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# Multimodality cardiac imaging in the 21st century: evolution, advances and future opportunities for innovation

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#### ABSTRACT

Cardiovascular imaging has significantly evolved since the turn of the century. Progress in the last two decades has been marked by advances in every modality used to image the heart, including echocardiography, cardiac magnetic resonance, cardiac CT and nuclear cardiology. There has also been a dramatic increase in hybrid and fusion modalities that leverage the unique capabilities of two imaging techniques simultaneously, as well as the incorporation of artificial intelligence and machine learning into the clinical workflow. These advances in non-invasive cardiac imaging have guided patient management and improved clinical outcomes. The technological developments of the past 20 years have also given rise to new imaging subspecialities and increased the demand for dedicated cardiac imagers who are cross-trained in multiple modalities. This state-of-the-art review summarizes the evolution of multimodality cardiac imaging in the 21st century and highlights opportunities for future innovation.

# INTRODUCTION

Multimodality imaging, including echocardiography, cardiac computed tomography (CCT), cardiac magnetic resonance (CMR) and nuclear cardiology [single-photon emission computed tomography (SPECT) and positron emission tomography (PET)], has fundamentally advanced the understanding and treatment of cardiovascular disease in the 21st century. These advances have impacted the non-invasive evaluation of coronary artery disease, structural heart disease, arrhythmias, and heart failure, as well as guided clinical management and improved patient outcomes. Several special populations are now better served as a result of the advancements in non-invasive imaging, such as patients with cardiac amyloidosis, women with coronary microvascular dysfunction, and high-risk individuals with severe valvular heart disease. Additionally, the use of artificial intelligence and machine learning applications in cardiac imaging has identified previously unrecognized patterns of disease, refined the assessment of cardiovascular risk, and influenced clinical care in an actionable and more personalized way than ever before. The tremendous technological revolution in the last two decades has also given rise to new imaging subspecialities, such as interventional echocardiography, and increased the demand for dedicated cardiac imagers who are cross-trained in multiple modalities. This state-of-the-art review summarizes the evolution of multimodality cardiac imaging in the 21st century and highlights the opportunities for future innovation.

## **ECHOCARDIOGRAPHY**

Echocardiography is often the first-line evaluation for the assessment of cardiac structure and function given the high temporal and spatial resolution, portability, cost-effectiveness and lack of ionizing radiation. In the last two decades, echocardiography has seen the rise of three-dimensional (3D) echocardiography for the quantitative evaluation of left ventricular (LV) function and structural heart disease.<sup>1</sup> Compared to two-dimensional (2D) echocardiography, real-time full volume 3D echocardiography does not use geometric assumptions about LV geometry making it a more accurate and reproducible means of measuring LV volumes and systolic function and has good correlation with CMR.<sup>2,3</sup> Additionally, LV volumes and ejection fraction (EF) derived from 3D echocardiography have been shown to have a stronger association

Figure 1. Three-dimensional transesophageal echocardiography performed during percutaneous mitral valve repair for severe mitral regurgitation secondary to mitral valve prolapse. (a) Mitral valve (surgeon's view) with myxomatous mitral valve, prolapse of the anterior mitral valve leaflet and large regurgitant orifice. (b) Catheter deploying mitral valve clip between anterior and posterior mitral valve leaflets.



with clinical outcomes than those derived from 2D echocardiography.<sup>4</sup> 3D echocardiography is also ideally suited to assess valve function given the nonplanar anatomy and spatial alterations resulting from valvular heart disease. Three-dimensional echocardiography has provided significant mechanistic insight about functional and ischemic mitral regurgitation by demonstrating derangements in the complex relationship of the mitral valve leaflets, chordal attachments, papillary muscles and the LV myocardium.<sup>1</sup> Interventional echocardiography, a new subspecialty in cardiac imaging, frequently employs 3D transesophageal echocardiography for the real-time assessment of valve anatomy, which is integral to guiding percutaneous valvular interventions,

Figure 2. Regional strain analysis with speckle-tracking echocardiography in the apical 4-chamber, 2-chamber, and 3-chamber views demonstrates left ventricular dyssynchrony in a patient with LBBB. The characteristic LBBB contraction pattern on strain imaging includes early terminated shortening in the septal wall, early (pre-stretch) contraction in the lateral wall, and late lateral peak contraction. LBBB, left bundle branch block.





particularly transcatheter aortic valve replacement (TAVR),<sup>5,6</sup> mitral valve clip repair,<sup>7,8</sup> and most recently transcatheter mitral and tricuspid valve implantation (Figure 1).<sup>9–11</sup>

Advances in image-based analysis of local myocardial dynamics, including Doppler tissue imaging (DTI) and speckle-tracking echocardiography (STE), have allowed for the quantitative assessment of subclinical myocardial dysfunction.<sup>12</sup> Myocardial deformation, measured by strain and strain rate using DTI and STE, has demonstrated that early decreases in radial and longitudinal strain and strain rate among patients treated with cardiotoxic oncologic treatments, such as anthracyclines, taxanes and trastuzumab, precede decreases in EF and are therefore capable of detecting prognostically important subclinical LV dysfunction.<sup>13</sup> Similarly, global longitudinal strain (GLS) on STE has been useful in risk stratifying patients with asymptomatic severe aortic stenosis (AS) and preserved EF, such that impaired LV GLS has been associated with a higher risk of developing symptoms and needing aortic valve intervention as compared to patients with normal LV GLS.<sup>14</sup> Detection of LV dyssynchrony with DTI or STE has been associated with long-term survival and is used to optimize cardiac resynchronization therapy in patients with advanced systolic heart failure (Figure 2).<sup>15,16</sup> Regional differences in myocardial dynamics as assessed by STE has been insightful for the detection of cardiac involvement in systemic disease, such as amyloidosis, which exhibits a characteristic apical-sparing pattern.<sup>17</sup> Furthermore, the use of STE for strain and strain rate analysis to quantitate myocardial contraction and relaxation during stress echocardiography is an active area of clinical investigation.<sup>18</sup>

Finally, cardiac point-of-care ultrasound (POCUS), with its compact size, exceptional portability and ease of use, is increasingly utilized in settings such as emergency rooms and critical care settings to provide rapid bedside diagnosis of cardiovascular pathology.<sup>19</sup> This technology has also been successfully deployed to improve access to care in remote regions with limited Figure 3. Coronary artery disease on CCTA reveals severity of luminal stenosis and composition of atherosclerotic plaque in the



vessel wall: (a) non-calcified plaque; (b) mixed plaque with calcified and non-calcified components; (c) densely calcified plaque.

resources, as well as a means to decrease transmission while evaluating cardiac complications during the recent COVID-19 pandemic.<sup>20</sup>

#### CARDIAC COMPUTED TOMOGRAPHY

The use of CCT in clinical practice has dramatically increased in the 21st century. The introduction of multidetector computed tomography (MDCT) in 1998 was an evolutionary leap for anatomic imaging and led to the exponential growth in MDCT technology in the subsequent decade. The current minimum standard for cardiac CT angiography (CCTA) is 64-slice MDCT, which was first available in 2005. By 2008, advancements in CT technology had resulted in 256- and 320-slice MDCT scanners capable of capturing the whole heart in one to two rotations, which significantly decreased both acquisition time and image artifact.<sup>21</sup> Furthermore, the high spatial and temporal resolution of CCTA is ideally suited for the evaluation of coronary artery disease (CAD). Similar to cardiac catheterization, CCTA provides an anatomic assessment of CAD and the degree of luminal stenosis, but unlike invasive angiography, CCTA also reveals the burden and composition of plaque within the vessel wall (Figure 3). These capabilities make CCTA highly sensitive (sensitivity 95-99%) for the identification of both obstructive and non-obstructive CAD and affords a high negative predictive value (NPV 97-99%) for the exclusion of CAD.<sup>22,23</sup> This non-invasive insight about CAD burden can be effectively used to manage and prognosticate patients. For example, nonobstructive CAD, which would not elicit ischemic changes on functional imaging, but is readily identified by CCTA, has been associated with increased adverse cardiac events, particularly among women, even in the absence of obstructive CAD.<sup>24-26</sup> Additionally, the demonstration of non-obstructive disease

would effectively reclassify these patients as needing secondary, rather than primary CAD prevention, which has implications for medical management, such as statin therapy, and is currently being studied in the WARRIOR trial (https://clinicaltrials.gov/ ct2/show/NCT03417388). CCTA also permits the quantification and characterization of atherosclerotic plaque. High-risk plaque characteristics such as positive remodeling, spotty calcification, and low attenuation (<30 HU) plaque have been shown to identify vulnerable coronary lesions that are associated with an increased risk of acute coronary syndrome (ACS).<sup>27–29</sup> Currently, research is being conducted on novel analytical techniques to facilitate the detection and quantification of pericoronary inflammation and atherosclerotic plaque activity on CCTA, which may serve to further improve cardiac risk prediction and optimize clinical outcomes in patients with CAD.<sup>30</sup>

Compared to 20 years ago, improvements in scanner technology, acquisition techniques, and iterative reconstruction software have collectively and significantly minimized radiation exposure during CCTA.<sup>31</sup> Furthermore, although CCTA was only initially capable of yielding an anatomic assessment of CAD, the application of computational fluid dynamics and machine learning to CCTA data sets provides a non-invasive estimation of fractional flow reserve (CT-FFR) and identification of flow-limiting, hemodynamically significant lesions (Figure 4).<sup>32</sup> CT-FFR assesses resistance and flow along the coronary arteries to identify lesion-specific ischemia and has been validated in multiple trials with good correlation with invasive FFR.<sup>33–35</sup> The integration of CT-FFR with CCTA allows for an anatomical and functional assessment of CAD with a single test and results in higher diagnostic accuracy and increased specificity for classification of flow-limiting coronary stenosis than CCTA alone, which is

Figure 4. The degree of stenosis of the left anterior descending artery at the take-off of the first diagonal branch appears similar in the curved planar reformation CCTA images in these two patients. However, CT-FFR analysis demonstrates that the atherosclerotic plaque in the upper row is a flowlimiting stenosis with a CT-FFR value of less than 0.8 after the lesion, while the plaque in the bottom row does not result in a hemodynamically-significant obstruction of coronary blood flow on CT-FFR. CT-FFR, CT-fractionalflow reserve; CCTA, cardiac CT angiography.



important for guiding patient management.<sup>34,35</sup> The combined use of CCTA and CT-FFR has been shown to act as an effective gatekeeper to the catheterization laboratory by reducing the

Figure 5. CCTA demonstrating thrombus (arrow) on aortic valve leaflet after TAVR. CCTA, cardiac CTangiography; TAVR, transcatheter aortic valve replacement.



need for invasive evaluation of patients without lesion-specific ischemia.<sup>36</sup> Additionally, CT-FFR has prognostic implications, such that patients with CAD and normal CT-FFR (>0.80) have lower rates of adverse cardiac events than those with abnormal CT-FFR values of  $\leq 0.80.^{37}$  Furthermore, when adverse plaque

Myocardial CT perfusion (CTP) with pharmacologic stress provides a combined assessment of cardiac anatomy and physiology. Similar to CMR, CTP imaging performed immediately after contrast administration can reveal hypoenhancement corresponding to perfusion defects while delayed imaging, acquired 5–10 min after contrast administration, may show regional hyperenhancement indicating areas of myocardial necrosis or scar.<sup>39</sup> Compared to CCTA alone, CTP increases the diagnostic accuracy for the detection or exclusion of ischemia.<sup>40</sup> CTP performs comparably with CMR and PET and outperforms SPECT for the evaluation of hemodynamically significant CAD.<sup>41</sup> Despite these advantages however, operational challenges, variation in quantitative values, scanner availability and the requisite expertise have limited the widespread adoption of CTP in routine clinical practice.

characteristics on CCTA are integrated with CT-FFR results, the

prognostic stratification is superior to either component alone.<sup>38</sup>

Cardiac CT has also played an integral role in the evaluation and treatment of structural heart disease. The isotropic resolution of cardiac CT allows image manipulation in any plane or orientation without distortion, yielding a true 3D imaging assessment of the heart and surrounding anatomy. This robust capability has led to the increased utilization of cardiac CT to guide percutaneous interventions for valvular heart disease, congenital heart disease and atrial fibrillation. In patients with severe aortic stenosis, cardiac CT has significantly improved the pre-procedural planning process prior to TAVR and provided unique insight about post-TAVR complications, such as acute and subacute thrombosis and infection (Figure 5).<sup>42–45</sup> More recently, cardiac CT has also been employed in patients with mitral and tricuspid valve disease prior to transcatheter interventions.<sup>46</sup> Cardiac CT provides highly detailed information about cardiac anatomy and dimensions to optimize device sizing, as well as reveal anatomic considerations that can determine vascular access routes and reduce the risk of procedural complications.<sup>47,48</sup> In patients with atrial fibrillation, cardiac CT is used to delineate the pulmonary vein anatomy prior to ablation, assess for intracardiac thrombus, and visualize left atrial appendage morphology. Pre-procedural CT measurements are critical to the successful deployment of appendage exclusion devices among patients with contraindications to long-term anticoagulation.<sup>49</sup> Finally, cardiac CT is also showing promise for the detection of cardiac allograft vasculopathy after heart transplantation and identification of cardiomechanical complications among patients with suspected left ventricular assist device (LVAD) malfunction.<sup>50,51</sup>

## CARDIAC MAGNETIC RESONANCE IMAGING

CMR imaging is a highly versatile modality for the evaluation of cardiac pathology. Historically, CMR has been reserved for the evaluation of complex congenital heart disease, cardiac tumors and pericardial disease.<sup>52–54</sup> However, over time CMR has been

shown to be superior to other non-invasive modalities for the assessment of biventricular morphology and function and is considered the reference standard for quantitation of ventricular volumes.<sup>2,55</sup> Additionally, CMR is unique for its tissue characterization capabilities and the identification of myocardial scar, fibrosis, edema and inflammation. As a result, the leading indications for a CMR evaluation include: 1. Investigation of myocarditis and cardiomyopathies; 2. evaluation of CAD and ischemia; and 3. assessment of myocardial viability.<sup>56</sup>

CMR imaging is an unparalleled diagnostic tool in the evaluation of cardiomyopathies and myocarditis. The presence and extent of late gadolinium enhancement (LGE) imaging serves as a critical sequence in the differentiation of ischemic *vs* non-ischemic heart disease.<sup>57</sup> Non-ischemic cardiomyopathies demonstrate

distinct LGE patterns, such as LGE in a non-coronary distribution involving the mid-myocardium, epicardium, and or diffuse subendocardial locations. In addition to LGE imaging, advances in T1, T2, and T2\* imaging and mapping, which are capable of detecting infiltrative disorders, inflammation and edema, also provide insight into non-ischemic etiologies. For instance, myocardial T2 imaging correlates with myocardial free water content, which can be particularly valuable in identifying patients with acute myocarditis (Figure 6).<sup>58,59</sup> The sensitivity of CMR for the detection of acute myocarditis has also been increased by T1 and T2 parametric maps that outperform the original Lake Louise Criteria, which predominantly rely on LGE imaging.<sup>60</sup> In recent years, T1 mapping has also gained clinical application for the detection of cardiac amyloidosis.<sup>61,62</sup> While LGE is useful in the diagnosis of cardiac amyloid, the characteristic pattern of

Figure 6. Acute myocarditis and follow-up evaluation by CMR imaging. (a) LGE imaging demonstrates mid-myocardial and epicardial enhancement involving the lateral and inferolateral left ventricular wall (arrows), in a pattern most characteristic of myocarditis. (b)  $T_2$  weighted imaging reveals hyperintensity in the lateral LV wall (arrows), indicating edema and suggesting active myocardial inflammation. Follow-up CMR imaging was performed 1.5 years later: (c) LGE imaging demonstrates myocardial scarring, as indicated by epicardial and mid-myocardial enhancement in the lateral and inferolateral walls (arrows). (d)  $T_2$  weighted imaging is normal, which indicates that the previously seen myocardial edema has resolved, suggesting the absence of active inflammation. CMR, cardiac magnetic resonance; LGE, late gadolinium enhancement; LV, left ventricular.



Figure 7. Cardiac amyloidosis diagnosed by CMR imaging. (a) LGE imaging demonstrates diffuse subendocardial enhancement, as well as patchy mid-myocardial enhancement (arrows). The diffuse subendocardial pattern of enhancement, in conjunction with the black blood pool, is characteristic for cardiac amyloidosis. (b) Non-contrast T1 mapping demonstrates heterogenous high T1 values in the myocardium. The measured average T1 time was 1407 ms (normal reference =  $950 \pm 21$  ms). CMR, cardiac magneticresonance; LGE, late gadolinium enhancement.



diffuse subendocardial enhancement may not always be present or may occur late in the disease process. Whereas non-contrast T1 mapping can be valuable for identifying amyloid infiltration at an early stage and also has benefit in patients with renal failure, in whom gadolinium may be contraindicated. Quantitative T1 mapping yields significantly higher T1 times in individuals with cardiac amyloid compared with normal controls (Figure 7). With a 1.5 T CMR, a non-contrast myocardial T1 threshold of 1020 ms has greater than 90% accuracy for cardiac involvement in patients with amyloid.<sup>61</sup> These quantitative mapping techniques have also been shown to have application in the diagnosis of heart transplant rejection; hypertrophic cardiomyopathy; myocardial iron



accumulation in hemochromatosis, sickle cell disease and betathalassemia major; and cardiac involvement in systemic diseases, such as sarcoidosis and Fabry disease.<sup>63–65</sup>

LGE in a coronary artery distribution is the hallmark feature of myocardial infarction in CAD (Figure 8). With prolonged coronary artery occlusion, a subendocardial infarct may progress in a transmural fashion, thereby exhibiting transmural enhancement. In the setting of CAD, LGE burden can provide important prognostic information prior to revascularization therapy. The turn-of-the-century landmark publication by Kim et al, revealed that the extent of transmural LGE is inversely proportional to the

Figure 8. Late gadolinium enhancement in a coronary artery distribution is the hallmark feature of myocardial infarction. (a) Subendocardial infarct in the LAD territory, spanning less than 25% myocardial wall thickness (arrows). (b) Myocardial infarction of the left circumflex artery. LGE CMR imaging in the short axis plane demonstrates myocardial wall thinning and transmural enhancement in the inferolateral wall of the left ventricle (arrow). CMR, cardiac magneticresonance; LAD, left anterior descending; LGE, late gadolinium enhancement.



likelihood of functional myocardial recovery following revascularization therapy.<sup>66</sup> These findings have been validated in a number of subsequent studies, which have shown that myocardium with subendocardial infarct (LGE spanning  $\leq 25\%$  wall thickness) has a higher association with functional recovery after revascularization than myocardium demonstrating transmural infract (LGE spanning  $\geq 75\%$  wall thickness), with the latter group experiencing almost no improvement in contractility despite revascularition.<sup>67,68</sup> Hence, LGE provides a valuable non-invasive method of stratifying individuals with myocardial infarct in whom revascularization may offer potential benefit.

Stress CMR has excellent diagnostic and prognostic value.<sup>69</sup> Although stress CMR accounts for less than 5% of stress imaging, CMR has been shown to be more sensitive than other perfusion modalities for the detection of significant CAD and a CMR-guided management strategy for ischemia-inducing CAD has been associated with a lower incidence of coronary revascularization than an invasive FFR-guided strategy with no difference in major adverse events after 1 year.<sup>70,71</sup> Furthermore, CMR perfusion can provide insight on alternative etiologies of chest pain. Due to the high spatial and temporal resolution, CMR perfusion can identify microvascular disease, which may manifest as diffuse subendocardial hypoperfusion on first-pass perfusion CMR.<sup>72</sup> In patients with ACS who are found to have myocardial infarction with non-obstructive coronary arteries (MINOCA), early CMR can narrow the differential diagnosis in 84% of cases, thus distinguishing between myocarditis, myocardial infarction (type II or spontaneous thrombolysis), and Takotsubo cardiomyopathy.73

Despite all of these capabilities and the lack of ionizing radiation, the main limitations for greater utilization of CMR remain the need for highly trained experts for acquisition and interpretation, the requisite equipment, and the long exam duration. The presence of an implantable cardiac device, such as a pacemaker or internal defibrillator, was also a contraindication to CMR until recently. Newer devices have been developed to be MRI compatible, but still require reprogramming into an MRIsafe mode and artifacts that affect LGE and functional evaluations may persist.<sup>74</sup> Finally, artificial intelligence applications for CMR that minimize scan times, improve reproducibility through automated segmentation, and identify scar on non-contrast images for patients with contraindications to gadolinium contrast may make implementation of this highly versatile imaging modality more widespread.<sup>75,76</sup>

#### NUCLEAR CARDIOLOGY

Nuclear cardiology is the most frequently used functional imaging test and as a result has a wealth of evidence related to diagnosis and long-term prognosis. Radionuclide myocardial perfusion imaging is currently dominated by SPECT, which evaluates the relative distribution of coronary blood flow in the myocardium (Figure 9). The sensitivity and specificity of SPECT for the diagnosis of CAD is 87–79 and 73–75%, respectively, varying by the radionuclide and stress modality employed.<sup>77</sup> Since its inception in 1980, SPECT imaging has evolved considerably. Recent developments have included cadmium zinc telluride

(CZT) detectors,  $\gamma$  cameras, iterative reconstruction and  $\frac{1}{2}$  dose or  $\frac{1}{2}$  time software that decrease radiation exposure, expedite image acquisition, and improve image resolution.<sup>78–80</sup> However, despite these technological advances, SPECT remains limited by the qualitative, or at best semi-quantitative, methods for identifying myocardial ischemia. In patients with multivessel CAD, SPECT may underestimate the true extent of disease since the likelihood of detection is highest with severe lesions but lower with milder stenosis. Additionally, because of the reliance upon relative differences in counts on SPECT, patients with a balanced reduction in myocardial blood flow may have a paradoxical normal or near-normal scan despite the presence of extensive high-risk CAD.

In contrast to SPECT, PET myocardial perfusion imaging is capable of true quantification of myocardial perfusion both globally and regionally. Quantifying regional perfusion is useful in patients with diffuse, multivessel CAD where the relative assessment of myocardial perfusion by SPECT may fail to reveal underlying disease.<sup>81</sup> The sensitivity of PET for the diagnosis of CAD is 90-93% with a specificity of 89-92%.<sup>82</sup> PET is also capable of generating absolute measurements of myocardial blood flow. This capability is not only useful for the detection of epicardial CAD, but quantitative PET measurements of blood flow are playing an increasingly important role in the evaluation and management of patients with suspected coronary microvascular dysfunction. Specifically, the inability to increase stress myocardial blood flow >2.0 to 2.4 mL  $\times$  min<sup>-1</sup>  $\times$  g<sup>-1</sup> in the absence of obstructive epicardial disease is indicative of coronary microvascular disease.<sup>83</sup> Additionally, PET has been applied to assess coronary endothelial function in response to pharmacologic therapies (i.e. statin), toxins (i.e. tobacco), and disease states, such as diabetes mellitus, obesity, and hypertension.<sup>82,84</sup> PET is also capable of assessing myocardial viability using the glucose analogue and metabolic tracer fludeoxyglucose, FDG (Figure 10). Although the utility of myocardial viability in guiding clinical care remains uncertain, a pooled analysis demonstrated a weighted mean sensitivity and specificity of 92 and 63%, respectively, for regional functional recovery.<sup>85</sup>

Finally, cardiovascular molecular imaging is a rapidly evolving discipline that aims to visualize specific molecular targets and pathways to provide insight about morphology and pathophysiology. Examples include neuronal imaging to identify patients at risk for ventricular arrhythmia, imaging compounds that target vulnerable plaque prior to ACS, and identifying molecular imaging markers that reflect adverse LV remodeling before the development of overt heart failure.<sup>86–88</sup> Despite the many advantages of PET, its widespread use in clinical care has been limited by the relatively high costs, technical complexities, and requisite professional expertise that was previously restricted to specialized cardiac centers. However, the increasing evidence base combined with the ability to perform myocardial blood flow imaging has led to considerable growth and utilitization of PET in clinical practice.

In addition to the detection of CAD, myocardial perfusion imaging has also been employed in the detection of cardiac Figure 9. Exercise stress (top) and rest (bottom) myocardial perfusion imaging study with SPECT. Reversible changes in the septum, anterior, inferior and apical segments compatible with ischemia. Transient ischemic dilatation is noted with TID index of 1.3. Cardiac catheterization demonstrated proximal 90% LAD stenosis and 90% mid-RCA stenosis. LAD, left anterior descending; RCA, right coronary artery; SPECT, single-photon emission computed tomography; TID, transient ischemic dilation.



manifestations of systemic disease. Transthyretin cardiac amyloidosis (also known as ATTR cardiac amyloidosis) is an increasingly recognized cause of heart failure with preserved ejection fraction (HFpEF). With newly targeted therapies available for the treatment of ATTR cardiac amyloidosis, it is critical to have a non-invasive imaging test to identify and differentiate among HFpEF patients with cardiac amyloidosis. Planar and SPECT imaging using Tc 99m PYP, Tc 99m DPD, or Tc 99m HMDP are useful for the detection of ATTR amyloid fibrils in the myocardium (Figure 11).<sup>89</sup> A recent multicenter study, confirmed that Tc 99m PYP cardiac imaging has a sensitivity of 88% and specificity of 88% for the differentiation of ATTR cardiac amyloidosis from light-chain-related amyloidosis and nonamyloid HFpEF.90 Furthermore, a heart to contralateral (H/CL) ratio of  $\geq$ 1.6 was associated with worse survival among patients with ATTR cardiac amyloidosis.

# HYBRID AND FUSION IMAGING

There is a complex relationship between coronary stenosis and myocardial ischemia. A number of landmark studies in the last two decades have consistently demonstrated that the angiographic severity of coronary lesions is a poor predictor of hemodynamic relevance.<sup>91–93</sup> Importantly, stenosis alone is insufficient to identify flow-limiting lesions among patients with stable CAD. A comparison study of CCTA and SPECT showed that only 32% of obstructive coronary lesions, defined as  $\geq$ 50% stenosis, were associated with perfusion defects on SPECT.<sup>94</sup> Similarly, the FAME trial demonstrated that stenoses of 50–70% on coronary angiography can be functionally significant according to a FFR of  $\leq$ 0.8, while coronary lesions with >70% stenosis may not be ischemia-inducing based on a FFR value of >0.8.<sup>95</sup> Thus, in the last two decades there has been a paradigm shift in the treatment of CAD with emphasis on the importance of myocardial ischemia to guide clinical management.

Figure 10. PET assessment of myocardial viability in patient with triple vessel obstructive coronary artery disease and reduced ejection fraction. Top rows: N-13 ammonia at rest show diminished perfusion in the lateral wall. Lower rows: F-18 FDG reveal preserved metabolic FDG uptake in the corresponding lateral segments, as well as the remaining myocardium, which signifies the presence of viable myocardium. FDG, fludeoxyglucose; PET, positron emission tomography.



Hybrid cardiac imaging, which combines morphologic and anatomic results with functional evaluations of myocardial perfusion, has the ability to detect the presence of coronary lesions and their hemodynamic significance and therefore has superior diagnostic performance compared with anatomic or functional modalities alone. A hybrid approach utilizing SPECT or PET and cardiac CT has allowed for the simultaneous identification of flow-limiting coronary stenosis and ischemia quantification in a single assessment, which may be useful for informing clinical management.<sup>96</sup> Furthermore, when nuclear myocardial perfusion imaging is used in conjunction with CT, the hybrid imaging approach minimizes attenuation artifact and dramatically improves diagnostic and prognostic robustness.<sup>97,98</sup> Image coregistration and fusion of 3D information about myocardial territories and their coronary supply can accurately identify the culprit ischemic lesion in multivessel CAD, which is important since there is evidence that perfusion defects do not correspond to the expected coronary distribution in >50% of cases.<sup>99,100</sup> Hybrid imaging with PET and CT or CMR has also been utilized in the evaluation of cardiac sarcoidosis, which permits the simultaneously evaluation of myocardial inflammation with LGE sequences and correlative metabolic activity on PET images that aids in the differentiation of inflammation and scar (Figure 12).<sup>101</sup>

The 21st century has also seen the rise of fusion imaging, whereby images obtained separately with different modalities are fused

into a composite image. Harmonizing two modalities provides a better understanding of the 3D relationship of anatomy and devices, increases procedural efficiency, and improves clinical outcomes.<sup>102</sup> The overlay of TEE or CT images and fluoroscopy have significantly aided the successful deployment of percutaneous interventions for congenital and structural heart disease.<sup>103,104</sup> CCTA or CMR images superimposed on electrical mapping systems in the electrophysiology laboratory have improved the success of radiofrequency ablation for atrial fibrillation and the placement of LV leads to decrease dyssynchrony with cardiac resynchronization therapy.<sup>102,105</sup>

# ARTIFICIAL INTELLIGENCE AND MACHINE LEARNING IN CARDIAC IMAGING

The most recent advancement in cardiac imaging in the 21st century is the application of artificial intelligence (AI) for the integration of cardiovascular imaging and "big data," which is likely to result in new discoveries, better characterize disease and uniquely personalize therapy. The increasing use of AI may also reduce cost and enhance value during image acquisition, interpretation, reporting, and decision management. Machine learning (ML) is a subset of AI wherein information is acquired autonomously by extracting patterns from large databases giving AI the ability to learn and deep learning is a means of informing associations based on previous experience, effectively training the process so that the probability of correct classification increases.<sup>106,107</sup> Uses of AI and ML that have been applied

Figure 11. Tc-99m Pyrophosphate planar and SPECT imaging for cardiac amyloid. (a) Increased activity is seen over the heart on planar imaging. (b) Quantitative analysis of H/CL ratio is 1.95 (Negative <1.5), strongly suggestive of TTR amyloidosis. C. SPECT imaging confirms intense diffuse uptake in the left ventricular myocardium and to a lesser degree in the visible aspect of the right ventricle. Fine needle aspiration biopsy of the abdominal fat was positive for extracellular amyloid deposition. H/CL, heart-to-contralateral lung; SPECT, single photon emission tomography.



to cardiac imaging include automating quantitative measuring, generating problem notifications and providing diagnostic support tools. Examples of these applications have included: (1) the fully automated LV segmentation and volume measurement on CMR<sup>75,108</sup>; (2) identification of three different echocar-diographic phenotypes among patients with diabetes mellitus Type 2 and the associated distinct clinical profiles<sup>109</sup>; and (3) automated analysis of the myocardium on CCTA to identify

hemodynamically significant coronary stenosis.<sup>110</sup> Integrating clinical data and imaging measures has also improved prediction of prognostic outcomes. ML of combined clinical and CCTA data was more predictive of mortality than either clinical or CCTA metrics alone.<sup>111</sup> Similarly, compared to automated perfusion quantification alone, ML had higher predictive accuracy for major adverse cardiac events using a combination of clinical information and SPECT perfusion assessments.<sup>112</sup> Finally,

Figure 12. Cardiac PET: N-13 ammonia rest images (top rows) demonstrate a perfusion defect in the basal and mid inferoseptum, extending from the epicardium to the subendocardium. F-18 FDG images (lower rows) demonstrate focal hypermetabolism in the areas of perfusion defect, consistent with active inflammation in this area. Hybrid CT and F-18 FDG images of the chest show hyperemtabolic hilar and mediastinal lymphadenopathy, compatible with active chest sarcoidosis. The integration of the chest and cardiac findings are consistent with sarcoidosis. FDG, fluorodeoxyglucose; PET,positron emission tomography.



research using radiomics, the process of obtaining quantitative metrics from images to create big-data data sets, such as where each coronary lesion is characterized by hundreds of different parameters, may further improve cardiac risk prediction and optimize clinical outcomes in patients with CAD.<sup>30</sup> Future development of AI with large imaging registries and repositories will increase diagnostic and prognostic performance, as well as individualize the value of cardiac imaging in clinical medicine.

# CONCLUSIONS

The tremendous technological evolution achieved in noninvasive imaging techniques over the last two decades, including echocardiography, CCT, CMR, and nuclear cardiology have provided clinicians with a large non-invasive armamentarium for the assessment of cardiac disease. Best practice, appropriate use, and clinical guidelines are constantly being updated with this evolving new data. The complementary information gained from different imaging modalities has yielded new insights about cardiovascular pathology and disease progression, guided and optimized patient care, and ultimately improved clinical outcomes. The cardiac imaging of today offers diagnostic, prognostic and risk stratification capabilities that were unimaginable only two decades ago.

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