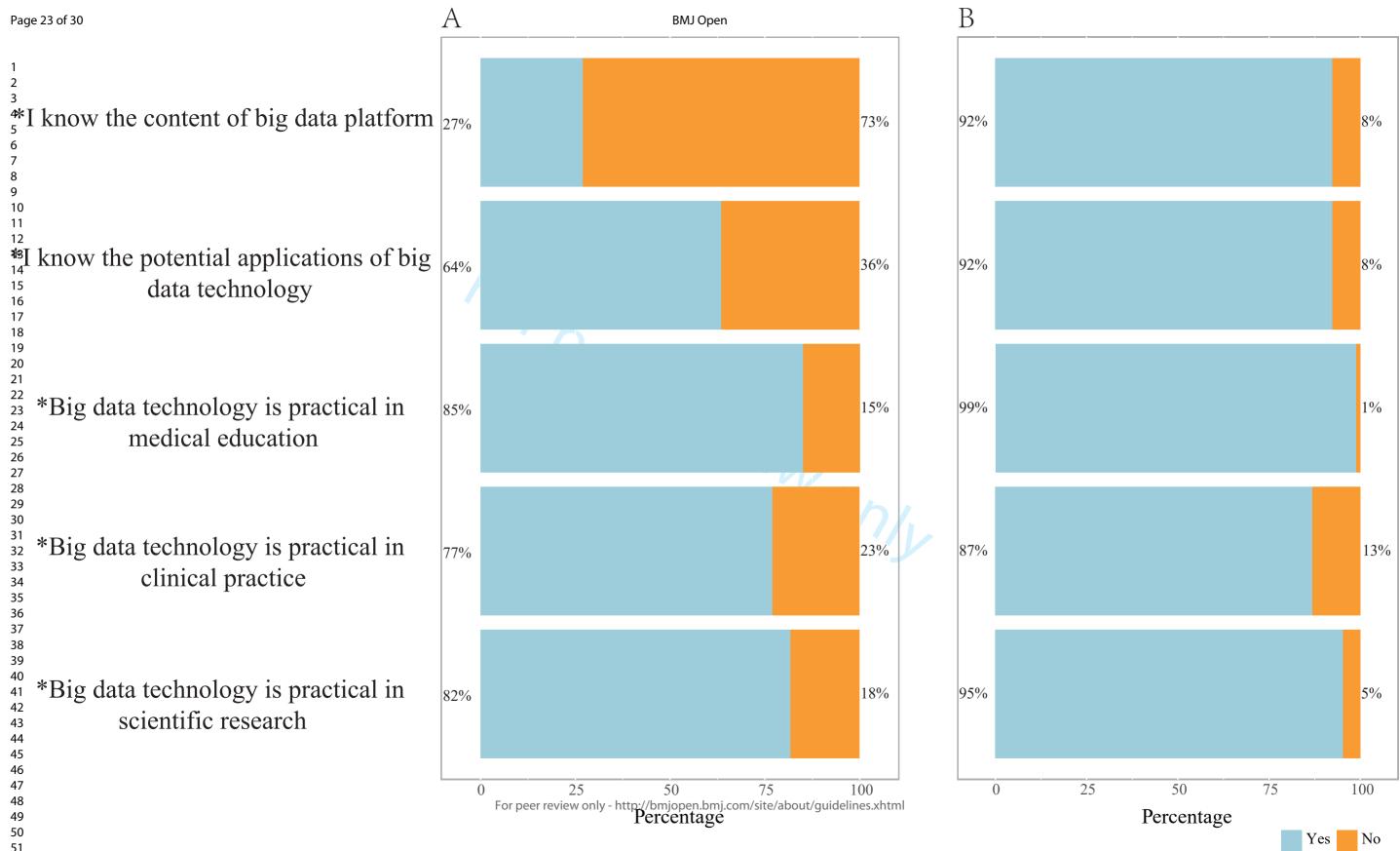
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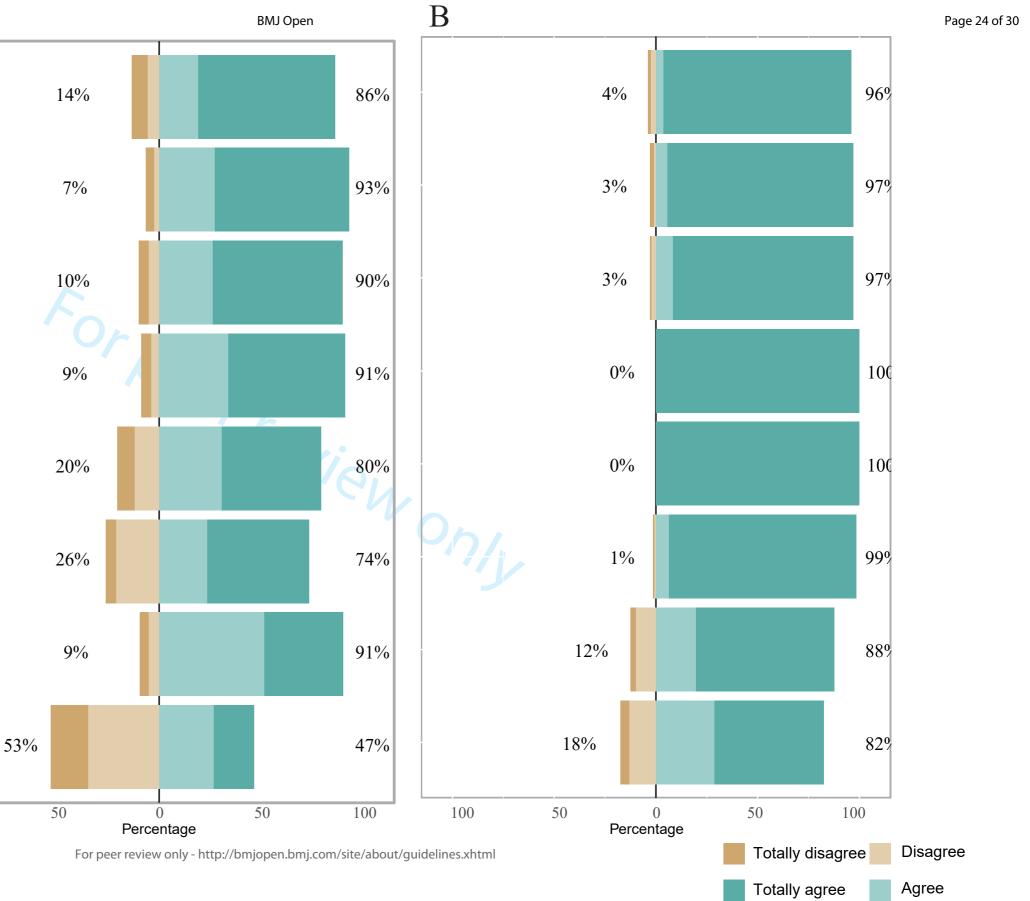
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 484 Figure Legends

Figure 1. Basic knowledge for big data platform (A) before and (B) after the workshop.

- 487 \* means that there is a significant difference before and after the workshop.
- 488 Figure 2. Students' attitude towards big data platform (A) before and (B) after the
- 489 workshop.
- 490 \* means that there is a significant difference before and after the workshop.
- 491 Figure 3. The professionalism for students (A) before and (B) after the workshop.
- \* means that there is a significant difference before and after the workshop.





\*Big data platform could assist future medical education

A

Big data platform could assist future medical reserch

\*Big data platform could assist future clinical practice

\*I am willing to learn how to use big data platform

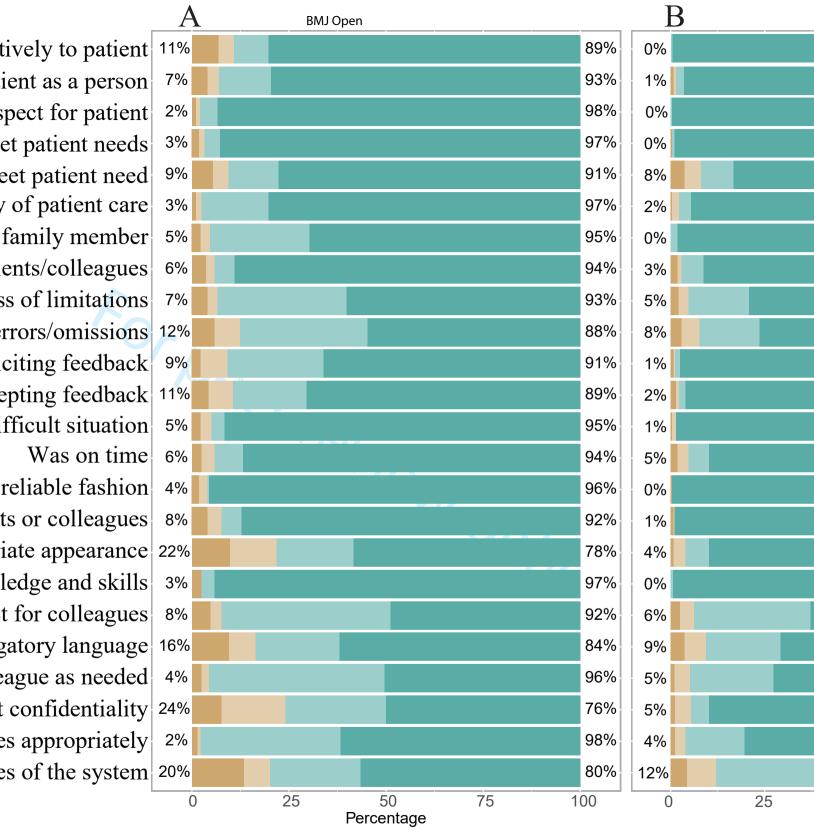
\*I am willing to use big data platform in the future

am willing to recommanded big
 data platform to my colleges

Big data platform could benefit my career

\*Big data platform could benefit all medical careers

E 2



\*Listen actively to patient<sup>11%</sup> \*Show interest in patient as a person \*Show respect for patient <sup>2%</sup> \*Recognize and meet patient needs Accepted inconvenience to meet patient need Ensure continuity of patient care 3% \*Advocate on behalf of a patient and/or family member Maintained appropriate boundaries with patients/colleagues Demonstrating awareness of limitations Admitting errors/omissions 12% \*Soliciting feedback 9% \*Accepting feedback 11% \*Maintaining composure in a difficult situation \*Completing tasks in a reliable fashion \*Being available to patients or colleagues \*Maintaining appropriate appearance 22% \*Addressing own gaps in knowledge and skills Demonstrating respect for colleagues \*Avoiding derogatory language 16% Assisting a colleague as needed \*Maintaining patient confidentiality 24% Using health resources appropriately \*Respecting rules and procedures of the system<sup>20%</sup>

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**F D** 

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Percentage		
Not at all important		Not important
Important		Very important

# Supplemental tables

Table S1, basic knowledge for big data platform before and after the workshop.

	Before Workshop After Work			orkshop	
Items	YES, n	NO, n	YES, n	NO, n	Р
I know the content of big data platform	74	200	253	21	<0.0001
I know the potential applications of big data technology	174	100	253	21	<0.0001
Big data technology is practical in medical education	233	41	271	3	<0.0001
Big data technology is practical in clinical practice	211	63	238	36	0.0039
Big data technology is practical in scientific research	224	50	261	13	<0.0001
C/					

Table S2, students' attitude towards big data platform before and after the workshop.

	Before Workshop				After Workshop								
Items	Totally	Disagree, n	Agree, n	Totally	Mean	SD	Totally	Disagree, n	Agree, n	Totally	Mean	SD	Р
	disagree, n	U /	U ,	agree, n			disagree, n		0	agree, n			
Big data platform could assist	21	16	53	184	3.50	0.910	4	7	10	253	3.87	0.504	0.0002
future medical education													
Big data platform could assist	11	7	75	181	3.55	0.735	5	3	16	250	3.86	0.499	0.0705
future scientific research	11	,	15	101	101 5.55		5	5	10	250	5.80	0.477	0.0700
Big data platform could assist	13	14	72	175	3.49	0.799	2	6	23	243	3.85	0.464	0.0017
future clinical practice	15	14	12	173	5.49	0.799	2	0	23	243	5.85	0.404	0.0017
I am willing to learn how to use	12	11	02	157	2.42	0.792	0	0	0	274	4	0	<0.0001
big data platform	13	11	93	157	3.43	0.783	0	0	0	274	4	0	<0.0001

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I am willing to use big data	23	33	84	134	3.20	0.953	0	0	0	274	4	0	<0.0001
platform in the future	23	55	64	134	5.20	0.933	0	0	0	274	4	0	<0.0001
I am willing to recommended big	14	58	65	137	3.19	0.941	2	2	18	252	3.90	0.388	<0.0001
data platform to my colleagues	14	58	05	137	5.19	0.941	2	2	10	232	3.90	0.388	<0.0001
Big data platform could benefit	12	14	142	106	3.25	0.744	7	27	54	186	3.53	0.776	0.3382
my career	12	14	172	100	5.25	0.744	,	27	7	100	5.55	0.770	0.5562
Big data platform could benefit	50	96	74	54	2.48	1.006	12	36	79	147	3.32	0.863	<0.0001
all medical careers	50	20	/4	54	2.40	1.000	12	50	13	147	5.52	0.005	~0.0001

# SD, Standard Deviation. Table S3, the professionalism for students before and after the workshop.

		Before work	shop			After works	shop		
Items	Not at all	Not important,	Important,	Very important,	Not at all	Not important,	Important,	Very important,	Р
	important, n	n	n	n	important, n	n	n	n	
Doctor-patient relationship skills					571				
Listen actively to patient	19	11	24	220	0	0	1	273	<0.000
Show interest in patient as a person	11	8	37	218	2	2	6	264	0.0029
Show respect for patient	3	3	12	256	0	0	1	273	0.0401
Recognize and meet patient needs	5	4	11	254	1	0	2	271	0.0255
Accepted inconvenience to meet patient need	15	11	35	213	10	12	24	228	0.6503
Ensure continuity of patient care	3 For peer revie	4 w oply - bittp://f	47 miopen hm	220	1 t/guidelines.xhtml	5	9	259	1

Advocate on behalf of a patient and/or family member	6	7	70	191	0	0	5	269	0.0008
Maintained appropriate boundaries with patients/colleagues	10	6	14	244	5	3	16	250	0.1440
Reflective skills				·					
Demonstrating awareness of limitations	11	7	91	165	6	7	44	217	0.459
Admitting errors/omissions	16	18	90	150	8	13	44	209	0.088
Soliciting feedback	6	19	68	181	2	1	4	267	<0.00
Accepting feedback	12	17	52	193	4	2	5	263	0.000
Maintaining composure in a difficult situation	6	8	9	251	1	3	0	270	0.031
Time management			0						
Was on time	7	9	20	238	5	8	15	246	0.702
Completing tasks in a reliable fashion	5	6	1	262	1	0	0	273	0.008
Being available to patients or colleagues	11	10	14	239	2	1	0	271	0.000
Interprofessional relationship skills					$\gamma_{\lambda}$				
Maintaining appropriate appearance	27	33	54	160	2	9	17	246	<0.00
Addressing own gaps in knowledge and skills	7	0	9	258	0	0	2	272	0.022.
Demonstrating respect for colleagues	13	8	119	134	7	10	85	172	0.613
Avoiding derogatory language	26	19	59	170	10	16	54	194	0.022
Assisting a colleague as needed	7	5	124	138	3	11	61	199	0.840

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		-							
Maintaining patient confidentiality	21	45	71	137	3	12	13	246	<0.000 1
Using health resources appropriately	4	2	99	169	3	8	43	220	0.3244
Respecting rules and procedures of the system	37	18	64	155	12	21	72	169	0.0146
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STROBE Statement-checklist of items that should be included in reports of observational studies

	Item No	Recommendation	Pag No
Title and abstract	1	(a) Indicate the study's design with a commonly used term in the title or	1
		the abstract	
		(b) Provide in the abstract an informative and balanced summary of what	2
		was done and what was found	
Introduction			
Background/rationale	2	Explain the scientific background and rationale for the investigation being reported	4
Objectives	3	State specific objectives, including any prespecified hypotheses	4-5
Methods			1
Study design	4	Present key elements of study design early in the paper	5
Setting	5	Describe the setting, locations, and relevant dates, including periods of	5
Setting	2	recruitment, exposure, follow-up, and data collection	
Participants	6	(a) Cohort study—Give the eligibility criteria, and the sources and	5
i urticipunto	0	methods of selection of participants. Describe methods of follow-up	
		<i>Case-control study</i> —Give the eligibility criteria, and the sources and	
		methods of case ascertainment and control selection. Give the rationale	
		for the choice of cases and controls	
		<i>Cross-sectional study</i> —Give the eligibility criteria, and the sources and	
		methods of selection of participants	
		(b) Cohort study—For matched studies, give matching criteria and	NA
		number of exposed and unexposed	
		<i>Case-control study</i> —For matched studies, give matching criteria and the	
		number of controls per case	
Variables	7	Clearly define all outcomes, exposures, predictors, potential confounders,	6-7
		and effect modifiers. Give diagnostic criteria, if applicable	
Data sources/	8*	For each variable of interest, give sources of data and details of methods	6-7
measurement	-	of assessment (measurement). Describe comparability of assessment	
		methods if there is more than one group	
Bias	9	Describe any efforts to address potential sources of bias	NA
Study size	10	Explain how the study size was arrived at	6
Quantitative variables	11	Explain how quantitative variables were handled in the analyses. If	7-8
		applicable, describe which groupings were chosen and why	
Statistical methods	12	( <i>a</i> ) Describe all statistical methods, including those used to control for	7-8
		confounding	
		(b) Describe any methods used to examine subgroups and interactions	NA
		(c) Explain how missing data were addressed	7-8
		(d) Cohort study—If applicable, explain how loss to follow-up was	7-8
		addressed	
		<i>Case-control study</i> —If applicable, explain how matching of cases and	
		controls was addressed	
		<i>Cross-sectional study</i> —If applicable, describe analytical methods taking	
		account of sampling strategy	
		( <u>e</u> ) Describe any sensitivity analyses	NA

Continued on next page

Participants	13*	(a) Report numbers of individuals at each stage of study—eg numbers potentially eligible, examined for eligibility, confirmed eligible, included	8
		in the study, completing follow-up, and analysed (b) Give reasons for non-participation at each stage	All participants were eligible and included
		(c) Consider use of a flow diagram	in this study.
Descriptive data	14*	<ul> <li>(a) Give characteristics of study participants (eg demographic, clinical, social) and information on exposures and potential confounders</li> </ul>	8-9
		(b) Indicate number of participants with missing data for each variable of interest	Very high response rates with no missing data, as shown in supplementar
			data.
		(c) <i>Cohort study</i> —Summarise follow-up time (eg, average and total amount)	NA
Outcome data	15*	<i>Cohort study</i> —Report numbers of outcome events or summary measures over time	NA
		<i>Case-control study</i> —Report numbers in each exposure category, or summary measures of exposure	NA
		Cross-sectional study—Report numbers of outcome events or summary measures	8
Main results	16	( <i>a</i> ) Give unadjusted estimates and, if applicable, confounder-adjusted estimates and their precision (eg, 95% confidence interval). Make clear which confounders were adjusted for and why they were included	In all tables and figures.
		(b) Report category boundaries when continuous variables were	In all tables
		categorized (c) If relevant, consider translating estimates of relative risk into absolute	and figures.
Other analyses	17	risk for a meaningful time period Report other analyses done—eg analyses of subgroups and interactions, and sensitivity analyses	NA
Discussion			1
Key results	18	Summarise key results with reference to study objectives	13
Limitations	19	Discuss limitations of the study, taking into account sources of potential bias or imprecision. Discuss both direction and magnitude of any potential bias	15
Interpretation	20	Give a cautious overall interpretation of results considering objectives, limitations, multiplicity of analyses, results from similar studies, and other relevant evidence	15-16
Generalisability	21	Discuss the generalisability (external validity) of the study results	15-16

Funding 

Give the source of funding and the role of the funders for the present study and, if applicable, for the original study on which the present article is based

\*Give information separately for cases and controls in case-control studies and, if applicable, for exposed and unexposed groups in cohort and cross-sectional studies.

ricle discusse. string. The STROB, dedicine at http://www.epider. store. Note: An Explanation and Elaboration article discusses each checklist item and gives methodological background and published examples of transparent reporting. The STROBE checklist is best used in conjunction with this article (freely available on the Web sites of PLoS Medicine at http://www.plosmedicine.org/, Annals of Internal Medicine at http://www.annals.org/, and Epidemiology at http://www.epidem.com/). Information on the STROBE Initiative is available at www.strobe-statement.org.

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# Oncologic big data platform for promoting digital competencies and professionalism in Chinese medical students

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Date Submitted by the Author:	18-Aug-2022
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<b>Primary Subject Heading</b> :	Medical education and training
Secondary Subject Heading:	Medical education and training
Keywords:	MEDICAL EDUCATION & TRAINING, Gynaecological oncology < GYNAECOLOGY, Gynaecological oncology < ONCOLOGY, Health informatics < BIOTECHNOLOGY & BIOINFORMATICS

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# Oncologic big data platform for promoting digital competencies and professionalism in Chinese medical students

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#### 25 Abstract

Objectives: Advancements in big data technology are reshaping the health care system
in China. This study aims to explore the role of medical big data in promoting digital
competencies and professionalism among Chinese medical students.

Design, setting and participants: This study was conducted among 274 medical students who attended a workshop on medical big data conducted on July 8, 2021 in Tongji Hospital. The workshop was based on the first nationwide multifunction gynecologic oncology medical big data platform in China, at the National Union of Real-World Gynecologic Oncology Research & Patient Management Platform (NUWA platform).

Outcome measures: Data on knowledge, attitudes toward big data technology and professionalism were collected before and after the workshop. We have measured the four skill categories: doctor-patient relationship skills, reflective skills, time management, and interprofessional relationship skills using the Professionalism Mini-Evaluation Exercise (P-MEX) as a reflection for professionalism.

**Results:** A total of 274 students participated in this workshop and completed all the surveys. Before the workshop, only 27% of them knew the detailed content of medical big data platforms, and 64% knew the potential application of medical big data. The majority of the students believed that big data technology is practical in their clinical practice (77%), medical education (85%), and scientific research (82%). Over 80% of the participants showed positive attitudes toward big data platforms. They also exhibited sufficient professionalism before the workshop. Meanwhile, the workshop significantly promoted students' knowledge of medical big data (P < 0.05), and led to more positive attitudes toward big data platforms and higher levels of professionalism. **Conclusions:** Chinese medical students have primitive acquaintance and positive attitudes toward big data technologies. The NUWA platform-based workshop may potentially promote their understanding of big data and enhance professionalism, according to the self-measured P-MEX scale.

53 Keywords: Big data, Chinese medical education, Digital competencies,

54	Professionalism, Workshop
55	
56	Strengths and limitations of this study
57	• This study depicted the knowledge and professionalism of medical big data among
58	Chinese medical students in the era of big data for the first time.
59	• This study provided a vivid example of how big data can assist medical education,
60	based on the first nationwide gynecologic oncology medical big data platform in
61	China (NUWA platform).
62	• The generalization of the findings is limited by the sample representation. The
63	method of measuring attitudes and professionalism may be improved in the future.
64	We need longer time to observe the change of digital competencies and
65	professionalism in Chinese medical students.
66	

#### 67 Background

Electronification of medical records is the signature of the modern health care system.<sup>[1-3]</sup> Massive clinical and omics data have been produced to enable more detailed depictions of patients and diseases. Medical big data is thus reshaping our appreciation of the modern medical system. Technological advancements in data storage, processing, and analysis accelerated the clinical application of big data-driven products and contributed to personalized disease management,<sup>[4, 5]</sup> early diagnosis,<sup>[6-8]</sup> and treatment decision.<sup>[9, 10]</sup> Especially in the COVID-19 pandemic setting, achieving rapid application of medical big data would meet the pressing clinical need to predict the progression of diseases using data characteristics.<sup>[11-13]</sup> 

Big data has brought new challenges for doctors.<sup>[14]</sup> Information overload is a challenge for every healthcare worker, since they have to acclimate to the nature of big data, including extraordinary value, volume, velocity, variety, and variability.<sup>[15]</sup> Challenges can also be expected regarding medical professionalism in the age of big data. Because big data values realistic health-related information more than ever, the illusion that digital data outweigh face-to-face physician-patient interactions may motivate doctors to ignore the importance of professionalism.<sup>[16, 17]</sup> There is no precise definition of medical professionalism, which is reflected in the attitudes and behaviors directly related to clinical practice. Epstein RM et al. proposed the definition of professional competence as wisely using communication, knowledge, technical skills, clinical reasoning, emotions, values, and reflection in daily practice.<sup>[18]</sup> And Cain J et al. summarized professionalism as a series of attributes, such as altruism, respect, honesty, and so on.<sup>[19]</sup> Some studies have shown that digital medical education based on big data plays a positive effect in promoting professionalism.<sup>[16, 20, 21]</sup> However, there is a lack of research on the attitude and professionalism of Chinese healthcare workers regarding medical big data. Therefore, extra lectures and workshops about obtaining insights into big data and remaining respectful to patients are necessary. 

94 In this study, we aimed at depicting the knowledge of medical big data and95 professionalism in the era of big data among Chinese medical students. What's more,

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we conducted a workshop for Chinese clinical and preclinical students to improve their
knowledge of medical big data and their professionalism in the big data era, based on
the National Union of Real-World Gynecologic Oncology Research & Patient
Management Platform (NUWA platform), which is the first nationwide multifunction
gynecologic oncology medical big data platform in China.

102 Methods

# 103 Study design

A workshop on the introduction of medical big data was conducted among clinical and preclinical students in Tongji Medical School. We conducted this study on Chinese medical students' learning and the application of big data in healthcare using pre- and post-course questionnaires.

# 109 Workshop design

The workshop was conducted on July 8, 2021 in Tongji Hospital, Tongji Medical
School, Huazhong University of Science and Technology, Wuhan, China. It was part
of the series class of "Medical big data platform learning and applying".

The workshop was delivered by two senior doctors (QLG and SQZ), who have over 5 years of experience in medical big data platform development and application. The workshop consisted of three major parts, (i) a lecture on the content and application of medical big data; (ii) a lecture on professionalism for doctors in the big data era; and (iii) learners being allowed to explore the NUWA platform freely according to their interest. The first and second sections lasted for approximately 45 minutes, and the third section lasted for 30 minutes.

In section one, five major parts were included in lectures given by the senior doctors,
(i) the development of medical big data in China and the world, (ii) the application and
potential of big data in clinical practice, medical education, and scientific research, (iii)
the construction and content of the NUWA platform, (iv) how to use the NUWA

platform, and (v) plans for the NUWA platform development. For the second section, the following four items were discussed: (i) the attitude health care workers should have when communicating with patients and colleagues considering that big data have already reshaped our medical system, (ii) the importance of detailed and continuous patient information for the development of big data platforms, (iii) how to protect patient privacy on the databases, and (iv) how to use the NUWA platform to satisfy patients' needs. For Section 3, all students were given a temporary account for the NUWA platform and have access to all deidentified patient information. They were allowed to explore the medical data freely and view structured health care information for half an hour. 

# 135 Data collection

Clinical and preclinical students in Tongji Medical School were invited to attend a 2-hour class by email or roadshows between June 8, 2021, and July 7, 2021. The contents and speakers for the workshop were presented in the email or during the roadshow. In addition, all 5th- (n=50, preclinical) and 6th-grade (n=49, clinical) students of 8-year undergraduate education in Tongji Medical School took part in this workshop as an additional course.

The participants completed two surveys, one before the workshop and the other after the workshop. Both questionnaires contain their basic knowledge and attitude toward big data technology and a Professionalism Mini-Evaluation Exercise (P-MEX) instrument. The P-MEX is developed from the mini-Clinical Examination Exercise (mini-CEX) format by Cruess R et al. in 2006 to evaluate professionalism in clinical training.<sup>[22]</sup> It consists of 24 items representing four skill categories: doctor-patient relationship skills, reflective skills, time management, and interprofessional relationship skills skills.<sup>[23, 24]</sup> And the reliability and validity of P-MEX have been confirmed in both Eastern and Western cultural backgrounds.<sup>[25-27]</sup> The attitude scale is a self-created scale focused on measuring participants' pedagogic evaluation, acceptance and expectation of the big data platform. It consisted of 8 questions: (i) Big 

data platform could assist future medical education, (ii) Big data platform could assist future medical research, (iii)Big data platform could assist future clinical practice, (iv) I am willing to learn how to use big data platform, (v) I am willing to use big data platform in the future, (vi) I am willing to recommend big data platform to my colleagues, (vii) Big data platform could benefit my career, and (viii) Big data platform could benefit all medical careers. For each question, students chose from "totally agree", "agree", "disagree", and "totally disagree". For the applicability of conclusions, "totally agree" and "agree" were regarded as "positive attitude", and "disagree" and "totally disagree" were considered as "negative attitude". In addition, the first survey also contained students' baseline information, and the second survey contained a satisfaction questionnaire. Meanwhile, the browsing histories for participants in Section 3 were also recorded and analyzed to reflect students' interest.

The data collection and analysis plan were acknowledged and agreed upon by all participants at the beginning of the workshop, and the study was approved by the Research Ethics Commission of Tongji Hospital of Huazhong University of Science and Technology (2020-S201).

#### NUWA platform

The NUWA platform is the first nationwide Gynecological Oncology data-sharing platform launched by the National Clinical Research Center for Gynecological Oncology in August 2019. This platform integrated inpatient/outpatient clinical data, genomic data, and follow-up data to develop a patient-level longitudinal clinico-genomic database. Information was deidentified and extracted from electronic medical records. A rigorous data quality check was performed to ensure the accuracy of the data entries. Since its foundation in 2019, 17 first-class hospitals from different provinces or cities in China have participated in the NUWA platform until August 2021. 

#### Statistical analysis

Descriptive statistics were presented by counts and percentages to describe the

demographic information. The Chi-square test was used to compare the changes in knowledge and understanding of big data and professionalism before and after the workshop. To acquire more practical results, the categories "not at all important" and "not important" were combined for the analysis, as well as "important" and "very important". *P values <0.05* were considered statistically significant. The data were analyzed using R Version 4.03.

# 189 Patient and Public Involvement

190 No patients or members of the public were involved in this study.

**Results** 

193 Characteristics of students

A total of 274 students participated in this workshop and completed two surveys. All
of them were included in the final analysis. Participants were aged between 22 and 28,
with 148 (54.0%) preclinical students and 126 (46.0%) clinical students. Among them,
130 (47.4%) were males and 144 (52.4%) were females (**Table 1**).

The majority of participants (207, 75.5%) knew of at least one big data platform in China or the world. Over two-thirds of them (183, 66.8%) also acknowledged its application. However, only 17.2% (47) of them had been involved in any project related to medical big data (**Table 1**).

# 203 Table 1. Baseline characteristics for participants.

Characteristics	Number of participants, n (%)
Age, years	
22	27 (9.9%)
23	16 (5.8%)
24	67 (24.5%)
25	66 (24.1%)
26	50 (18.2%)

	27	28 (10.2%)
	28	20 (7.3%)
Gender		
	male	130 (47.4%)
	female	144 (52.6%)
Study stage		
	pre-clinical	148 (54.0%)
	clinical	126 (46.0%)
Acknowledg	ment of any kind of big	
data platform	n	
	yes	207 (75.5%)
	no	67 (24.5%)
Know the a	applications of big data	
technology		
	yes	183 (66.8%)
	no	91 (33.2%)
Involved in	any big data-related	Ċ,
projects		
	yes	47 (17.2%)
	no	227 (82.8%)
Total		274 (100%)

#### Knowledge of big data platforms

Before the workshop, approximately a quarter of the students (74, 27%) knew detailed content of at least one medical big data platform, while nearly 64% (174) knew the potential application of medical big data platforms. After attending the lessons, almost all students could understand the content (253, 92%) and the potential application (253, 92%) of medical big data (Figure 1 and Table S1). 

Regardless of the survey completed (pre- or post-course), the majority of students 212 believed that big data technology is practical in medical education, clinical practice,

and scientific research (85%, 77%, 82% before the workshop; 99%, 87%, 95% after the

# 216 Students' attitudes toward big data platforms

workshop, respectively) (Figure 1 and Table S1).

Even before the workshop, most students hold a positive attitude on the potential of the big data platform in promoting medical education (237, 86%), medical research (256, 93%), and clinical practices (247, 90%). They were also willing to learn about and use the big data platform (250, 91%, and 218, 80% respectively). Of them, 74% (202) were enthusiastic to introduce big data platforms to their colleagues. Interestingly, most students were convinced that the big data platform could benefit their careers (248, 91%), but they were not sure if it would yield the same effect on the others (128, 47%) (Figure 2 and Table S2). 

When the workshop was completed, almost all students had positive attitudes toward the big data platform (**Figure 2 and Table S2**). However, there were still 12% (34) and 18% (48) of students who were not sure if the big data platform could benefit their and others' medical careers, respectively.

# 230 Professionalism

Generally, positive attitudes toward all the professionalism items were demonstrated, with more than three-quarters of the students agreeing that all professionalism attributes were "important" or "very important" before the workshop. The three items that most students thought were "not at all important" or "not important" were maintaining patient confidentiality (66, 24% of students chose "not important" or "not at all important"), maintaining appropriate appearance (60, 22% students chose "not important" or "not at all important") and respecting rules and procedures of the system (55, 20% students chose "not important" or "not at all important") (Figure 3A and Table S3).

240 After the lectures, students exhibited a more positive attitude on most

professionalism items (p<0.05). The most significant improvements occurred for</li>
"Maintaining patient confidentiality" (from 76% to 95%), "Listen actively to patient"
(from 89% to 100%), and "Accepting feedback" (from 89% to 98%) (Figure 3B and
Table S3).

246 Interest in medical data

In the free exploration section, most students (253, 92.3%) viewed the patients' hospitalization logs. A total of 76.3% (209) of students were interested in the patients' history of illness. Meanwhile, many students were interested in medicine usages (56.2%), surgery reports (52.9%), and diseases of rare pathologies (58.6%). Only approximately one-third of students viewed image diagnosis (37.6%) and follow-up records (32.5%) (**Table 2**).

**Table 2. Browser records in the free-exploration section.** 

Number of participants, n (%)
Ľ,
209 (76.3%)
65 (23.7%)
253 (92.3%)
21 (7.7%)
154 (56.2%)
120 (43.8%)
145 (52.9%)
129 (47.1%)
103 (37.6%)

no	171 (62.4%)
Follow-up records	
yes	89 (32.5%)
no	185 (67.5%)
Rare pathologies	
yes	160 (58.4%)
no	114 (41.6%)
Total	274 (100%)
Total	274 (100%)

# 256 Satisfactory survey

Upon completing the survey, 95.6% (262) of participants were "satisfied" or "extremely satisfied" with this workshop, and only 7 out of 274 students were not at all satisfied. However, we failed to obtain feedback from them in the next three months. Most students thought that the workshop was informative (249, 90.9%) and understandable (255, 94.1%). The majority of students were also willing to recommend this seminar to other students (257, 93.8%) and to participate in similar classes in the future (254, 92.7%). Regarding the duration of this workshop, only 7 (2.6%) students thought that 2 hours was too long (Table 3).

# 266 Table 3. Participants 'answers to the workshop satisfaction survey

	Not at all,	No,			Mean	SD
	n (%)	n (%)			Mean	50
Overall, are you satisfied with this course	7 (2.6%)	5 (1.8%)	57 (20.8%)	205 (74.8%)	3.68	0.640
Did you think the course are informative?	10 (3.6%)	15 (5.5%)	101 (36.9%)	148 (54%)	3.41	0.757
Did you think the duration of this courses is too long	121 (44.2%)	118 (43.1%)	28 (10.2%)	7 (2.6%)	2.07	0.954

Was the course	11 (40/)	8 (2 00/)	121 (44 20/)	124 (49,00/)	2.20	0.722
understandable for you	11 (4%)	8 (2.9%)	121 (44.2%)	134 (48.9%)	3.38	0.733
Would you recommend						
these courses to other	6 (2.2%)	11 (4%)	144 (52.6%)	113 (41.2%)	3.33	0.659
students?						
Are you willing to take						
part in similar courses in	6 (2.2%)	14 (5.1%)	35 (12.8%)	219 (79.9%)	3.70	0.666
the future?						

- 267 SD, Standard Deviation.

# **Discussion**

Our study demonstrated that Chinese medical students have little knowledge of and positive attitudes toward big data technologies. They also yield expertise in professionalism. Furthermore, workshops based on big data platforms could further strengthen their digital competencies and improve doctor-patient communication capabilities, which would lead to better fitness during the expansion of medical big data.

In this workshop, the basic knowledge of big data platforms in China was measured. Although a large fraction of students knew about the big data platform and its utility, only a few of them could apprehend its composition or how to use it. This situation may be caused by the recent rapid development of big data technology in China and comparatively lagging relevant education.<sup>[28, 29]</sup> In addition, ethical challenges that hinder medical and public health data sharing may have also exacerbated the situation.<sup>[30]</sup> Therefore, aside from conducting big data-related workshops, promoting medical and public health data sharing policies and evolving relevant legal and ethical implications are also of great importance. 

Students' enthusiasm toward medical big data was also taken into consideration. As
expected and consistent with previous reports,<sup>[25]</sup> the majority of students exhibited
positive attitudes toward the big data platform and were willing to acquire further

proficiency. They believed that big data would play a vital role in future medical education, clinical practice, and scientific research, which are the main tasks for all Chinese doctors. However, not all of them believed that big data could benefit all medical careers. The popularity of information technology of China recently may contribute to the big data-friendly intention in medical students.<sup>[31]</sup> Meanwhile, their limited understanding of related fields may hamper the belief that it could be used productively.<sup>[32-34]</sup> In the meantime, we were delighted to see that almost all students recognized the significance of big data after our workshop. We thus believe that proper education may be an efficient way to diminish misunderstandings and to achieve full potential in big data platforms. 

Professionalism was related to the development of big data in our study for the first time in China. Considering that big data can reshape medical activities in all aspects, including doctors' attitudes toward their colleagues and patients,<sup>[35]</sup> a lecture about "professionalism in the age of big data" was presented in the current workshop. Before the seminar, students demonstrated sufficient professionalism similar to the findings of previous reports, with high scores on the majority of these items. Nevertheless, it is worth noting that nearly 1/4 of the participants did not pay enough attention to maintaining patient confidentiality. Protecting patients' privacy is an essential embodiment of medical ethics and humanities.<sup>[36]</sup> Participants mostly answered these questions from the perspective of big data users before our workshop, ignoring that those data represented thousands of actual patients. After we emphasized the importance of data privacy in the workshop, students realized that respect for patients is the foundation for improving their medical professionalism. Meanwhile, to enhance patient-data privacy protection, the privacy information, such as ID number, was privatized and converted into an alternative ID number using a hashing algorithm before being uploaded to the NUWA platform. Therefore, personal information of all included patients in NUWA platform is confidential and unreachable for all users. Several important professionalism levels were also significantly increased in many other elements after the workshop, indicating that this workshop could be a preliminary

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attempt to promote professionalism when the prominence of digital data has changed the way we communicate and when doctors have to spend more time with electronic records than with patients. These changes our workshop brought deserve more attention in China since Chinese doctors are well-known to be overburdened.<sup>[37, 38]</sup> These improvements could also help increase the reliability of medical records and produce convincing and effective medical information.

Another interesting fact in the results is that approximately 60% of students noticed rare diseases in the free-exploration section, which is hardly involved in routine medical classes.<sup>[39, 40]</sup> We believe this is another strength of big data-based medical education. In traditional medical classes, it is arduous for teachers to grant detailed depictions for every type of rare disease. As a result, students may not have easy access to these exceptional cases and therefore are often not able to diagnose rare diseases when reviewing patients' medical records. The big data platform makes it possible for every user to conveniently browse through cases with rare pathologies, which would benefit patients as well as reduce misdiagnoses. 

Our workshop had some limitations. The most important one is that the NUWA platform is still under development, and the omics data are not currently included. Therefore, another investigation should be conducted when the construction of NUWA has been completed. Meanwhile, we did not calculate the sample size before the conduction of this study, which may lead to potential bias. And the limited sample size may be another reason that restricts the popularization of our conclusion. Furthermore, narrow geographical distributions of study participants interfered with the generalization of results to other populations. Meanwhile, there are concerns that students who volunteered to participate in the workshop may be more enthusiastic about big data technology than those who did not. We thus included all 5th-(preclinical) and 6th-grade (clinical) students of 8-year undergraduate education in Tongji Medical School to make the study sample more representative. As for the measurement of attitudes and professionalism, a qualitative approach would have been more appropriate and should be considered in the future. Meanwhile, this workshop is too short to

produce fundamental improvements in students' attitudes and professionalism. In the 

future, more long-term studies are wanted to draw a clear conclusion.

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#### Conclusion

This study depicted Chinese students' knowledge of medical big data for the first time and the NUWA platform-based workshop had potential to improve their understanding of big data and enhance professionalism.

#### List of abbreviations

P-MEX, Professionalism Mini-Evaluation Exercise instrument. NUWA platform, the National Union of Real-World Gynecologic Oncology Research & Patient Management Platform.

#### **Contributorship**

QLG, JHL and XFJ designed the study and survey. QLG, JHL, XFJ, ML, ZKP, YBH and SQZ conducted the workshop. PJ, HYL, JHC, XYL, YY, and SQZ analyzed and interpreted the data. YJZ and GCM performed interpretation of data and discussion of findings. QLG conceptualized and designed the study, supervised the project, analyzed and interpreted the data, and wrote the paper. All authors approved the final version of the manuscript and agreed to the submission of this manuscript.

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#### **Competing of interests**

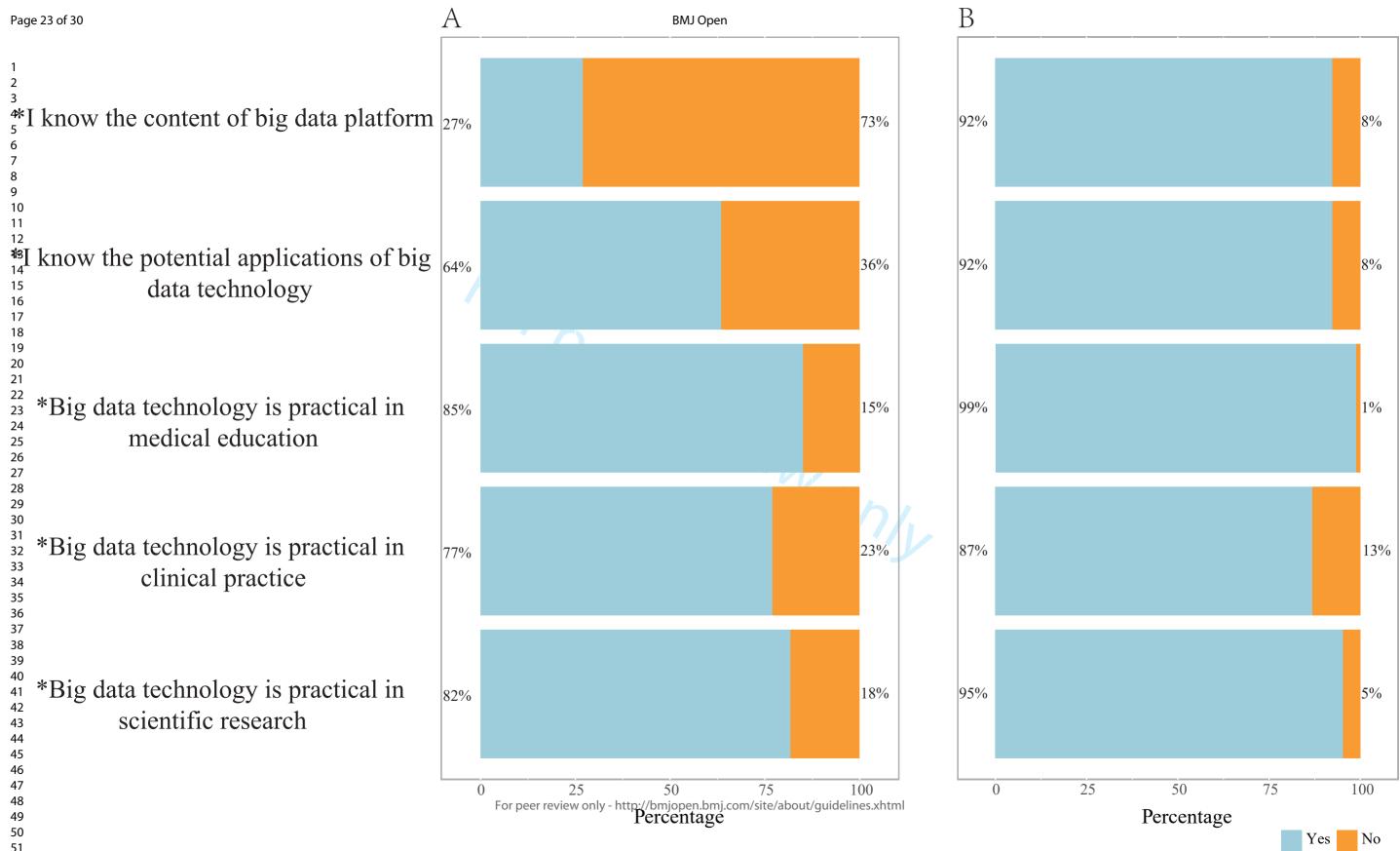
2			
3 4	375	The authors declare that they have no competing interests.	
5 6	376		
7 8	377	Ethics approval	
9 10	378	The data collection and analysis plan were acknowledged and agreed by all participants	5
11 12	379	and the study has been approved by the Research Ethics Commission of Tongji Hospita	1
13 14	380	of Huazhong University of Science and Technology (2020-S201).	
15 16	381		
17 18	382	Data sharing	
19 20	383	The data used in the current study are available from the corresponding author or	1
21 22	384	reasonable request via e-mail ( <u>qingleigao@hotmail.com</u> ).	
23 24	385		
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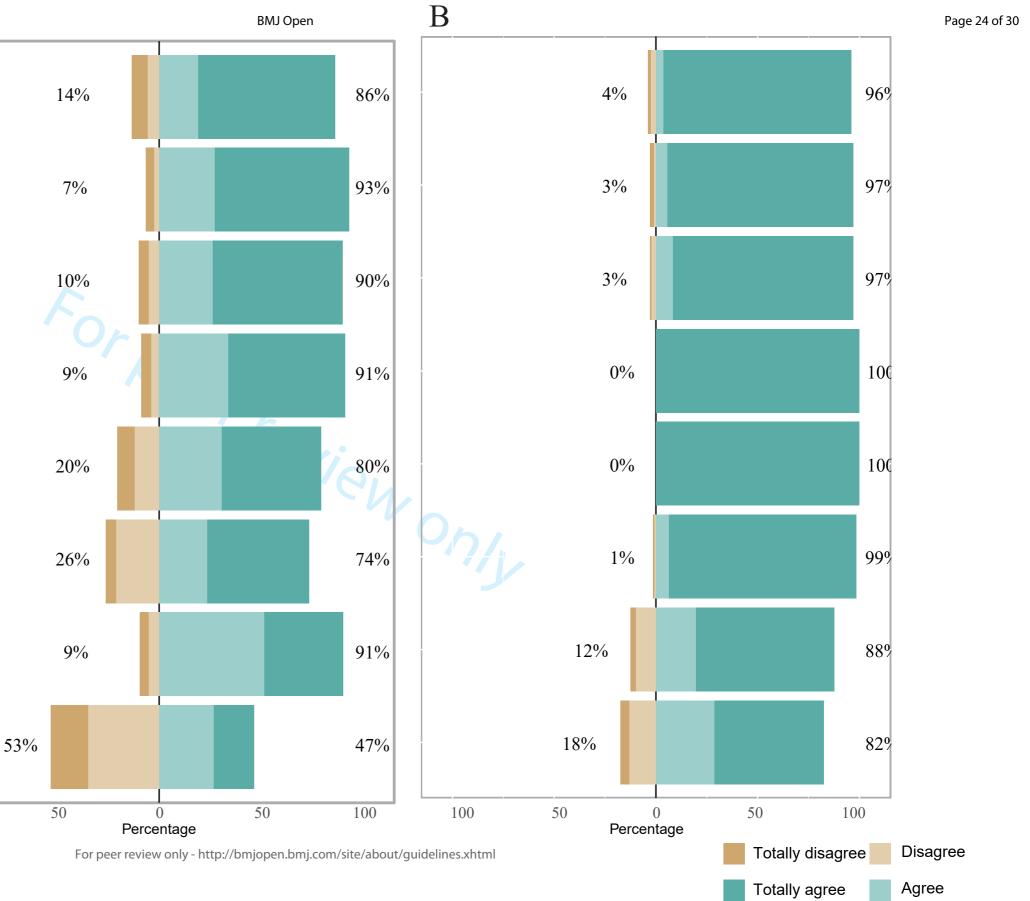
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489 Figure 1. Basic knowledge for big data platform (A) before and (B) after the490 workshop.

- 491 \* means that there is a significant difference before and after the workshop.
- 492 Figure 2. Students' attitude towards big data platform (A) before and (B) after the
- 493 workshop.
- 494 \* means that there is a significant difference before and after the workshop.
- 495 Figure 3. The professionalism for students (A) before and (B) after the workshop.
- \* means that there is a significant difference before and after the workshop.





\*Big data platform could assist future medical education

A

Big data platform could assist future medical reserch

\*Big data platform could assist future clinical practice

\*I am willing to learn how to use big data platform

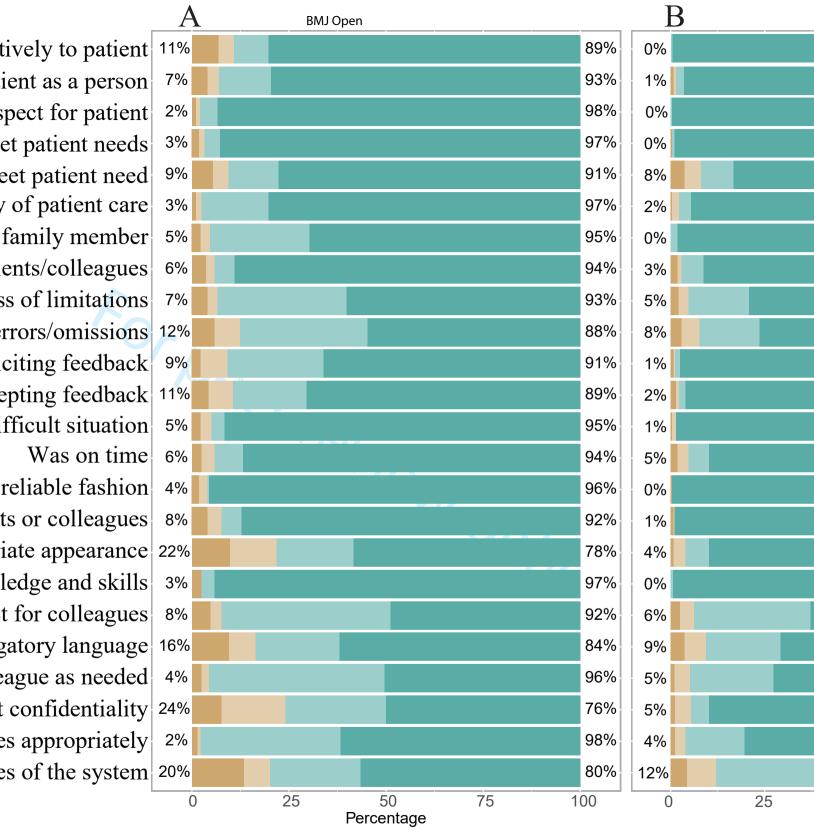
\*I am willing to use big data platform in the future

am willing to recommanded big
 data platform to my colleges

Big data platform could benefit my career

\*Big data platform could benefit all medical careers

E 2



\*Listen actively to patient<sup>11%</sup> \*Show interest in patient as a person \*Show respect for patient <sup>2%</sup> \*Recognize and meet patient needs Accepted inconvenience to meet patient need Ensure continuity of patient care 3% \*Advocate on behalf of a patient and/or family member Maintained appropriate boundaries with patients/colleagues Demonstrating awareness of limitations Admitting errors/omissions 12% \*Soliciting feedback 9% \*Accepting feedback 11% \*Maintaining composure in a difficult situation \*Completing tasks in a reliable fashion \*Being available to patients or colleagues \*Maintaining appropriate appearance 22% \*Addressing own gaps in knowledge and skills Demonstrating respect for colleagues \*Avoiding derogatory language 16% Assisting a colleague as needed \*Maintaining patient confidentiality 24% Using health resources appropriately \*Respecting rules and procedures of the system<sup>20%</sup>

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**F D** 

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50	75	5 100
Percentage		
Not at all important		Not important
Important		Very important

# Supplemental tables

Table S1, basic knowledge for big data platform before and after the workshop.

	Before Workshop		After Wo		
Items	YES, n	NO, n	YES, n	NO, n	Р
I know the content of big data platform	74	200	253	21	<0.0001
I know the potential applications of big data technology	174	100	253	21	<0.0001
Big data technology is practical in medical education	233	41	271	3	<0.0001
Big data technology is practical in clinical practice	211	63	238	36	0.0039
Big data technology is practical in scientific research	224	50	261	13	<0.0001

Table S2, students' attitude towards big data platform before and after the workshop.

	Before Workshop						After Workshop					
Totally	Disagree, n	Agree, n	Totally	Mean	SD	Totally	Disagree, n	Agree, n	Totally	Mean	SD	Р
disagree, n	8,	6,	agree, n			disagree, n		6,	agree, n			
21	16	53	184	3.50	0.910	4	7	10	253	3.87	0.504	0.0002
							_					
11	7	75	181	3.55	0.735	5	3	16	250	3.86	0.499	0.0705
13	14	72	175	3 49	0 799	2	6	23	243	3 85	0 464	0.0017
15	11	12	175	5.17	0.799	2	0	23	215	5.05	0.101	0.0017
13	_								274	4	0	<0.0001
	lisagree, n 21	Disagree, n       21     16       11     7       13     14       13     11	Disagree, n         Agree, n           21         16         53           11         7         75           13         14         72           13         11         93	Disagree, n     Agree, n     agree, n       21     16     53     184       11     7     75     181       13     14     72     175       13     11     93     157	Disagree, n         Agree, n         Agree, n         Mean           21         16         53         184         3.50           11         7         75         181         3.55           13         14         72         175         3.49           13         11         93         157         3.43	Disagree, n     Agree, n     Mean     SD       21     16     53     184     3.50     0.910       11     7     75     181     3.55     0.735       13     14     72     175     3.49     0.799       13     11     93     157     3.43     0.783	Disagree, n       Agree, n       agree, n       Mean       SD       disagree, n         21       16       53       184       3.50       0.910       4         11       7       75       181       3.55       0.735       5         13       14       72       175       3.49       0.799       2         13       11       93       157       3.43       0.783       0	Disagree, n       Agree, n       Agree, n       Mean       SD       Disagree, n       Disagree, n         21       16       53       184       3.50       0.910       4       7         11       7       75       181       3.55       0.735       5       3         13       14       72       175       3.49       0.799       2       6         13       11       93       157       3.43       0.783       0       0	Disagree, n       Agree, n       Agree, n       Mean       SD       Disagree, n       Disagree, n       Agree, n         21       16       53       184       3.50       0.910       4       7       10         11       7       75       181       3.55       0.735       5       3       16         13       14       72       175       3.49       0.799       2       6       23	Disagree, n       Agree, n       Agree, n       Mean       SD       Disagree, n       Disagree, n       Agree, n       agree, n       agree, n         21       16       53       184       3.50       0.910       4       7       10       253         11       7       75       181       3.55       0.735       5       3       16       250         13       14       72       175       3.49       0.799       2       6       23       243         13       11       93       157       3.43       0.783       0       0       0       274	Disagree, n         Agree, n         Agree, n         Mean         SD         disagree, n         Disagree, n         Agree, n         Agree, n         Mean         agree, n           21         16         53         184         3.50         0.910         4         7         10         253         3.87           11         7         75         181         3.55         0.735         5         3         16         250         3.86           13         14         72         175         3.49         0.799         2         6         23         243         3.85           13         11         93         157         3.43         0.783         0         0         0         0         274         4	Disagree, n       Disagree, n       Agree, n       Agree, n       Agree, n       Agree, n       Agree, n       Mean       SD         21       16       53       184       3.50       0.910       4       7       10       253       3.87       0.504         11       7       75       181       3.55       0.735       5       3       16       250       3.86       0.499         13       14       72       175       3.49       0.799       2       6       23       243       3.85       0.464         13       11       93       157       3.43       0.783       0       0       0       274       4       0

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I am willing to use big data	23	33	84	134	3.20	0.953	0	0	0	274	4	0	<0.0001
platform in the future	23	55	64	134	5.20	0.933	0	0	0	274	4	U	<0.0001
I am willing to recommended big	14	58	65	137	3.19	0.941	2	2	18	252	3.90	0.388	<0.0001
data platform to my colleagues	14	38	05	157	5.19	0.941	2	2	10	232	5.90	0.388	<0.0001
Big data platform could benefit	12	14	142	106	3.25	0.744	7	27	54	186	3.53	0.776	0.3382
my career	12	14	172	100	5.25	0.744	/	27	57	180	5.55	0.770	0.5582
Big data platform could benefit	50	96	74	54	2.48	1.006	12	36	79	147	3.32	0.863	<0.0001
all medical careers	50	20	/4	54	2.40	1.000	12	50	13	147	5.52	0.005	~0.0001

# SD, Standard Deviation. Table S3, the professionalism for students before and after the workshop.

		Before workshop			After workshop					
Items	Not at all	Not important,	Important,	Very important,	Not at all	Not important,	Important,	Very important,	Р	
	important, n	n	n	n	important, n	n	n	n		
Doctor-patient relationship skills					571					
Listen actively to patient	19	11	24	220	0	0	1	273	<0.000	
Show interest in patient as a person	11	8	37	218	2	2	6	264	0.0029	
Show respect for patient	3	3	12	256	0	0	1	273	0.0401	
Recognize and meet patient needs	5	4	11	254	1	0	2	271	0.0255	
Accepted inconvenience to meet patient need	15	11	35	213	10	12	24	228	0.6503	
Ensure continuity of patient care	3 For peer revie	4 w oply - bittp://f	47 miopen hm	220	1 t/guidelines.xhtml	5	9	259	1	

Advocate on behalf of a patient and/or family member	6	7	70	191	0	0	5	269	0.0008
Maintained appropriate boundaries with patients/colleagues	10	6	14	244	5	3	16	250	0.1440
Reflective skills				·					
Demonstrating awareness of limitations	11	7	91	165	6	7	44	217	0.459
Admitting errors/omissions	16	18	90	150	8	13	44	209	0.088
Soliciting feedback	6	19	68	181	2	1	4	267	<0.00
Accepting feedback	12	17	52	193	4	2	5	263	0.000
Maintaining composure in a difficult situation	6	8	9	251	1	3	0	270	0.031
Time management			0						
Was on time	7	9	20	238	5	8	15	246	0.702
Completing tasks in a reliable fashion	5	6	1	262	1	0	0	273	0.008
Being available to patients or colleagues	11	10	14	239	2	1	0	271	0.000
Interprofessional relationship skills					$\gamma_{\lambda}$				
Maintaining appropriate appearance	27	33	54	160	2	9	17	246	<0.00
Addressing own gaps in knowledge and skills	7	0	9	258	0	0	2	272	0.022.
Demonstrating respect for colleagues	13	8	119	134	7	10	85	172	0.613
Avoiding derogatory language	26	19	59	170	10	16	54	194	0.022
Assisting a colleague as needed	7	5	124	138	3	11	61	199	0.840

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		-							
Maintaining patient confidentiality	21	45	71	137	3	12	13	246	<0.000 1
Using health resources appropriately	4	2	99	169	169 3		43	220	0.3244
Respecting rules and procedures of the system	37	18	64	155	12	21	72	169	0.0146
	-				•				

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STROBE Statement-checklist of items that should be included in reports of observational studies

	Item No	Recommendation	Pag No
Title and abstract	1	(a) Indicate the study's design with a commonly used term in the title or	1
		the abstract	
		(b) Provide in the abstract an informative and balanced summary of what	2
		was done and what was found	
Introduction			
Background/rationale	2	Explain the scientific background and rationale for the investigation being reported	4
Objectives	3	State specific objectives, including any prespecified hypotheses	4-5
Methods			1
Study design	4	Present key elements of study design early in the paper	5
Setting	5	Describe the setting, locations, and relevant dates, including periods of	5
Setting	2	recruitment, exposure, follow-up, and data collection	
Participants	6	(a) Cohort study—Give the eligibility criteria, and the sources and	5
i urticipunto	0	methods of selection of participants. Describe methods of follow-up	
		<i>Case-control study</i> —Give the eligibility criteria, and the sources and	
		methods of case ascertainment and control selection. Give the rationale	
		for the choice of cases and controls	
		<i>Cross-sectional study</i> —Give the eligibility criteria, and the sources and	
		methods of selection of participants	
		(b) Cohort study—For matched studies, give matching criteria and	NA
		number of exposed and unexposed	
		<i>Case-control study</i> —For matched studies, give matching criteria and the	
		number of controls per case	
Variables	7	Clearly define all outcomes, exposures, predictors, potential confounders,	6-7
		and effect modifiers. Give diagnostic criteria, if applicable	
Data sources/	8*	For each variable of interest, give sources of data and details of methods	6-7
measurement	-	of assessment (measurement). Describe comparability of assessment	
		methods if there is more than one group	
Bias	9	Describe any efforts to address potential sources of bias	NA
Study size	10	Explain how the study size was arrived at	6
Quantitative variables	11	Explain how quantitative variables were handled in the analyses. If	7-8
		applicable, describe which groupings were chosen and why	
Statistical methods	12	( <i>a</i> ) Describe all statistical methods, including those used to control for	7-8
		confounding	
		(b) Describe any methods used to examine subgroups and interactions	NA
		(c) Explain how missing data were addressed	7-8
		(d) Cohort study—If applicable, explain how loss to follow-up was	7-8
		addressed	
		<i>Case-control study</i> —If applicable, explain how matching of cases and	
		controls was addressed	
		<i>Cross-sectional study</i> —If applicable, describe analytical methods taking	
		account of sampling strategy	
		( <u>e</u> ) Describe any sensitivity analyses	NA

Continued on next page

Participants	13*	(a) Report numbers of individuals at each stage of study—eg numbers potentially eligible, examined for eligibility, confirmed eligible, included	8
		in the study, completing follow-up, and analysed	
		(b) Give reasons for non-participation at each stage	All
			participants
			were eligible
			and included
			in this study.
		(c) Consider use of a flow diagram	NA
Descriptive	14*	(a) Give characteristics of study participants (eg demographic, clinical,	8-9
data		social) and information on exposures and potential confounders	
		(b) Indicate number of participants with missing data for each variable of	Very high
		interest	response rates
			with no
			missing data,
			as shown in
			supplementary
			data.
		(c) Cohort study—Summarise follow-up time (eg, average and total	NA
		amount)	
Outcome data	15*	Cohort study—Report numbers of outcome events or summary measures	NA
		over time	
		Case-control study—Report numbers in each exposure category, or	NA
		summary measures of exposure	
		Cross-sectional study—Report numbers of outcome events or summary	8
		measures	-
Main results	16	( <i>a</i> ) Give unadjusted estimates and, if applicable, confounder-adjusted	In all tables
		estimates and their precision (eg, 95% confidence interval). Make clear	and figures.
		which confounders were adjusted for and why they were included	T 11 / 1 1
		(b) Report category boundaries when continuous variables were	In all tables
		categorized	and figures.
		( <i>c</i> ) If relevant, consider translating estimates of relative risk into absolute risk for a meaningful time period	NA
Other englying	17	Report other analyses done—eg analyses of subgroups and interactions,	NA
Other analyses	17	and sensitivity analyses	INA
D: .			
Discussion Key results	18	Summarise key results with reference to study objectives	13
Key results Limitations	18	Discuss limitations of the study, taking into account sources of potential	15
	19	bias or imprecision. Discuss both direction and magnitude of any potential	1.5
		bias	
Interpretation	20	Give a cautious overall interpretation of results considering objectives,	16
merpretation	20	limitations, multiplicity of analyses, results from similar studies, and other	10
		relevant evidence	
	21	Discuss the generalisability (external validity) of the study results	15

Funding Give the source of funding and the role of the funders for the present study and, if applicable, for the original study on which the present article is based

\*Give information separately for cases and controls in case-control studies and, if applicable, for exposed and unexposed groups in cohort and cross-sectional studies.

Note: An Explanation and Elaboration article discusses each checklist item and gives methodological background and published examples of transparent reporting. The STROBE checklist is best used in conjunction with this article (freely available on the Web sites of PLoS Medicine at http://www.plosmedicine.org/, Annals of Internal Medicine at http://www.annals.org/, and Epidemiology at http://www.epidem.com/). Information on the STROBE Initiative is available at www.strobe-statement.org.

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# **BMJ Open**

# Oncologic big data platform for promoting digital competencies and professionalism in Chinese medical students: a cross-section study

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<b>Primary Subject Heading</b> :	Medical education and training
Secondary Subject Heading:	Medical education and training
Keywords:	MEDICAL EDUCATION & TRAINING, Gynaecological oncology < GYNAECOLOGY, Gynaecological oncology < ONCOLOGY, Health informatics < BIOTECHNOLOGY & BIOINFORMATICS

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2	professionalism in Chinese medical students: a cross-section study
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# 25 Abstract

Objectives: Advancements in big data technology are reshaping the health care system
in China. This study aims to explore the role of medical big data in promoting digital
competencies and professionalism among Chinese medical students.

Design, setting and participants: This study was conducted among 274 medical students who attended a workshop on medical big data conducted on July 8, 2021 in Tongji Hospital. The workshop was based on the first nationwide multifunction gynecologic oncology medical big data platform in China, at the National Union of Real-World Gynecologic Oncology Research & Patient Management Platform (NUWA platform).

Outcome measures: Data on knowledge, attitudes toward big data technology and professionalism were collected before and after the workshop. We have measured the four skill categories: doctor-patient relationship skills, reflective skills, time management, and interprofessional relationship skills using the Professionalism Mini-Evaluation Exercise (P-MEX) as a reflection for professionalism.

**Results:** A total of 274 students participated in this workshop and completed all the surveys. Before the workshop, only 27% of them knew the detailed content of medical big data platforms, and 64% knew the potential application of medical big data. The majority of the students believed that big data technology is practical in their clinical practice (77%), medical education (85%), and scientific research (82%). Over 80% of the participants showed positive attitudes toward big data platforms. They also exhibited sufficient professionalism before the workshop. Meanwhile, the workshop significantly promoted students' knowledge of medical big data (P < 0.05), and led to more positive attitudes toward big data platforms and higher levels of professionalism. **Conclusions:** Chinese medical students have primitive acquaintance and positive attitudes toward big data technologies. The NUWA platform-based workshop may potentially promote their understanding of big data and enhance professionalism, according to the self-measured P-MEX scale.

53 Keywords: Big data, Chinese medical education, Digital competencies,

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4 5	54	Professionalism, Workshop
6 7	55	
8 9	56	Strengths and limitations of this study
10	57	• This study depicted the knowledge and professionalism of medical big data among
11 12	58	Chinese medical students in the era of big data for the first time.
13 14	59	• This study provided a vivid example of how big data can assist medical education,
15 16	60	based on the first nationwide gynecologic oncology medical big data platform in
17 18	61	China (NUWA platform).
19 20	62	• The generalization of the findings is limited by the lack of sample representation
21	63	and the short follow-up time.
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# 65 Background

Electronification of medical records is the signature of the modern health care system.<sup>[1-3]</sup> Massive clinical and omics data have been produced to enable more detailed depictions of patients and diseases. Medical big data is thus reshaping our appreciation of the modern medical system. Technological advancements in data storage, processing, and analysis accelerated the clinical application of big data-driven products and contributed to personalized disease management,<sup>[4, 5]</sup> early diagnosis,<sup>[6-8]</sup> and treatment decision.<sup>[9, 10]</sup> Especially in the COVID-19 pandemic setting, achieving rapid application of medical big data would meet the pressing clinical need to predict the progression of diseases using data characteristics.<sup>[11-13]</sup> 

Big data has brought new challenges for doctors.<sup>[14]</sup> Information overload is a challenge for every healthcare worker, since they have to acclimate to the nature of big data, including extraordinary value, volume, velocity, variety, and variability.<sup>[15]</sup> Challenges can also be expected regarding medical professionalism in the age of big data. Because big data values realistic health-related information more than ever, the illusion that digital data outweigh face-to-face physician-patient interactions may motivate doctors to ignore the importance of professionalism.<sup>[16, 17]</sup> There is no precise definition of medical professionalism, which is reflected in the attitudes and behaviors directly related to clinical practice. Epstein RM et al. proposed the definition of professional competence as wisely using communication, knowledge, technical skills, clinical reasoning, emotions, values, and reflection in daily practice.<sup>[18]</sup> And Cain J et al. summarized professionalism as a series of attributes, such as altruism, respect, honesty, and so on.<sup>[19]</sup> Some studies have shown that digital medical education based on big data plays a positive effect in promoting professionalism.<sup>[16, 20, 21]</sup> However, there is a lack of research on the attitude and professionalism of Chinese healthcare workers regarding medical big data. Therefore, extra lectures and workshops about obtaining insights into big data and remaining respectful to patients are necessary. 

92 In this study, we aimed to depict the knowledge of medical big data and93 professionalism in the era of big data among Chinese medical students. What's more,

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we conducted a workshop for Chinese clinical and preclinical students to improve their
knowledge of medical big data and their professionalism in the big data era, based on
the National Union of Real-World Gynecologic Oncology Research & Patient
Management Platform (NUWA platform), which is the first nationwide multifunction
gynecologic oncology medical big data platform in China.

100 Methods

# 101 Study design

A workshop on the introduction of medical big data was conducted among clinical and preclinical students in Tongji Medical School. We conducted this study on Chinese medical students' learning and the application of big data in healthcare using pre- and post-course questionnaires.

# 107 Workshop design

The workshop was conducted on July 8, 2021 in Tongji Hospital, Tongji Medical
School, Huazhong University of Science and Technology, Wuhan, China. It was part
of the series class of "Medical big data platform learning and applying".

The workshop was delivered by two senior doctors (QLG and SQZ), who have over five years of experience in medical big data platform development and application. The workshop consisted of three major parts, (i) a lecture on the content and application of medical big data; (ii) a lecture on professionalism for doctors in the big data era; and (iii) learners being allowed to explore the NUWA platform freely according to their interest. The first and second sections lasted for approximately 45 minutes, and the third section lasted for 30 minutes.

In section one, five major parts were included in lectures given by the senior doctors, (i) the development of medical big data in China and the world, (ii) the application and potential of big data in clinical practice, medical education, and scientific research, (iii) the construction and content of the NUWA platform, (iv) how to use the NUWA

platform, and (v) plans for the NUWA platform development. For the second section, the following four items were discussed: (i) the attitude health care workers should have when communicating with patients and colleagues, considering that big data have already reshaped our medical system, (ii) the importance of detailed and continuous patient information for the development of big data platforms, (iii) how to protect patient privacy on the databases, and (iv) how to use the NUWA platform to satisfy patients' needs. For Section 3, all students were given a temporary account for the NUWA platform and had access to all deidentified patient information. They were allowed to explore the medical data freely and view structured health care information for half an hour. 

# 133 Data collection

134 Clinical and preclinical students in Tongji Medical School were invited to attend a 135 2-hour class by email or roadshows between June 8, 2021, and July 7, 2021. The 136 contents and speakers for the workshop were presented in the email or during the 137 roadshow. In addition, all 5th- (n=50, preclinical) and 6th-grade (n=49, clinical) 138 students of 8-year undergraduate education in Tongji Medical School took part in this 139 workshop as an additional course.

The participants completed two surveys, one before the workshop and the other after the workshop. Both questionnaires contain their basic knowledge and attitude toward big data technology and a Professionalism Mini-Evaluation Exercise (P-MEX) instrument. The P-MEX is developed from the mini-Clinical Examination Exercise (mini-CEX) format by Cruess R et al. in 2006 to evaluate professionalism in clinical training.<sup>[22]</sup> It consists of 24 items representing four skill categories: doctor-patient relationship skills, reflective skills, time management, and interprofessional relationship skills.<sup>[23, 24]</sup> And the reliability and validity of P-MEX have been confirmed in both Eastern and Western cultural backgrounds.<sup>[25-27]</sup> The attitude scale is a self-created scale focused on measuring participants' pedagogic evaluation, acceptance and expectation of the big data platform. It consisted of 8 questions: (i) Big data platform

could assist future medical education, (ii) Big data platform could assist future medical research, (iii)Big data platform could assist future clinical practice, (iv) I am willing to learn how to use big data platform, (v) I am willing to use big data platform in the future, (vi) I am willing to recommend big data platform to my colleagues, (vii) Big data platform could benefit my career, and (viii) Big data platform could benefit all medical careers. For each question, students chose from "totally agree", "agree", "disagree", and "totally disagree". For the applicability of conclusions, "totally agree" and "agree" were regarded as "positive attitudes", and "disagree" and "totally disagree" were considered as "negative attitudes". In addition, the first survey also contained students' baseline information, and the second survey contained a satisfaction questionnaire. Meanwhile, the browsing histories of participants in Section 3 were also recorded and analyzed to reflect students' interests.

163 The data collection and analysis plan were acknowledged and agreed upon by all 164 participants at the beginning of the workshop, and the study was approved by the 165 Research Ethics Commission of Tongji Hospital of Huazhong University of Science 166 and Technology (2020-S201).

# 168 NUWA platform

The NUWA platform is the first nationwide Gynecological Oncology data-sharing platform launched by the National Clinical Research Center for Gynecological Oncology in August 2019. This platform integrated inpatient/outpatient clinical data, genomic data, and follow-up data to develop a patient-level longitudinal clinico-genomic database. Information was deidentified and extracted from electronic medical records. A rigorous data quality check was performed to ensure the accuracy of the data entries. Since its foundation in 2019, 17 first-class hospitals from different provinces or cities in China have participated in the NUWA platform until August 2021. 

# 178 Statistical analysis

179 Descriptive statistics were presented by counts and percentages to describe the

180 demographic information. The Chi-square test was used to compare the changes in 181 knowledge and understanding of big data and professionalism before and after the 182 workshop. To acquire more practical results, the categories "not at all important" and 183 "not important" were combined for the analysis, as well as "important" and "very 184 important". *P values <0.05* were considered statistically significant. The data were 185 analyzed using R Version 4.03.

### 187 Patient and Public Involvement

188 No patients or members of the public were involved in this study.

**Results** 

191 Characteristics of students

A total of 274 students participated in this workshop and completed two surveys. All
of them were included in the final analysis. Participants were aged between 22 and 28,
with 148 (54.0%) preclinical students and 126 (46.0%) clinical students. Among them,
130 (47.4%) were males and 144 (52.4%) were females (Table 1).

The majority of participants (207, 75.5%) knew of at least one big data platform in
China or the world. Over two-thirds of them (183, 66.8%) also acknowledged its
application. However, only 17.2% (47) of them had been involved in any project related
to medical big data (Table 1).

#### 201 Table 1. Baseline characteristics for participants.

(9.9%)
(5.8%)
24.5%)
24.1%)
18.2%)

27	28 (10.2%)
28	20 (7.3%)
Gender	
male	130 (47.4%)
female	144 (52.6%)
Study stage	
pre-clinical	148 (54.0%)
clinical	126 (46.0%)
Acknowledgment of any kind of big	
data platform	
yes	207 (75.5%)
no	67 (24.5%)
Know the applications of big data	
technology	
yes	183 (66.8%)
no	91 (33.2%)
Involved in any big data-related	
projects	
yes	47 (17.2%)
no	227 (82.8%)
Total	274 (100%)

#### Knowledge of big data platforms

Before the workshop, approximately a quarter of the students (74, 27%) knew the detailed content of at least one medical big data platform, while nearly 64% (174) knew the potential application of medical big data platforms. After attending the lessons, almost all students could understand the content (253, 92%) and the potential application (253, 92%) of medical big data (Figure 1 and Table S1). 

Regardless of the survey completed (pre- or post-course), the majority of students 210 believed that big data technology is practical in medical education, clinical practice,

and scientific research (85%, 77%, 82% before the workshop; 99%, 87%, 95% after the

# 214 Students' attitudes toward big data platforms

workshop, respectively) (Figure 1 and Table S1).

Even before the workshop, most students hold a positive attitude on the potential of the big data platform in promoting medical education (237, 86%), medical research (256, 93%), and clinical practices (247, 90%). They were also willing to learn about and use the big data platform (250, 91%, and 218, 80%, respectively). Of them, 74% (202) were enthusiastic about introducing big data platforms to their colleagues. Interestingly, most students were convinced that the big data platform could benefit their careers (248, 91%), but they were not sure if it would yield the same effect on the others (128, 47%) (Figure 2 and Table S2). 

When the workshop was completed, almost all students had positive attitudes toward the big data platform (**Figure 2 and Table S2**). However, there were still 12% (34) and 18% (48) of students who were not sure if the big data platform could benefit their and others' medical careers, respectively.

## 228 Professionalism

Generally, positive attitudes toward all the professionalism items were demonstrated, with more than three-quarters of the students agreeing that all professionalism attributes were "important" or "very important" before the workshop. The three items that most students thought were "not at all important" or "not important" were maintaining patient confidentiality (66, 24% of students chose "not important" or "not at all important"), maintaining appropriate appearance (60, 22% students chose "not important" or "not at all important") and respecting rules and procedures of the system (55, 20% students chose "not important" or "not at all important") (Figure 3A and Table S3).

professionalism items (p<0.05). The most significant improvements occurred for</li>
"Maintaining patient confidentiality" (from 76% to 95%), "Listen actively to patient"
(from 89% to 100%), and "Accepting feedback" (from 89% to 98%) (Figure 3B and
Table S3).

244 Interest in medical data

In the free exploration section, most students (253, 92.3%) viewed the patients' hospitalization logs. A total of 76.3% (209) of students were interested in the patients' history of illness. Meanwhile, many students were interested in medicine usages (56.2%), surgery reports (52.9%), and diseases of rare pathologies (58.6%). Only approximately one-third of students viewed image diagnosis (37.6%) and follow-up records (32.5%) (**Table 2**).

252 Table 2. Browser records in the free-exploration section.

Content	Number of participants, n (%)
History of Illness	Ľ,
yes	209 (76.3%)
no	65 (23.7%)
Hospitalization logs	
yes	253 (92.3%)
no	21 (7.7%)
Medicine usage	
yes	154 (56.2%)
no	120 (43.8%)
Surgery record	
yes	145 (52.9%)
no	129 (47.1%)
Image diagnosis	
yes	103 (37.6%)

171 (62.4%)
00 (22 59/)
00 (22 50/)
89 (32.5%)
185 (67.5%)
160 (58.4%)
114 (41.6%)

254 Satisfactory survey

Upon completing the survey, 95.6% (262) of participants were "satisfied" or "extremely satisfied" with this workshop, and only 7 out of 274 students were not at all satisfied. However, we failed to obtain feedback from them in the next three months. Most students thought the workshop was informative (249, 90.9%) and understandable (255, 94.1%). The majority of students were also willing to recommend this seminar to other students (257, 93.8%) and to participate in similar classes in the future (254, 92.7%). Regarding the duration of this workshop, only 7 (2.6%) students thought that 2 hours was too long (Table 3).

**Table 3. Participants 'answers to the workshop satisfaction survey.** 

	Not at all, n (%)	No, n (%)	Yes, n (%)	Yes, extremely, n (%)	Mean	SD
Overall, are you satisfied with this course	7 (2.6%)	5 (1.8%)	57 (20.8%)	205 (74.8%)	3.68	0.640
Did you think the course are informative?	10 (3.6%)	15 (5.5%)	101 (36.9%)	148 (54%)	3.41	0.757
Did you think the duration of this courses is too long	121 (44.2%)	118 (43.1%)	28 (10.2%)	7 (2.6%)	2.07	0.954

Was the course	11 (4%)	8 (2.9%)	121 (44.2%)	134 (48.9%)	3.38	0.733
understandable for you	11 (470)	0 (2.970)	121 (44.270)	154 (40.970)	5.50	0.755
Would you recommend						
these courses to other	6 (2.2%)	11 (4%)	144 (52.6%)	113 (41.2%)	3.33	0.659
students?						
Are you willing to take						
part in similar courses in	6 (2.2%)	14 (5.1%)	35 (12.8%)	219 (79.9%)	3.70	0.666
the future?						

265 SD, Standard Deviation.

#### **Discussion**

Our study demonstrated that Chinese medical students have little knowledge of and positive attitudes toward big data technologies. They also yield expertise in professionalism. Furthermore, workshops based on big data platforms could further strengthen their digital competencies and improve doctor-patient communication capabilities, which would lead to better fitness during the expansion of medical big data.

In this workshop, the basic knowledge of big data platforms in China was measured. Although a large fraction of students knew about the big data platform and its utility, only a few of them could apprehend its composition or how to use it. This situation may be caused by the recent rapid development of big data technology in China and comparatively lagging relevant education.<sup>[28, 29]</sup> In addition, ethical challenges that hinder medical and public health data sharing may have also exacerbated the situation.<sup>[30]</sup> Therefore, aside from conducting big data-related workshops, promoting medical and public health data sharing policies and evolving relevant legal and ethical implications are also of great importance. 

Students' enthusiasm toward medical big data was also taken into consideration. As
expected and consistent with previous reports,<sup>[25]</sup> the majority of students exhibited
positive attitudes toward the big data platform and were willing to acquire further

proficiency. They believed that big data would play a vital role in future medical education, clinical practice, and scientific research, which are the main tasks for all Chinese doctors. However, not all of them believed that big data could benefit all medical careers. The popularity of information technology in China recently may contribute to the big data-friendly intention of medical students.<sup>[31]</sup> Meanwhile, their limited understanding of related fields may hamper the belief that it could be used productively.<sup>[32-34]</sup> In the meantime, we were delighted to see that almost all students recognized the significance of big data after our workshop. We thus believe that proper education may be an efficient way to diminish misunderstandings and achieve full potential in big data platforms. 

Professionalism was related to the development of big data in our study for the first time in China. Considering that big data can reshape medical activities in all aspects, including doctors' attitudes toward their colleagues and patients,<sup>[35]</sup> a lecture about "professionalism in the age of big data" was presented in the current workshop. Before the seminar, students demonstrated sufficient professionalism, similar to the findings of previous reports, with high scores on the majority of these items. Nevertheless, it is worth noting that nearly 1/4 of the participants did not pay enough attention to maintaining patient confidentiality. Protecting patients' privacy is an essential embodiment of medical ethics and humanities.<sup>[36]</sup> Participants mostly answered these questions from the perspective of big data users before our workshop, ignoring that those data represented thousands of actual patients. After we emphasized the importance of data privacy in the workshop, students realized that respect for patients is the foundation for improving their medical professionalism. Meanwhile, to enhance patient-data privacy protection, the privacy information, such as ID number, was privatized and converted into an alternative ID number using a hashing algorithm before being uploaded to the NUWA platform. Therefore, the personal information of all included patients in the NUWA platform is confidential and unreachable to all users. Several important professionalism levels were also significantly increased in many other elements after the workshop, indicating that this workshop could be a preliminary

attempt to promote professionalism when the prominence of digital data has changed the way we communicate and when doctors have to spend more time with electronic records than with patients. These changes our workshop brought deserve more attention in China since Chinese doctors are well-known to be overburdened.<sup>[37, 38]</sup> These improvements could also help increase the reliability of medical records and produce convincing and effective medical information.

Another interesting fact in the results is that approximately 60% of students noticed rare diseases in the free-exploration section, which is hardly involved in routine medical classes.<sup>[39, 40]</sup> We believe this is another strength of big data-based medical education. In traditional medical classes, it is arduous for teachers to grant detailed depictions for every type of rare disease. As a result, students may not have easy access to these exceptional cases and therefore are often not able to diagnose rare diseases when reviewing patients' medical records. The big data platform makes it possible for every user to conveniently browse through cases with rare pathologies, which would benefit patients as well as reduce misdiagnoses.

Our workshop had some limitations. The most important one is that the NUWA platform is still under development, and the omics data are not currently included. Therefore, another investigation should be conducted when the construction of NUWA has been completed. Meanwhile, we did not calculate the sample size before the conduction of this study, which may lead to potential bias. And the limited sample size may be another reason that restricts the popularization of our conclusion. Furthermore, narrow geographical distributions of study participants interfered with the generalization of results to other populations. Meanwhile, there are concerns that students who volunteered to participate in the workshop may be more enthusiastic about big data technology than those who did not. We thus included all 5th-(preclinical) and 6th-grade (clinical) students of 8-year undergraduate education in Tongji Medical School to make the study sample more representative. As for the measurement of attitudes and professionalism, a qualitative approach would have been more appropriate and should be considered in the future. Meanwhile, this workshop is too short to

produce fundamental improvements in students' attitudes and professionalism. In thefuture, more long-term studies are wanted to draw a clear conclusion.

#### 347 Conclusion

This study depicted Chinese students' knowledge of medical big data for the first time and the NUWA platform-based workshop had the potential to improve their understanding of big data and enhance professionalism.

### 352 List of abbreviations

P-MEX, Professionalism Mini-Evaluation Exercise instrument. NUWA platform, the
National Union of Real-World Gynecologic Oncology Research & Patient
Management Platform.

#### 357 Contributorship

358 QLG, JHL and XFJ designed the study and survey. QLG, JHL, XFJ, ML, ZKP, YBH 359 and SQZ conducted the workshop. PJ, HYL, JHC, XYL, YY, and SQZ analyzed and 360 interpreted the data. YJZ and GCM performed interpretation of data and discussion of 361 findings. QLG conceptualized and designed the study, supervised the project, analyzed 362 and interpreted the data, and wrote the paper. All authors approved the final version of 363 the manuscript and agreed to the submission of this manuscript.

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(2021022).

#### 372 Competing of interests

1		
2 3		
4	373	The authors declare that they have no competing interests.
5 6	374	
7 8	375	Ethics approval
9 10	376	The data collection and analysis plan were acknowledged and agreed by all participants
11 12	377	and the study has been approved by the Research Ethics Commission of Tongji Hospital
13 14	378	of Huazhong University of Science and Technology (2020-S201).
15 16	379	
17 18	380	Data sharing
19 20	381	The data used in the current study are available from the corresponding author on
20 21 22	382	reasonable request via e-mail ( <u>qingleigao@hotmail.com</u> ).
23	383	
24 25	384	Consent for publication
26 27	385	Not applicable.
28 29	386	
30 31	387	Acknowledgements
32 33	388	Not applicable.
34 35	389	
36 27	390	Reference
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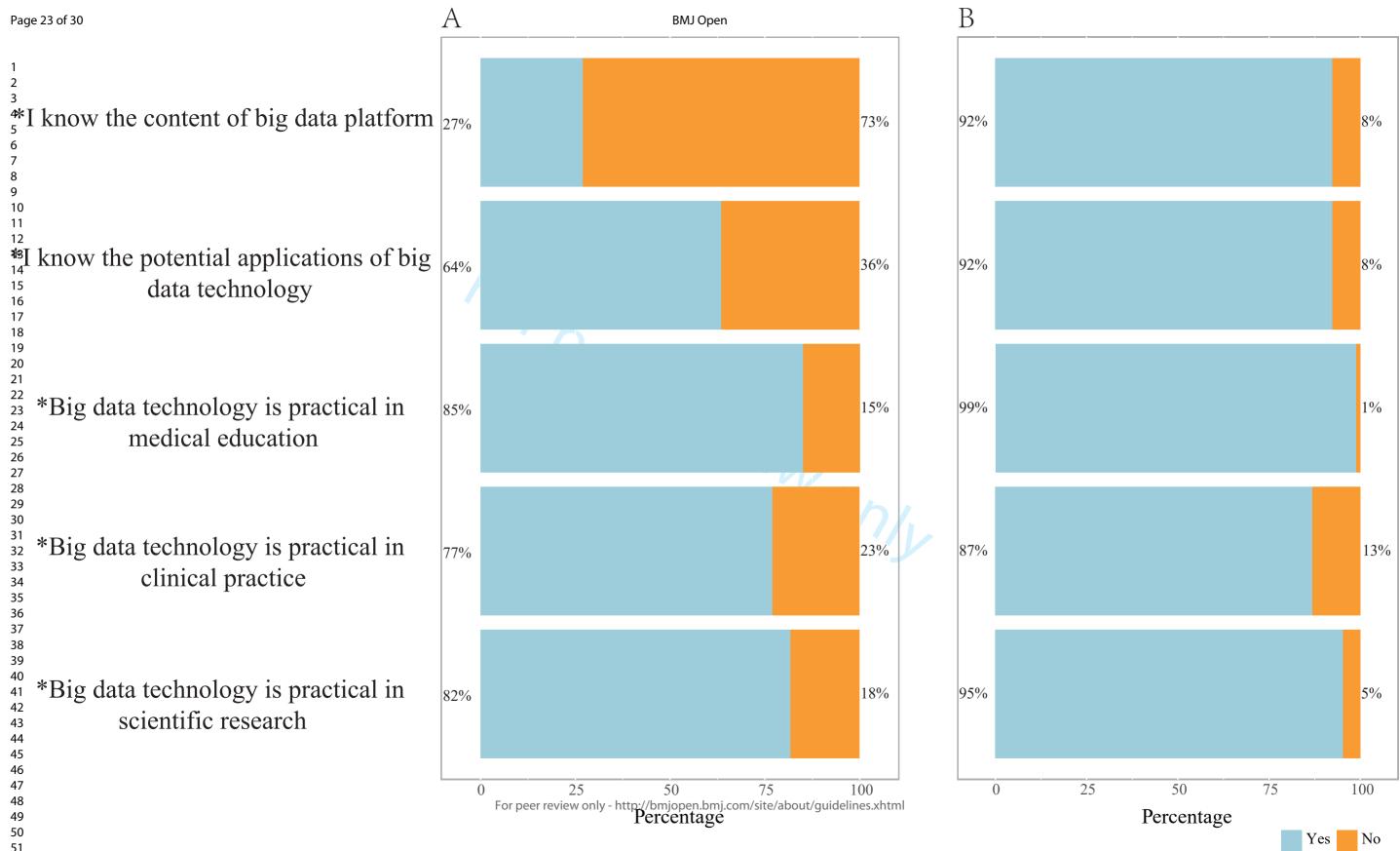
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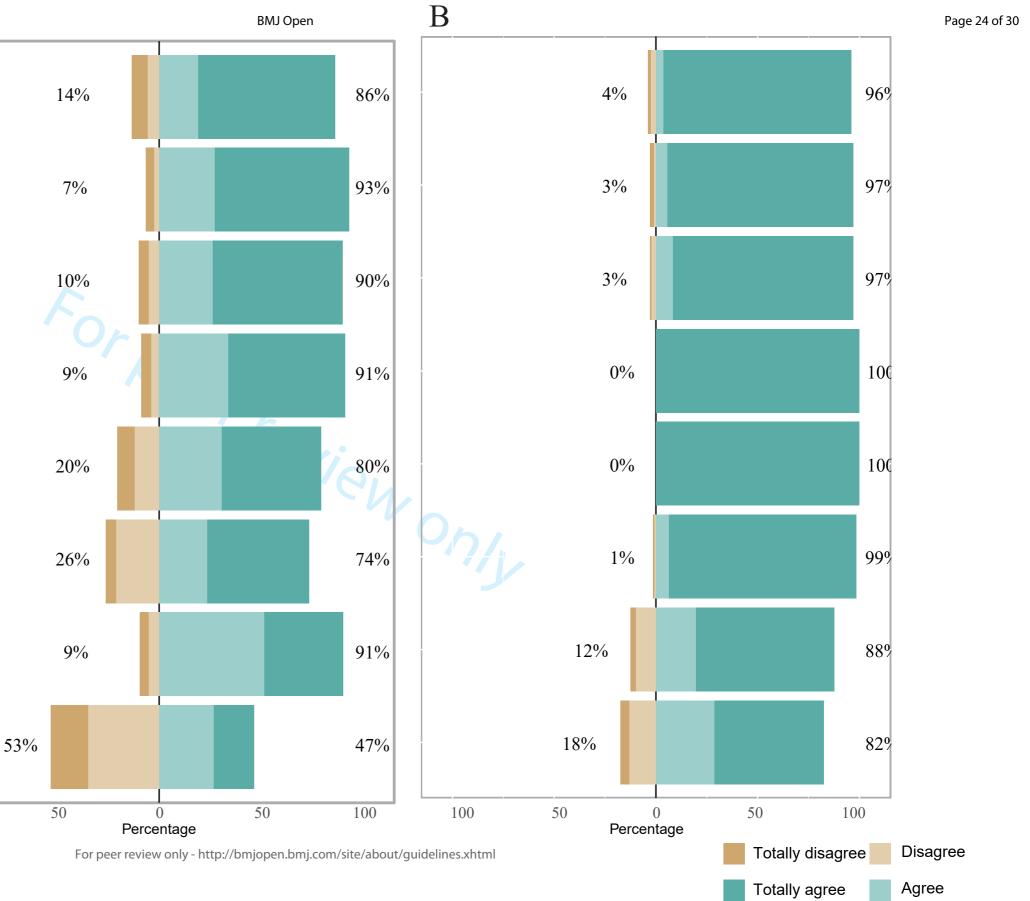
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487 Figure 1. Basic knowledge for big data platform (A) before and (B) after the488 workshop.

- 489 \* means that there is a significant difference before and after the workshop.
- 490 Figure 2. Students' attitude towards big data platform (A) before and (B) after the
- 491 workshop.
- 492 \* means that there is a significant difference before and after the workshop.
- 493 Figure 3. The professionalism for students (A) before and (B) after the workshop.
- \* means that there is a significant difference before and after the workshop.





\*Big data platform could assist future medical education

A

Big data platform could assist future medical reserch

\*Big data platform could assist future clinical practice

\*I am willing to learn how to use big data platform

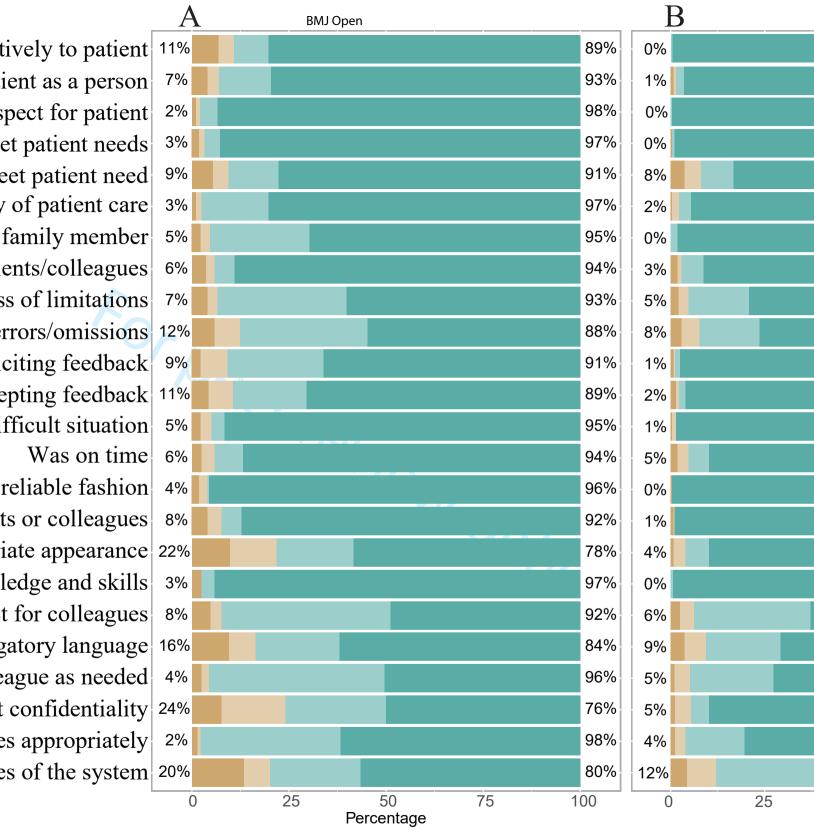
\*I am willing to use big data platform in the future

am willing to recommanded big
 data platform to my colleges

Big data platform could benefit my career

\*Big data platform could benefit all medical careers

E 2



\*Listen actively to patient<sup>11%</sup> \*Show interest in patient as a person \*Show respect for patient <sup>2%</sup> \*Recognize and meet patient needs Accepted inconvenience to meet patient need Ensure continuity of patient care 3% \*Advocate on behalf of a patient and/or family member Maintained appropriate boundaries with patients/colleagues Demonstrating awareness of limitations Admitting errors/omissions 12% \*Soliciting feedback 9% \*Accepting feedback 11% \*Maintaining composure in a difficult situation \*Completing tasks in a reliable fashion \*Being available to patients or colleagues \*Maintaining appropriate appearance 22% \*Addressing own gaps in knowledge and skills Demonstrating respect for colleagues \*Avoiding derogatory language 16% Assisting a colleague as needed \*Maintaining patient confidentiality 24% Using health resources appropriately \*Respecting rules and procedures of the system<sup>20%</sup>

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**F D** 

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		100%
		99%
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		100%
		94%
		91%
		95%
		95%
		96%
		88%
50	75	5 100
Percentage		
Not at all important		Not important
Important		Very important

# Supplemental tables

Table S1, basic knowledge for big data platform before and after the workshop.

	Before W	orkshop	After Wo	orkshop		
Items	YES, n	NO, n	YES, n	NO, n	Р	
I know the content of big data platform	74	200	253	21	<0.0001	
I know the potential applications of big data technology	174	100	253	21	<0.0001	
Big data technology is practical in medical education	233	41	271	3	<0.0001	
Big data technology is practical in clinical practice	211	63	238	36	0.0039	
Big data technology is practical in scientific research	224	50	261	13	<0.0001	
	Cr.					

Table S2, students' attitude towards big data platform before and after the workshop.

Before Workshop						After Workshop						
Totally	Disagree, n	Agree, n	Totally	Mean	SD	Totally	Disagree, n	Agree, n	Totally	Mean	SD	Р
disagree, n	8,	6,	agree, n			disagree, n		6,	agree, n			
21	16	53	184	3.50	0.910	4	7	10	253	3.87	0.504	0.0002
							_					
11	7	75	181	3.55	0.735	5	3	16	250	3.86	0.499	0.0705
13	14	72	175	3 49	0 799	2	6	23	243	3 85	0 464	0.0017
15	11	12	175	5.17	0.799	2	0	23	215	5.05	0.101	0.0017
13	_								274	4	0	<0.0001
	lisagree, n 21	Disagree, n       21     16       11     7       13     14       13     11	Disagree, n         Agree, n           21         16         53           11         7         75           13         14         72           13         11         93	Disagree, n     Agree, n     agree, n       21     16     53     184       11     7     75     181       13     14     72     175       13     11     93     157	Disagree, n         Agree, n         Agree, n         Mean           21         16         53         184         3.50           11         7         75         181         3.55           13         14         72         175         3.49           13         11         93         157         3.43	Disagree, n     Agree, n     Mean     SD       21     16     53     184     3.50     0.910       11     7     75     181     3.55     0.735       13     14     72     175     3.49     0.799       13     11     93     157     3.43     0.783	Disagree, n       Agree, n       agree, n       Mean       SD       disagree, n         21       16       53       184       3.50       0.910       4         11       7       75       181       3.55       0.735       5         13       14       72       175       3.49       0.799       2         13       11       93       157       3.43       0.783       0	Disagree, n       Agree, n       Agree, n       Mean       SD       Disagree, n       Disagree, n         21       16       53       184       3.50       0.910       4       7         11       7       75       181       3.55       0.735       5       3         13       14       72       175       3.49       0.799       2       6         13       11       93       157       3.43       0.783       0       0	Disagree, n       Agree, n       Agree, n       Mean       SD       Disagree, n       Disagree, n       Agree, n         21       16       53       184       3.50       0.910       4       7       10         11       7       75       181       3.55       0.735       5       3       16         13       14       72       175       3.49       0.799       2       6       23	Disagree, n       Agree, n       Agree, n       Mean       SD       Disagree, n       Disagree, n       Agree, n       agree, n       agree, n         21       16       53       184       3.50       0.910       4       7       10       253         11       7       75       181       3.55       0.735       5       3       16       250         13       14       72       175       3.49       0.799       2       6       23       243         13       11       93       157       3.43       0.783       0       0       0       274	Disagree, n         Agree, n         Agree, n         Mean         SD         disagree, n         Disagree, n         Agree, n         Agree, n         Mean         agree, n           21         16         53         184         3.50         0.910         4         7         10         253         3.87           11         7         75         181         3.55         0.735         5         3         16         250         3.86           13         14         72         175         3.49         0.799         2         6         23         243         3.85           13         11         93         157         3.43         0.783         0         0         0         0         274         4	Disagree, n       Disagree, n       Agree, n       Agree, n       Agree, n       Agree, n       Agree, n       Mean       SD         21       16       53       184       3.50       0.910       4       7       10       253       3.87       0.504         11       7       75       181       3.55       0.735       5       3       16       250       3.86       0.499         13       14       72       175       3.49       0.799       2       6       23       243       3.85       0.464         13       11       93       157       3.43       0.783       0       0       0       274       4       0

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I am willing to use big data	23	33	84	134	3.20	0.953	0	0	0	274	4	0	<0.0001
platform in the future	23	55	64	134	5.20	0.933	0	0	0	274	4	0	<0.0001
I am willing to recommended big	14	58	65	137	3.19	0.941	2	2	18	252	3.90	0.388	<0.0001
data platform to my colleagues	14	58	05	137	5.19	0.941	2	2	18	232	3.90	0.388	<0.0001
Big data platform could benefit	12	14	142	106	3.25	0.744	7	27	54	186	3.53	0.776	0.3382
my career	12	14	172	100	5.25	0.744	,	27	7	100	5.55	0.770	0.5582
Big data platform could benefit	50	96	74	54	2.48	1.006	12	36	79	147	3.32	0.863	<0.0001
all medical careers	50	20	/4	54	2.40	1.000	12	50	17	147	5.52	0.005	~0.0001

# SD, Standard Deviation. Table S3, the professionalism for students before and after the workshop.

		Before work	shop			After works	shop		
Items	Not at all	Not important,	Important,	Very important,	Not at all	Not important,	Important,	Very important,	Р
	important, n	n	n	n	important, n	n	n	n	
Doctor-patient relationship skills					571				
Listen actively to patient	19	11	24	220	0	0	1	273	<0.000
Show interest in patient as a person	11	8	37	218	2	2	6	264	0.0029
Show respect for patient	3	3	12	256	0	0	1	273	0.0401
Recognize and meet patient needs	5	4	11	254	1	0	2	271	0.0255
Accepted inconvenience to meet patient need	15	11	35	213	10	12	24	228	0.6503
Ensure continuity of patient care	3 Eor peer revie	4 w oply - bittp://f	47 miopen hm	220	1 t/guidelines.xhtml	5	9	259	1

Advocate on behalf of a patient and/or family member	6	7	70	191	0	0	5	269	0.0008
Maintained appropriate boundaries with patients/colleagues	10	6	14	244	5	3	16	250	0.1440
Reflective skills				·					
Demonstrating awareness of limitations	11	7	91	165	6	7	44	217	0.459
Admitting errors/omissions	16	18	90	150	8	13	44	209	0.088
Soliciting feedback	6	19	68	181	2	1	4	267	<0.00
Accepting feedback	12	17	52	193	4	2	5	263	0.000
Maintaining composure in a difficult situation	6	8	9	251	1	3	0	270	0.031
Time management			0						
Was on time	7	9	20	238	5	8	15	246	0.702
Completing tasks in a reliable fashion	5	6	1	262	1	0	0	273	0.008
Being available to patients or colleagues	11	10	14	239	2	1	0	271	0.000
Interprofessional relationship skills					$\gamma_{\lambda}$				
Maintaining appropriate appearance	27	33	54	160	2	9	17	246	<0.00
Addressing own gaps in knowledge and skills	7	0	9	258	0	0	2	272	0.022.
Demonstrating respect for colleagues	13	8	119	134	7	10	85	172	0.613
Avoiding derogatory language	26	19	59	170	10	16	54	194	0.022
Assisting a colleague as needed	7	5	124	138	3	11	61	199	0.840

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		-							
Maintaining patient confidentiality	21	45	71	137	3	12	13	246	<0.000 1
Using health resources appropriately	4	2	99	169	3	8	43	220	0.3244
Respecting rules and procedures of the system	37	18	64	155	12	21	72	169	0.0146
	-				•				

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STROBE Statement-checklist of items that should be included in reports of observational studies

	Item No	Recommendation	Pag No
Title and abstract	1	( <i>a</i> ) Indicate the study's design with a commonly used term in the title or the abstract	1
		( <i>b</i> ) Provide in the abstract an informative and balanced summary of what	2
		was done and what was found	
Introduction			
Background/rationale	2	Explain the scientific background and rationale for the investigation being reported	4
Objectives	3	State specific objectives, including any prespecified hypotheses	4-5
Methods			
Study design	4	Present key elements of study design early in the paper	5
Setting	5	Describe the setting, locations, and relevant dates, including periods of	5
5		recruitment, exposure, follow-up, and data collection	
Participants	6	(a) Cohort study—Give the eligibility criteria, and the sources and	5
1		methods of selection of participants. Describe methods of follow-up	
		Case-control study—Give the eligibility criteria, and the sources and	
		methods of case ascertainment and control selection. Give the rationale	
		for the choice of cases and controls	
		Cross-sectional study—Give the eligibility criteria, and the sources and	
		methods of selection of participants	
		(b) Cohort study—For matched studies, give matching criteria and	NA
		number of exposed and unexposed	
		Case-control study—For matched studies, give matching criteria and the	
		number of controls per case	
Variables	7	Clearly define all outcomes, exposures, predictors, potential confounders,	6-7
		and effect modifiers. Give diagnostic criteria, if applicable	
Data sources/	8*	For each variable of interest, give sources of data and details of methods	6-7
measurement		of assessment (measurement). Describe comparability of assessment	
		methods if there is more than one group	
Bias	9	Describe any efforts to address potential sources of bias	NA
Study size	10	Explain how the study size was arrived at	6
Quantitative variables	11	Explain how quantitative variables were handled in the analyses. If	7-8
		applicable, describe which groupings were chosen and why	
Statistical methods	12	(a) Describe all statistical methods, including those used to control for	7-8
		confounding	
		(b) Describe any methods used to examine subgroups and interactions	NA
		(c) Explain how missing data were addressed	7-8
		(d) Cohort study—If applicable, explain how loss to follow-up was	7-8
		addressed	
		Case-control study-If applicable, explain how matching of cases and	
		controls was addressed	
		Cross-sectional study-If applicable, describe analytical methods taking	
		account of sampling strategy	
		( <u>e</u> ) Describe any sensitivity analyses	NA

Continued on next page

Participants	13*	(a) Report numbers of individuals at each stage of study—eg numbers potentially eligible, examined for eligibility, confirmed eligible, included	8
		in the study, completing follow-up, and analysed	
		(b) Give reasons for non-participation at each stage	All
			participants
			were eligible
			and included
			in this study.
		(c) Consider use of a flow diagram	NA
Descriptive	14*	(a) Give characteristics of study participants (eg demographic, clinical,	8-9
data		social) and information on exposures and potential confounders	
		(b) Indicate number of participants with missing data for each variable of	Very high
		interest	response rates
			with no
			missing data,
			as shown in
			supplementary
			data.
		(c) Cohort study—Summarise follow-up time (eg, average and total	NA
		amount)	
Outcome data	15*	Cohort study—Report numbers of outcome events or summary measures	NA
		over time	
		Case-control study—Report numbers in each exposure category, or	NA
		summary measures of exposure	
		Cross-sectional study—Report numbers of outcome events or summary	8
		measures	-
Main results	16	( <i>a</i> ) Give unadjusted estimates and, if applicable, confounder-adjusted	In all tables
		estimates and their precision (eg, 95% confidence interval). Make clear	and figures.
		which confounders were adjusted for and why they were included	T 11 / 1 1
		(b) Report category boundaries when continuous variables were	In all tables
		categorized	and figures.
		( <i>c</i> ) If relevant, consider translating estimates of relative risk into absolute risk for a meaningful time period	NA
Other englying	17	Report other analyses done—eg analyses of subgroups and interactions,	NA
Other analyses	1/	and sensitivity analyses	INA
<b>D</b> : .		and sensitivity analyses	
Discussion Key results	18	Summarise key results with reference to study objectives	13
Key results Limitations	18	Discuss limitations of the study, taking into account sources of potential	15
	19	bias or imprecision. Discuss both direction and magnitude of any potential	1.5
		bias	
Interpretation	20	Give a cautious overall interpretation of results considering objectives,	16
merpretation	20	limitations, multiplicity of analyses, results from similar studies, and other	10
		relevant evidence	
	21	Discuss the generalisability (external validity) of the study results	15

Funding Give the source of funding and the role of the funders for the present study and, if applicable, for the original study on which the present article is based

\*Give information separately for cases and controls in case-control studies and, if applicable, for exposed and unexposed groups in cohort and cross-sectional studies.

Note: An Explanation and Elaboration article discusses each checklist item and gives methodological background and published examples of transparent reporting. The STROBE checklist is best used in conjunction with this article (freely available on the Web sites of PLoS Medicine at http://www.plosmedicine.org/, Annals of Internal Medicine at http://www.annals.org/, and Epidemiology at http://www.epidem.com/). Information on the STROBE Initiative is available at www.strobe-statement.org.

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