

# A review on advances in intra-operative imaging for surgery and therapy

## Imagining the operating room of the future

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**Abstract Purpose** With the advent of Minimally Invasive Surgery (MIS), intra-operative imaging has become crucial for surgery and therapy guidance, allowing to partially compensate for the lack of information typical of MIS. This paper reviews the advancements in both classical (i.e. ultrasounds, X-ray, optical coherence tomography and magnetic resonance imaging) and more recent (i.e. multispectral, photoacoustic and Raman imaging) intra-operative imaging modalities. **Methods** Each imaging modality was analyzed, focusing on benefits and disadvantages in terms of compatibility with the operating room, costs, acquisition time and image characteristics. Tables are included to summarize this information. New generation of hybrid surgical room and algorithms for real time/in room image processing were also investigated. **Results** Each imaging modality has its own (site- and procedure-specific) peculiarities in terms of spatial and temporal resolution, field of view and contrasted tissues. Besides the benefits that each technique offers for guidance, considerations about operators and patient risk, costs, and extra time required for surgical procedures have to be considered. The current trend is to equip surgical rooms with multimodal imaging systems, so as to integrate multiple information for real-time data extraction and computer-assisted processing. **Conclusions** The future of surgery is to enhance surgeons eye to minimize

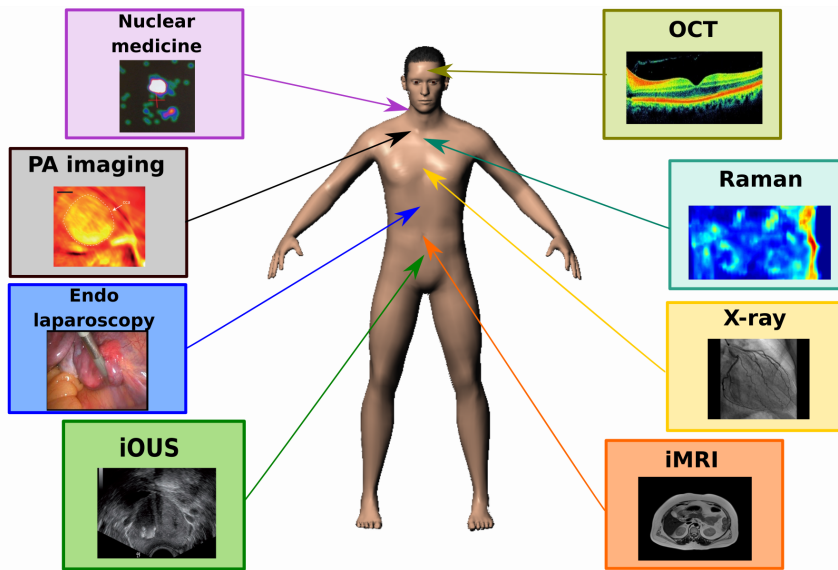
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**Fig. 1** Surveyed imaging modalities: X-rays, OCT (Optical Coherence Tomography), PA (PhotoAcoustic) imaging, endo/laparoscopy, iMRI (intra-operative Magnetic Resonance Imaging), iOUS (intra-Operative UltraSound), nuclear medicine, and Raman.

intra- and after-surgery adverse events and provide surgeons with all possible support to objectify and optimize the care-delivery process.

## 1 Introduction

With the advent of Minimally Invasive Surgery (MIS), intraoperative imaging started to play a crucial role in different fields, such as neurosurgery [1], urology [2] and nephrectomy [3], to access hidden targets, allow intraoperative optical biopsy, guide navigation and, in general, to guarantee minimal invasiveness and maximal safety. In the last decades, several advancements have been done in the field of intraoperative imaging, leading to real-time (or quasi-real time) systems with higher resolution, efficiency, lower costs and able to execute complex data analyses [4].

Intra-Operative UltraSound (iOUS), X-ray, Optical Coherence Tomography (OCT), intra-operative Magnetic Resonance Imaging (iMRI), Nuclear Medicine (NM), endo/laparoscopy, PhotoAcoustic (PA), and Raman imaging are among the most rapidly evolving modalities, even if with different levels of diffusion in clinics. In Fig. 1, exemplary intra-operative images are shown. These imaging modalities are commonly exploited for different surgical tasks and in different surgical phases, according to their specifications. Table 1 and Table 2 summarize this information, while Table 3 highlights the main clinical applications for each modality.

	iOUS	X-ray	OCT	iMRI	Endo/laparoscopy	PA	Nuclear medicine	Raman
Spatial resolution	$\sim \mu\text{m}$	$\sim \mu\text{m} - \text{mm}$	$\mu\text{m}$	mm	$\sim \mu\text{m} - \text{m}$	$\sim \mu\text{m} - \text{m}$	$\sim \text{mm}$	$< \text{mm}$
Temporal resolution [frame/s]	$\sim 120$	$\sim 7-30$	$\sim 4-40$	$\sim 5-15$	$\sim 10-30$	$\sim 10-30$	$< 0.01$	$< 0.01$
Max field of view [mm]	$\sim 200$	$\sim 430$	$\sim 200$	$\sim 550$	$\sim 100$	$\sim 100$	$\sim 5$	$\sim 200$
Costs [€]	10-100k	10-100k	10-100k	1-10M	0.1-10k	1-10k	10k	10-100k

**Table 1** Imaging technique specifications. Orders of magnitude are reported.

	iOUS	X-ray	OCT	iMRI	Endo/laparoscopy	PA	Nuclear medicine	Raman
Bones		✓			✓	✓		
Muscles tendons ligaments	✓			✓	✓	✓		
Vessels	✓	✓*		✓	✓	✓		
Cytoarchitecture			✓					✓
Metabolic and functional processes				✓	✓	✓	✓	

\*With contrast agent

**Table 2** Enhanced tissues.

Considering how fast the field of intra-operative imaging is evolving, the motivations behind reviewing such a topic resides in the fact that, by analyzing the relevant state of art, we found that the majority of published reviews are either focused on technical aspects (e.g. AR [5], anatomy segmentation [6], deep-learning processing [7]) or limited to a specific imaging modality (e.g. OCT [8], Endo/laparoscopy [9], iMRI [10], Raman [11]).

The closer work to ours is the one presented in [12], which, however, only surveys emerging imaging modalities (i.e. fluorescence, PA, Raman and nuclear imaging). As a result, considering such information, the importance of intra-operative imaging in the surgery of the future will come to light. The goal of the review is, instead, to provide a compact and updated source of information for young researchers who are approaching the wide field on intra-operative imaging, and a reference overview document for those already working in the field.

This review article discusses the basic principles and development directions of intra-operative imaging modalities and is not intended to be a comprehensive review of intra-operative imaging applications. Eight imaging modalities are surveyed: iOUS (Sec. 2), X-ray (Sec. 3), OCT (Sec. 4), (Sec. 5), Endo/laparoscopy (Sec. 6), PA imaging (Sec. 7), Nuclear medicine (Sec. 8), Raman spectroscopy (Sec. 9). To conclude this review, an overview of integrated surgical rooms, as well as a survey of real-time/quasi real-time image processing techniques for intraoperative applications, is presented (Sec. 10). This way, we aim at providing the reader with useful information about the forthcoming trend to install ad-hoc operating rooms (ORs).

To limit the overlap with previous survey papers, we selected the articles according to the following criteria:

- Papers about clinical application, mainly reported in Table 4 and Table 5, had to be published from 2010 onward; no restriction for papers introducing general concepts about imaging physical principles;
- Papers not strictly discussing intra-operative applications (such as diagnosis and follow-up and clinical trials) were not considered.

	iOUS	X-ray	OCT	iMRI	Endo/laparoscopy	PA	Nuclear medicine	Raman
Neuro	✓	✓	✓	✓	✓	✓		✓
Ophthalmology	✓	✓	✓					
Ear-nose-throat	✓				✓	✓	✓	
Breast	✓			✓	✓	✓	✓	✓
Cardiothoracic and endovascular	✓	✓		✓	✓	✓		
Abdominal	✓		✓	✓	✓	✓	✓	✓
Pelvic	✓	✓	✓	✓	✓	✓	✓	
Orthopedic, cranial and maxillofacial	✓	✓	✓	✓	✓	✓		

**Table 3** Principal surgical applications.**Table 4** Application samples for Intra-Operative UltraSound (iOUS), X-ray and Optical Coherence Tomography (OCT).

Method	Year	Application field	Aim	Imaging technique
Riva et al. [13]	2017	Neuro	Brain-shift assessment	iOUS
Farnia et al. [14]	2015		Pre-op planning update	
Ahmadi et al. [15]	2015	Cardiothoracic and endovascular	Electrode positioning	
Deffieux et al. Imbault et al. [16]	2017		Cortical mapping	
Mura et al. [17]	2017		Device tracking	
Brattain et al. [18]	2014	Cardiothoracic and endovascular	Tool tracking	
Rahim et al. [19]	2018		Review on stent implantation	
Alenezi et al. [20]	2015	Abdominal	Vessel visualization	
Antico et al. [21]	2019		Review on guidance procedures	
Petrover et al. [22]	2018	Orthopedic, cranial and maxillofacial	Guidance	
Sharma et al. [23]	2016	Neuro	Electrode placing	X-ray
Burchiel et al. [24]	2013		Electrode placing	
Barsa et al. [25]	2014	Cardiothoracic and endovascular	Spinal surgery	
Barsa et al. [26]	2016		Spinal surgery	
Dinesh et al. [27]	2012	Cardiothoracic and endovascular	Screw placement	
Cooke et al. [28]	2011		Ventricular drain placement	
Labadie et al. [29]	2014	Ear-nose-throat	Cochlear implantation	
Wong et al. [30]	2011		Sinus surgery	
Ing et al. [31]	2005	Cardiothoracic and endovascular	Stent implantation	
Fitts et al. [32]	2008		Femoral artery puncture	
Schwartz et al. [33]	2011	Abdominal and thoracic	Valvular repair	
Kenngott et al. [34]	2014		Liver surgery	
Schafer et al. [35]	2012	Abdominal and thoracic	Lung surgery	
Simpfendorfer et al. [36]	2016		Renal surgery	
Zelefsky et al. [37]	2010	Pelvic	Prostate seed placement	
Lee et al. [38]	2013		Gynecologic brachytherapy	
Schichor et al. [39]	2017	Orthopedic, cranial and maxillofacial	Cranial neurosurgery	
Bell et al. [40]	2011		Orthognathic surgery	
Shaye et al. [41]	2015	Orthopedic, cranial and maxillofacial	Reconstructive surgery	
Rabie et al. [42]	2011		Fracture reduction	
Gieroba et al. [43]	2015	Orthopedic, cranial and maxillofacial	Review on hand surgery	
Coste et al. [44]	2013		Screw fixation	
Sullivan et al. [45]	2012	Orthopedic, cranial and maxillofacial	Dislocations reduction	
Cunningham et al. [46]	2014		Fracture assessment	
Hahn et al. [47]	2011	Ophthalmology	Review on ophthalmic surgery	OCT
Ray et al. [48]	2011		Retinal anatomy evaluation	
Lee et al. [49]	2011	Ophthalmology	Retinal detachment repair	
Falkner et al. [50]	2010		Epiretinal membrane monitoring	
Siebelmann et al. [51]	2016	Cardiothoracic and endovascular	Canaloplasty	
Das et al. [52]	2016		Cataract surgery	
Carrasco et al. [53]	2016	Cardiothoracic and endovascular	Vitrectomy	
Prati et al. [54]	2012		Percutaneous coronary surgery	
Imola et al. [55]	2010	Cardiothoracic and endovascular	Percutaneous coronary surgery	
Kubo et al. [56]	2011		Review on coronary syndromes	
Alfonso et al. [57]	2012	Cardiothoracic and endovascular	Coronary dissection	
Gonzalo et al. [58]	2012		Stenosis assessment	
Ferrante et al. [59]	2013	Cardiothoracic and endovascular	Review on coronary interventions	
Sommerey et al. [60]	2015		Parathyroid gland identification	
Chu et al. [61]	2010	Orthopedic, cranial and maxillofacial	Cartilage assessment	
Nolan et al. [62]	2016		Lymph node evaluation	
Nguyen et al. [63]	2010	Breast	Lymph node evaluation	
Bus et al. [64]	2013		Pelvic	

The 40% of the cited articles discuss the technical aspects of the investigated modalities, the remaining 60% are about clinical applications.

## 2 Intra-operative Ultrasound (iOUS) Imaging

UltraSounds (US) are a succession of rarefactions and compressions transmitted due to elastic forces between adjacent particles. Most diagnostic US has

**Table 5** Application samples for interventional Magnetic Resonance Imaging (iMRI), Endo/laparoscopy, PhotoAcoustic (PA) imaging, Nuclear medicine and Raman spectroscopy.

Method	Year	Application field	Aim	Imaging technique
Coburger et al. [65]	2015	Neuro	Glioma resection	iMRI
Li et al. [66]	2017		Glioma resection	
Chakraborty et al. [67]	2017		Meningoma resection	
Buchfelder et al. [68]	2016		Pituitary adenoma surgery	
Ashour et al. [69]	2016		Skull base surgery	
Choudhri et al. [70]	2015		Pediatric brain tumors	
Ginat et al. [71]	2014		Tumor surgery	
Mohyeldin et al. [72]	2017		Biopsy	
Roessler et al. [73]	2016		Resective surgery for epilepsy	
Warsi et al. [74]	2016		Pediatric epilepsy surgery	
Cui et al. [75]	2016		Electrode placement	
Jakobs et al. [76]	2018		Electrode placement	
Guo et al. [77]	2018		Review on neurosurgery	
Ziffa et al. [78]	2012	Cardiothoracic and endovascular	Review on cardiac catheterization	
Eitel et al. [79]	2014		Cardiac ablation	
Wegelin et al. [80]	2017	Pelvic	Review on prostate biopsy	
Mehrtash et al. [81]	2018		Prostate biopsy	
Kapur et al. [82]	2013		Gynecologic brachytherapy	
Ahrar et al. [83]	2018	Orthopedic, cranial and maxillofacial	Review on musculoskeletal system	
Sequeiros et al. [84]	2018		Review on musculoskeletal system	
Pediconi et al. [85]	2018	Breast	Review on tumor ablation	
Chevrier et al. [86]	2016		Review on biopsy	
King [87]	2015	Skin	Wound assessment	Endo/laparoscopy
Thatcher [88]	2016		Burn assessment	
Thatcher [89]	2016		Burn assessment	
Fabelo [90]	2018	Neuro	Brain tumor delineation	
Ohayon [91]	2018		Neural activity assessment	
Ayala [92]	2019		Neural activity assessment	
Moecia [93]	2018	Abdominal	Tissue classification	
Kumashiro [94]	2016		Tumor detection	
Wirkert [95]	2016		Physiological parameter assessment	
Wirkert [96]	2017		Physiological parameter assessment	
Clancy [97]	2015	Pelvic	Blood oxygenation assessment	
Zuzak [98]	2011		Tissue oxygenation assessment	
Holzer [99]	2011		Renal oxygenation assessment	
Clancy [100]	2016		Oxygenation assessment	
Saso [101]	2018		Perfusion assessment	
Nandy [102]	2016		Malignant tissue classification	
Lin [103]	2017		Oxygenation assessment	
Van [104]	2017		Lymph node evaluation	
Crane [105]	2011		Lymph node evaluation	
Van [106]	2011		Tumor tissue detection	
Mascharak [107]	2018	Ear-Nose-Throat	Tumor tissue detection	
Lu [9]	2014		Tumor tissue detection	
Pike [108]	2016	Breast	Tumor tissue detection	
Lu [109]	2016		Tumor margin delineation	
Lu [110]	2015		Tumor tissue detection	
Ray et al. [111]	2011	Neuro	Brain tumor delineation	PA imaging
Bell et al. [112]	2015		Pituitary surgery	
Yao et al. [113]	2014	Cardiothoracic and endovascular	Review on brain procedures	
Van et al. [114]	2015	Breast	Review on flow imaging	
Ermolayev et al. [115]	2016		Perfusion monitoring	
Li et al. [116]	2016		Tumor margin assessment	
Diot et al. [117]	2017		Tumor margin assessment	
Dima et al. [118]	2013	Abdominal	Viability assessment	
Allard et al. [119]	2018	Pelvic	Uterine artery visualization	
Bell et al. [120]	2015		Brachytherapy seed localization	
Ozkan et al. [121]	2015	Skin	Lymph nodes in melanoma	Nuclear medicine
Ghosh et al. [122]	2017	Breast	Lymph nodes in breast	
Blumel et al. [123]	2014	Ear-Nose-Throat	Lymph nodes in oral cancer	
Vermeeren et al. [124]	2010	Lymph nodes in head and neck		
Vermeeren et al. [125]	2010	Abdominal	Paraaortic sentinel lymph nodes	
Vermeeren et al. [126]	2011	Prostate sentinel lymph nodes	Pelvic	
Wang et al. [127]	2015	Cardiothoracic and endovascular	Tumor detection	Raman spectroscopy
Reider et al. [128]	2017	Breast	Tumor margin assessment	
Thomas et al. [129]	2017		Tumor margin assessment	
Garai et al. [130]	2015	Abdominal	Tissue classification	

frequencies in the range 2-20 MHz [131]. The way elastic waves are reflected provides information about internal tissues.

US imaging techniques have been introduced as intra-operative imaging modalities (iOUS) thanks to their real-time acquisition, reduced OR encumbrance and limited costs, which allow full in-room compatibility.

*Technological advancements.* Recent technological advancements of iOUS are related to:

- Probe miniaturization, down to few mm in diameter, which allows the probe insertion in hollow cavities, such vessels in vascular or cardiac procedures and in the patient abdomen through the trochar port during min-

imal invasive surgery. This led to Intra-Cardiac Echocardiography (ICE), TransEsophageal Echocardiography (TEE), TransRectal US (TRUS) and IntraVascular US (IVUS). On this regard, an interesting comparative study IVUS vs OCT has been recently published [19].

- Probe navigation and 3D probes realization, which allows the visualization of a volumetric dataset, rather than a planar slice.
- Signal processing capabilities, which allow for real-time visualization of inner anatomical structures and surgical tools.
- High focused US implementation, for precise targeting of therapy (see paragraph 5.2).

Volumetric US imaging is surely among the most impacting advancements of iOUS systems in the actual clinical practice. A review on real-time 3D US imaging technology has been recently published [132].

Volumetric US imaging can be achieved using 3D probes [133] and spatial localizing the probe with external measuring devices and properly calibrated [134]. Alternatively, US volumetric probes can be rigidly attached to robot end-effectors and provide intra-operative guidance of surgical interventions [135].

Deep learning has been recently employed to reconstruct the 3D volume without any external tracking device [136]. 3D volume reconstruction can be achieved with frame rates up to 120 frames/s [137].

The technological pharmacological combination of capsule endoscopy with US-mediated Targeted Drug Delivery (UmTDD) carries new potential for treatment of diseases throughout the gastro-intestinal tract. Finally Contrast-Enhanced US (CEUS) are used during robotic-assisted kidney surgery [20] to enhance the visualization of macro and microvasculature of the kidneys.

*Limitations and open issues.* IOUS based devices are portable and low-cost systems for obtaining intra-operative information. Some open issues are still limiting their adoption in some clinical procedures, such as:

- Poor tissue contrast due to low Signal-to-Noise Ratio (SNR), despite the adoption of contrast media (e.g. such as microbubbles). This is particularly limiting neurosurgical navigation, since the planning phase is currently done on pre-operative CT or MRI sequences.
- Limited spatial resolution and FoV (inverse relationship, both are function of the excitation frequency of the transducer).

### 3 X-ray

X-ray based imaging techniques take advantage of the capability of high-energy photons to penetrate the matter. Radiations are artificially generated by means of X-ray tubes and it is possible to adjust the beam energy depending on patient size and desired tissue contrast. Information about the internal anatomy of the subject are revealed by photon attenuation through the matter [138].

Projective (2D) or tomographic (3D) images can be generated depending on the device configuration. Both type of images can be acquired over time, although only 2D digital radiography (i.e. fluoroscopy) offers true real time imaging. High contrast is obtained for bone and air; soft tissues can be enhanced by injecting a radiocontrast agent. The use of X-rays is limited by the maximum patient's radiation exposure stated by radiation protection limits.

*Technological advancements.* X-rays for intraoperative use were introduced in the '50, when Philips developed the first flexible and portable device known as C-arm. Nowadays, digital flat panel detectors replaced traditional image intensifiers, since they offer higher transducer efficiency with lower dose, higher spatial and radiometric resolution (100-200 $\mu$ m and 14-16 bits respectively), fast sample rate (25-40Hz), larger FoV, and lower image degradation over the period of use. C-arms are traditionally used for static and cine 2D acquisition. However, since the arm can revolve 360 $^\circ$  around the patient, Cone Beam Computed Tomography (CBCT) can be acquired for 3D volume reconstruction. In addition, in room CT devices are also available:

1. On rail intraoperative CT (iCT), which are normal diagnostic CT scanners that can be moved into the room through ceiling rails. In some cases, the scanner is fixed and the surgical couch can be moved inside the CT device;
2. Small and portable CT scanners which can be moved in and out from the surgical room.

The last technological advancements are now directed towards the possibility to enhance soft tissue contrast without injecting contrast mean. This can be obtained by means of: 1) dual energy X-ray sources; 2) use of different ionizing radiations, such as proton or carbon ion beams, to obtain proton radiography and tomography [139, 140]. Even if such cutting edge technologies are not currently used for intraoperative applications, it is very likely they will be the next frontier of this in room modality.

Technological advancements about X-rays for guidance are related also to radiotherapy applications where X-ray beams are used not only for treatment, but also for guidance. To this purpose, stereoscopic radiographs for 3D reconstruction and CBCT are widely employed to verify patient's position and localize the tumor [141, 142]. In some centers, on rail CT and iCT are also employed for performing optimal adaptive radiotherapy treatments with the same quality of planning CT [143]. Linear accelerator have been integrated with CT scanner as for TomoTherapy<sup>®</sup> and robotic X-ray arms as for CyberKnife<sup>™</sup> for high precision radiosurgery treatments [144]. Another promising technique relies in exploiting Cherenkov emission during irradiation in order to visualize, in real time, surface dose on the patient skin. This method has been proved for breast radiotherapy [145] and total skin electron therapy [146], demonstrating the improvement of the irradiation quality assessment.

*Limitations and open issues.* The principal limitation of intraoperative X-ray based imaging is the invasiveness of ionizing radiation for biological tissues.

In the last years, particular attention has been paid to reduce X-ray dose delivered both to patient and staff [147, 148]. Especially for pediatric patients, other imaging techniques are preferred, when possible, to minimize the radiation exposure. From the image quality point of view, an important issue is represented by the presence of metal inserts which generate artifacts, especially for high density material [149]. Many efforts are also made to improve the quality of CBCT reconstruction. In fact, due to the conic aperture of the beam, photon scatter represents a serious issue for image degradation. Many scatter correction algorithms have been proposed in literature [150, 151]. However, standard practical solutions still remain inadequate.

#### 4 Optical Coherence Tomography (OCT)

Optical coherence tomography [152] is an imaging technique able to provide 1D (also named A-scan), 2D (B-scan) and 3D representations of biological tissue. It takes advantage of the optical reflection of light to obtain spatial information of the sample structure. By exploiting this physical propriety, it is possible to acquire high resolution images (axial resolution in the range of  $\mu\text{m}$ ) without any tissue damage nor ionizing radiation dose delivered. Tissue details are revealed by time of flight of transmitted/reflected light signal, that is related to sample structure and composition. Ultrashort laser pulse, as well as low-coherence light, can be used as energy source. 2D images over time can be acquired and directly shown, meanwhile 4D representation (volumes over time) has been recently introduced.

Real-time OCT imaging has been made possible by Graphics Processing Units (GPU) computational power [8] and spectral-domain paradigm.

OCT has full in-room compatibility, since no risks exist for patients and operators. Anyway, as discussed in [153], metallic surgical tools can affect OCT image quality (e.g. introducing shadow). For this reason, in order to allow a real-time intraoperative OCT, instead of a “stop and scan“ approach, instruments made of alternative materials (such as plastics and silicone) can be used.

*Technological advancements.* Since the presentation of this new modality, reducing acquisition time and improving image quality were the most important challenges to deal with. The introduction of spectral-domain OCT as an alternative to time-domain OCT, allowed to reduce scanning time, making easier the investigation of bigger volume sample [154, 155] and facilitating a real intraoperative usage. In addition to the spectral-domain strategy, another important improvement was the possibility to join the probe with microscopes, surgical instruments (such as needles), and laser modules [8].

*Limitations and open issues.* Currently, main OCT limitations are due to the narrow FoV (including reduced depth of penetration) achievable by means of this modality. However, in [156], a possible methodology to overcome this



**Table 6** Main characteristics of iMRI scanners

Characteristics	Low-field	High-field
Portable	Yes	No
Compatibility with the standard OR	Yes	No
Easy access to the operator	Yes	No
Compatibility with surgical tools	Yes	No
Real-time imaging	Yes	Yes
Image quality	Poor	High
Special sequences	No	Yes

limitation has been successfully tested, enabling an acquisition of a FoV up to  $20 \times 20$  cm. If compared with IVUS, OCT has a smaller depth of penetration, that in turn affects the FoV.

## 5 Intra-operative Magnetic Resonance Imaging (iMRI)

MRI is based on the interaction of  $H^+$  proton spins immersed in a magnetic field and stimulated by Radio Frequency waves (RF pulse).

Tissues containing mobile protons, such soft tissues, present very high contrast in MRI. The contrast can be even modified in a process called pulse sequence, where a certain number of RF pulses and magnetic field gradients is set and combined to obtain an image with anatomical or functional appearance, such as for Perfusion MRI (Pe-MRI), MR Angiography (MRA), MR Venography (MRV), Diffusion Weighted Imaging (DWI), functional MRI (fMRI) [157].

Due to the high combination of parameter setting, MRI is a very versatile technique. It provides high image quality in terms of spatial and contrast resolution, it combines morphological and physiological information, it features multiplanar 2D acquisition in any direction and orientation, as well as 3D isotropic voxel acquisition. Moreover, it does not involve ionizing radiations, thus being less invasive than X-ray based imaging. On the other end, MRI is prone to several artifacts, most important being motion and magnetic field distortion and it can be dangerous for the patient in presence of metal implants and active implantable medical devices.

*Technological advancements.* From the equipment perspective, the current possible configurations for iMRI can be grouped into 2 classes [158], whose main characteristics are reported in Table 6:

- Low field scanners: with a static magnetic field  $\leq 1T$ , they are small and portable devices [159] with a gap to allow access to the patient during the surgical procedures.
- High field scanners: with a static magnetic field  $\geq 1.5T$  (closed bore). They are introduced to the OR by means of ceiling rails (or the patient is moved inside the scanner by means of a movable operative table [160]). The main

advantage is the higher image quality and the possibility to acquire non-anatomical images (DWI, Pe-MRI, MRA and fMRI).

Specific pulse sequences allowing rapid imaging have been developed for real-time or quasi real-time imaging (10-20 frames/s [83, 161]).

Technological advancements led iMRI to be used as guide during radiotherapy and US based treatments. Image guidance in radiotherapy plays a crucial role for correct patient positioning, organ and tumor motion assessment during radiation delivery. By now, the scene has been dominated by US, optical tracking systems and X-ray based techniques, both for photon [162] and proton based treatments [163]. However, very recently, LINear ACcelerator (LINAC) have been integrated with MRI, giving birth to the first LINAC-MRI systems.

The great advantage provided by MRI guidance is the possibility to clearly contrast the cancerous tissue without use of any implanted or external surrogate point. Due to the promising results, the current trend in radio/particle therapy is to move toward MRI based treatments [164, 165].

US energy, finally, can be used to heat, store the heat and then release the heat over time into the tissue to be treated [166]. The focal point can be localized using pre-operative MRI (MR-guided focused US or MRgFUS). Intra-operatively, [167] introduced focal spot localization using Harmonic Motion Imaging (HMI). The motion of the organs can be compensated using robotic end-effectors [168].

*Limitations and open issues.* iMRI systems, especially in the high field configuration, are still very expensive and require a re-arrangement or a complete new installation of the OR and the use of specific MRI-safe devices.

In many cases, the time required for operations increases compared to the standard navigation and the involved personnel need a specific training to work in presence of magnetic field. These issues limit the spread of iMRI to specialized clinical institutions or very big hospitals.

It is possible to foresee in the future a higher presence of iMRI in the OR, especially with the new trend of multi-modal operative rooms.

## 6 Endo/laparoscopy

With the spread of MIS procedures, endo/laparoscopic imaging has become one of the most popular intraoperative imaging modality. Laparoscopic imaging is an optical, non-invasive and non-ionizing technology that provides surgeons with 2D images, with three (e.g., in case of RGB) or more channels, of the surgical scene. With respect to other imaging modalities (such as MRI and X-ray), endo/laparoscopic imaging is also fully compatible with standard OR instrumentation [169].

Besides standard RGB imaging, powerful solutions include barrow band imaging, which is an optical technique where a filtered light enhances the visualization of epithelial and subepithelial microvascular patterns [170]. This

technique exploits the physical property that the depth of penetration of light is dependent on its wavelength. Narrow-Band Imaging (NBI) filters select the blue and green light with wavelengths of 415 and 540 nm, respectively, that correspond to the peaks of absorption of hemoglobin. These filtered wavelengths penetrate, respectively, the epithelium, thus highlighting the capillary network and the deeper levels, enhancing the subepithelial vessels.

*Technological advancements.* Within this context, Multi-HyperSpectral Imaging (MHSI) has drawn the attention of the medical-imaging community, even if its use inside the OR is still limited. [171] MHSI enables to capture both spatial and spectral information on structures. MHSI provides images that generally have dozens (multispectral) or hundred (hyperspectral) of channels, each corresponding to the reflection of light within a certain wavelength band [172]. Multispectral bands are usually optimized to encode the informative content which is relevant for a specific application [173]. Similarly to NBI systems, the measured reflectance spectrum is influenced by the optical properties of tissues, including the concentration of absorbers, such as hemoglobin, and scatterers, such as cells or structural connective tissues. However, MHSI allows higher resolution than NBI and often guarantees more accurate tissue analysis [172, 93].

As a natural evolution of MHSI, Multi-HyperSpectral Fluorescence Imaging (MHSFI) is also becoming more and more spread [174, 175, 176]. By combining MHSI and fluorescence molecular techniques (mostly based on fluorescein/fluorescein isothiocyanate or indocyanine green molecules), MHSFI is particularly suitable when dealing with tissues with multiple fluorescent labels that, however, have similar color and texture appearance (according to the human eye) and are localized in spatially overlapping areas.

Recently, fluorescence spectroscopy provided by 5-aminolevulinic acid (5-ALA) is showing promising results in assisting neurosurgeons during tumor resection. On this regard, studies were conducted to compare 5-ALA and iMRI, and the impact of a combined usage of these techniques [177, 178].

Large interest is today given to the development of near-infrared fluorescent probes for tumor margin assessment intraoperatively [179] [180] [181] [182]. Fluorescent probes may allow to detect lesions at an early stage, where conventional imaging may fail, lowering patients morbidity and mortality.

Label-free fluorescence lifetime imaging (FLIm) is a novel surgical-guidance technique, which relies only on tissue autofluorescence, without requiring exogenous contrast agents. By exploiting time-resolved measurements, FLIm overcomes the limitations of steady-state fluorescence, where non-uniform tissue illumination, and variable presence of endogenous absorbers may interfere with the fluorescence signal of interests. Preliminary results are already available for applications in surgery. [183] [184] [185] [186]

*Limitations and open issues.* With advances in high-energy pulsed lasers, hardware cameras, image analysis methods, and computational power, many

exciting applications in the medical field have been proposed in the endo/laparoscopic fields.

MHSI and MHSFI offer a straightforward measurement of tissue characteristics (e.g. texture and perfusion), as long as the visualized tissue is close to the surface. This actually limits the use of MHSI/MHSFI when deeper tissues need to be investigated.

When dealing with steady-state fluorescence imaging (i.e., FLIm is excluded here), a further potential issue is represented by tissue autofluorescence, which is present in many living, non-cancerous cells. The autofluorescence causes non-specific background fluorescence, which may interact with the true cancer-specific fluorescent signal, and limit the imaging quality. With FLIm, this issue is not present. Open issues here deal with tissue motion and acquisition setup preparation, which may still require heavy time-consuming manual correction.

Selecting the most MHSI and MHSFI informative spectral bands and the most discriminative fluorescence molecules is crucial to allow the best visualization of structure of interests [173, 174]. MHSI/MHSFI systems could cover ultraviolet (200 to 400 nm), visible (400 to 780 nm), near (780 to 2500 nm) and mid infrared (2500 to 25000), depending on applications. However, visible and near infrared are the most widely used spectral ranges [9].

A further issue is related to real-time data acquisition. Depending on hardware set-up and number of recorded spectral channels, acquisition time can range from a few seconds to several minutes. This could lead to misalignment in the multispectral stacks, resulting in noisy and blurred multispectral images, where the same pixel measured at different band could correspond to different tissues. Lens distortion and noisy image borders should also be considered when visualizing and processing multispectral data. Considering the high number of image channels, computational-time issues arise also when processing MHSI/MHSFI data, e.g. for segmentation purposes.

The translation of MHSI/MHSFI into the actual clinical practice is still limited by costs, even if now cheaper and cheaper sensors are becoming available. Moreover, the general lack of surgical guidelines and training could explain the slow introduction of MHSI/MHSFI in the OR.

## 7 Photoacoustic imaging

PA imaging is emerging as a new biomedical imaging modality based on the photoacoustic effect. In photoacoustic imaging, non-ionizing laser pulses are delivered into biological tissues (when radio frequency pulses are used, the technology is referred to as thermoacoustic imaging). Some of the delivered energy will be absorbed and converted into heat, leading to transient thermoelastic expansion and thus wideband (i.e. MHz) ultrasonic emission. The generated ultrasonic waves are detected by ultrasonic transducers and then analyzed to produce images.

*Technological advancements.* Thus, PA is naturally a 3D imaging modality. To lower costs and acquisition time associated to volumetric US detectors, other strategies can be used, such as using 2D US detectors focused on a plane or spherically-focused US detectors for sampling one point in the FoV at a time [187].

Technological advancements in parallel detection and fast tuning of optical parametric oscillators allowed real-time multispectral PA, pushing its use in the clinical practice [188, 189, 190].

*Limitation and open issues.* PA imaging is evolving fast but, although many exciting applications have been proposed in the medical field, large clinical trials are still lacking. One relevant issue is the PA signal attenuation, which prevents using this technology for imaging small and deep tissues. Hard tissue imaging (e.g. human brain imaging) is also prevented due to aberration processes of US wave-fronts.

## 8 Nuclear medicine

Nuclear medicine based imaging provides information about the metabolism and functionality of tissues and organs, rather than anatomical details. It exploits the possibility to mark with a radioactive substances a given molecule involved into a physiological/pathological process. The obtained compound (also named radiopharmaceutical) is administered to the patient and then, by directly tracking the signal emitted by the radioactive element, functional details of the tissues can be revealed (both in 2D and in 3D).

As well as other imaging modalities, also nuclear medicine has been used to provide intraoperative information to the surgeon [191]. In such a scenario, however, in room devices could significantly differ from diagnostic scanners. In fact, for intraoperative applications, 2D images are usually obtained by a hand-held probe. In addition, by combining localization system and 2D hand probe, it is possible to extract intraoperative volumetric representation of the radiopharmaceutical distribution [192].

*Technological advancements.* Over the years, the main technological advancements in this field were about the detector (commonly called "gamma camera"). Similarly to the diagnostic scanners, also the hand probe devices relies on detectors that can be classified as belonging to two different classes: scintillators (such as NaI(Tl) and bismuth germinate (BGO)) and semiconductors (Cadmium-Zinc-Telluride (CZT)). Both solutions offer advantages and disadvantages and both have been commercially used [193].

*Limitations and open issues.* Although nuclear medicine probes can provide intra-operative information about tissues metabolism and lead to more accurate surgery procedure, some drawbacks still remains. Such limitations are mainly related to the physical working principle behind this modality. In particular, the main disadvantages are:

- Patient and operators are exposed to ionizing radiation.
- The system generates images with limited spatial and temporal resolution, low SNR and small FoV.

## 9 Raman spectroscopy

Raman spectroscopy has emerged as a potential tool for detecting biochemical differences between cancerous and healthy tissue, improving the accuracy of tumor surgery since it is fast, non-destructive and non-invasive [194, 11].

In this modality, a laser light interacts with tissue sample and, due to the Raman effect, a portion of this light undergoes to an energy shift. The amount of the energy shift is informative about molecular composition of the tissue, resulting into a full characterization of the sample.

Raman spectroscopy does not require any special tissue preparation and staining or labelling, thus being cheap and fast. Moreover, the biochemical interpretation of the biological samples assists in the objective and quantitative evaluation about the tissue, overcoming the issues of the more subjective histopathological diagnosis performed by a single or panel of pathologists.

*Technological advancements.* Recent advancements in the field include Surface-Enhanced Raman Spectroscopy (SERS) [195] and Raman-Encoded Molecular Imaging (REMI) [196] that, by exploiting nanoparticles delivered to the sample, allow both to amplify Raman signal (by a factor of  $\sim 10$  orders of magnitude), and to speed up the acquisition process. On this regard, the design of ad-hoc nanoparticles, able to provide improved signal intensity, can further help Raman spectroscopy to better detect different types of tumor [197]. Finally, an unique triple-modality MRI/PA/Raman has been developed and tested [198].

*Limitation and open issues.* The main limitation and open issue of intraoperative Raman spectroscopy is about the safety in evaluating not excised patient's tissue. In fact, since both SERS and REMI require nanoparticles tags directly applied on the tissue to analyze, the toxicity of this procedure should be carefully investigated.

## 10 Hybrid surgical rooms and real-time/quasi real-time image processing.

With the increasing need of image guidance in surgery and therapy, most of the modern surgical rooms are equipped with multimodal imaging systems. These are referred as hybrid surgical (or operating) rooms (or theatres). The most advanced present a multi-room layout to allow the presence of high field iMRI and CT or Positron Emission Tomography (PET)/CT scanner. Hybrid surgical rooms offer the advantage of performing different procedures in the

same place. This is also a safety benefit from the patient side: if something goes wrong during a planned intervention the lay-out can easily be converted to a more complicated surgical procedure. From the surgeon and medical staff side, these rooms offer the state of the art advancements in terms of imaging integration, real time data extraction and, in some cases, voice and hand gesture control.

A representative example is the Advanced Multimodal Image-Guided Operating (AMIGO) suite (see Fig. 2), at Brigham Women Hospital in Boston (USA), which was launched in 2011. AMIGO consists of three adjacent rooms. The central room is the OR and it is equipped with MRI-compatible anesthesia delivery and monitoring systems; a surgical microscope with near-infrared capability; surgical navigation systems that track handheld tools; a ceiling-mounted C-Arm X-Ray system and 3D ultrasound devices. The side rooms include a high field (3T) iMRI scanner and a PET/CT scanner respectively. The iMRI can be moved into the OR by ceiling rails. The PET/CT is fixed and the patient is transferred from the OR through a shuttle system. Since its launch, more than 2000 (by January 2019) MIS procedures have been performed in AMIGO, mostly being neurosurgeries, ablations and biopsies [199].

The trend has pushed companies like Siemens Health Care<sup>1</sup> (Erlangen, Germany) and IMRIS<sup>2</sup> (Winnipeg, Canada) to invest on hybrid surgical rooms for different applications. Besides the advantages that a hybrid OR offers, its cost is still very high, ranging from 1 million to 4 million dollars, and it often requires re-structuring the existing space. Moreover, with the fast technological advancement, these suites have to be flexible to rapid changes and renovations. So, we can say that the future of OR is going to be hybrid, but still some year is required to have them as clinical practice.

On the other hand, taking advantage of image-processing algorithms, intra-operative images can be enriched by i) computing and showing supplementary information extracted from the image itself ii) merging different and complementary acquisitions of the same anatomical district.

A straightforward solution to achieve these goals is using augmented and virtual reality [200].

However, the low image quality of some intraoperative images and the real-time or quasi real-time processing to be guaranteed pose technological challenges. Intraoperative processing algorithms can be grouped as:

- Structure segmentation, identification and tracking:

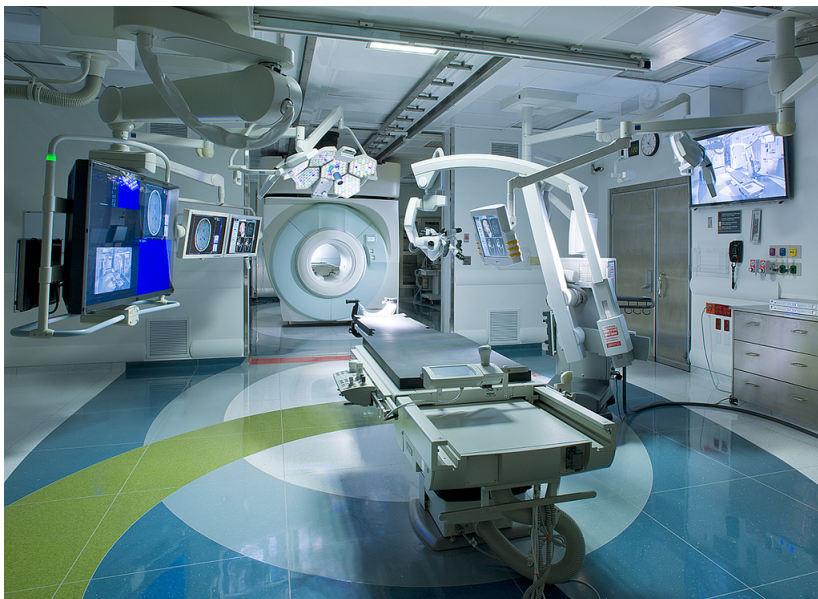
Anatomical structures, as well as surgical tools, can be automatically identified (segmented) or tracked over time to provide surgeons with decision support and context awareness.

Exemplary applications include vertebrae [201] segmentation on fluoroscopy images, tissues and surgical tools tracking [202] in 3D US, vessel segmentation [203], organ segmentation and tumor margin assessment in laparoscopic imaging [204, 205, 206], surgical tool detection in video la-

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<sup>1</sup> <https://www.healthcare.siemens.com/clinical-specialities/surgery/experience-hybrid-or/360-tour>

<sup>2</sup> <https://www.imris.com>



**Fig. 2** Overview of AMIGO surgical room. Courtesy of the Surgical Planning Laboratory, Brigham and Women's Hospital, USA. Reprinted with permission from the authors.

paroscopy [207], cancerous tissue [208] and organs at risk [209, 210, 211], panorama stitching to enlarge the field of view [212], surface reconstruction in plastic surgery [213], identification in planning radiotherapy CT, brachithery [214] and biopsy [81] needles segmentation in iMRI, and pyramidal tract reconstruction [215].

- Physiological parameter estimation: medical images have been used also to estimate some physical and physiological parameters not directly measurable. Examples include iOUS-based flow estimation [216] and assessment of right ventricular function [217], oxygenation level assessment on MHSI [95].
- Workflow analysis: automatic methodologies, strongly relying on OR video images and able to recognize and to analyze each phase of the operation, could promptly and automatically detect possible incidents and/or document the whole procedure [218, 219].

Finally, in the last years, algorithms for converting one image modality to another one have been developed, in particular for radiotherapy application (e.g. MRI to CT, and CBCT to CT) [220, 221, 222, 223].

## 11 Discussion and conclusion

Nowadays, several image modalities are available, each of which offers different characteristics (resolution, invasiveness, surgical compatibility, cost) and different contrast among tissues. The best modality to use for the specific use



case is decided by the surgeon by considering and evaluating all the specific peculiarities of each of them. Depending on the chosen modality, adopting some preventive measure to guarantee the safety of both operators and patient could be necessary. This has also to be considered in robotic-assisted surgery scenarios. An increasing number of clinics have started to increment the type of imaging devices usable by physicians into the OR, especially in large hospital centers. Meanwhile, the last frontier of science in the field is represented by real-time processing of the acquired images to provide the surgeon with additional information. However, the majority of the developed technology is still for research purpose only, without any Food and Drug Administration and/or European Conformity approval.

The aim of this review was to provide the reader with an updated overview about currently available imaging modalities for intraoperative guidance (iOUS, X-ray, OCT, iMRI, video-endoscopy, NM, PA, and Raman spectroscopy). For each modality, physical working principle, technological advancements, and relevant pros and cons were reported and discussed, highlighting sample applications in several surgical scenarios. In view of such information, supported also by a survey about pioneering hybrid surgical rooms and real time image processing algorithms, the importance of image guided surgery for achieving better therapy come to light.

To conclude, we drew a path for helping students, scientist and health care worker, to guess, design and choose the surgical room of the future.

*Conflict of interest* All authors declare that they have no conflict of interest.

*Ethical standards* This article does not contain any studies with human participants or animals performed by any of the authors.

*Informed consent* Informed consent was obtained from all individuals for whom identifying information is included in this article.

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