

## Phenotyping heart failure by echocardiography: imaging of ventricular function and haemodynamics at rest and exercise

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Traditionally, congestive heart failure (HF) was phenotyped by echocardiography or other imaging techniques according to left ventricular (LV) ejection fraction (LVEF). The more recent echocardiographic modality speckle tracking strain is complementary to LVEF, as it is more sensitive to diagnose mild systolic dysfunction. Furthermore, when LV systolic dysfunction is associated with a small, hypertrophic ventricle, EF is often normal or supernormal, whereas LV global longitudinal strain can reveal reduced contractility. In addition, segmental strain patterns may be used to identify specific cardiomyopathies, which in some cases can be treated with patient-specific medicine. In HF with preserved EF (HFpEF), a diagnostic hallmark is elevated LV filling pressure, which can be diagnosed with good accuracy by applying a set of echocardiographic parameters. Patients with HFpEF often have normal filling pressure at rest, and a non-invasive or invasive diastolic stress test may be used to identify abnormal elevation of filling pressure during exercise. The novel parameter LV work index, which incorporates afterload, is a promising tool for quantification of LV contractile function and efficiency. Another novel modality is shear wave imaging for diagnosing stiff ventricles, but clinical utility remains to be determined. In conclusion, echocardiographic imaging of cardiac function should include LV strain as a supplementary method to LVEF. Echocardiographic parameters can identify elevated LV filling pressure with good accuracy and may be applied in the diagnostic workup of patients suspected of HFpEF.

#### **Graphical Abstract**



(A) Calculation of ejection fraction and strain. (B) Systolic strain pattern for different phenotypes. RCA, right coronary artery. (C) Parameters of diastolic function. (D) Myocardial work index by echocardiography. Adapted from Chan et al.<sup>22</sup>

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echocardiography • heart failure • diastolic function • digital twin • left ventricular ejection fraction • strain imaging • systolic function

#### Summary points

- Myocardial strain imaging by speckle tracking echocardiography is complementary to ejection fraction (EF) and should be done when EF is normal in patients suspected heart failure (HF).
- Global longitudinal strain (GLS) is more sensitive than EF to diagnose mild systolic dysfunction.
- In hearts with a small, hypertrophic ventricle, EF is often normal or supernormal, whereas GLS can reveal reduced contractility.
- Several cardiomyopathies can be diagnosed by characteristic distribution patterns of left ventricular (LV) segmental strains.
- In patients suspected of HF, echocardiography can identify elevated LV filling pressure with good accuracy.
- When LV filling pressure is normal at rest, a diastolic stress test may be needed to confirm the HF diagnosis.
- Future development of digital twin technology is expected to facilitate understanding of complex interactions between different biological processes in the failing heart.

#### Introduction

Heart failure (HF) is a highly prevalent condition that is associated with significant morbidity and a poor prognosis. Since the 1980s, HF phenotyping was based mainly on clinical symptoms and signs and on measurement of left ventricular (LV) ejection fraction (LVEF). This categorization was proved successful in HF with reduced EF (HFrEF), as reflected in improved life quality and reduced mortality in response to drugs and devices in this phenotype.<sup>1</sup>

Better insights into the pathophysiology of HF, advances in cardiac imaging, and introduction of therapies targeting specific cardiomyopathies have stimulated implementation of personalized medicine in management of patients with HF. Rather than applying a traditional approach and assuming that 'one size fits all', today, many patients can receive personalized therapies based on more refined phenotyping.

Echocardiography plays a cardinal role in establishing the presence of a cardiac abnormality and in defining specific aetiology of HF. As reviewed in separate state-of-the-art articles in this issue of the journal, other imaging modalities and genetic testing often provide diagnostic information that is complementary to echocardiography. The present article addresses how echocardiography may be applied to improve phenotyping by imaging ventricular function. This article also presents haemodynamic correlates to imaging data to better understand which features of cardiovascular function are reflected in the different phenotypes.

### **Definition of HF**

HF is a clinical syndrome with different aetiologies and diverse pathophysiology rather than a specific disease. Mechanistically, the problem of a failing heart is inability to pump enough blood to meet the body's need for oxygen and nutrients.<sup>2</sup> Limited supply of oxygen to the body causes symptoms of fatigue and exercise intolerance ('forward failure'). Furthermore, as a compensatory mechanism to maintain stroke volume by the Frank–Starling mechanism, there is elevation of LV filling pressure, which tends to cause fluid retention and vascular congestion, resulting in peripheral oedema and breathing problems ('backward failure').

Due to the complexity of the disorder and the diversity of the pathophysiology, it has been challenging to agree upon a unified definition of HF. Recently, an international consensus on its definition was obtained among several medical organizations working with HF. They proposed that HF was defined as a clinical syndrome with symptoms and/or signs caused by a structural and/or functional cardiac abnormality corroborated by elevated natriuretic peptide levels and/or objective evidence of pulmonary or systemic congestion.<sup>3</sup>

### Assessment of LV contractile function

Systolic function refers to the heart's ability to generate force by contraction to eject blood into the aorta. LV pressure–volume analysis is the gold standard for quantifying LV systolic function but requires invasive measurements combined with a loading intervention and is therefore rarely used in clinical settings. Instead, echocardiography is used as the standard method for quantification of LV function in daily clinical work.

## LVEF

LVEF is calculated as stroke volume indexed to end-diastolic volume (EDV) and is used successfully to phenotype and identify patients who need HF therapy. This conventional phenotyping includes the following groups: HFrEF ( $\leq$ 40%), HF with mildly reduced EF (HFmrEF) (41–49%), and HF with preserved EF (HFpEF) ( $\geq$ 50%).<sup>1</sup> There are, however, several limitations of this simplified phenotyping, which are discussed subsequently. First, LVEF has relatively low sensitivity to identify mild systolic dysfunction as detected by strain metrics. Therefore, patients with HFpEF often have systolic dysfunction, as reflected in reduced LV longitudinal shortening. This is illustrated in *Figure 1*, which shows that HFpEF patients with EF > 50% have lower values for LV global longitudinal strain (GLS) than normal controls, consistent with mild systolic dysfunction.

Second, LVEF has limited ability to serve as a prognostic indicator. This is illustrated *Figure 2A*, which is from a large HF study that compared prognosis in patients according to LVEF. It was found that 5-year mortality was similar in patients with  $EF \ge 50\%$ ,  $\le 40\%$ , and 41–49%. These observations are supported by previous studies that have compared mortality in HFrEF and HFpEF.<sup>5</sup>

The use of LVEF as a prognostic indicator is further complicated by a U-shaped relationship between EF and cardiovascular risk, as shown in *Figure 2B*. It is not clear why supernormal EF is associated with high risk but may, in part, be caused by a confounding risk marker, such as LV hypertrophy, which tends to cause small LV cavity volumes. Further studies should explore if the U-shaped association between risk and circumferential LV strain illustrated in *Figure 2C* reflects a similar phenomenon. Potentially, increased circumferential strain is a compensatory mechanism that maintains EF in the early phase of HF when GLS is mildly reduced.<sup>7</sup>

The data in *Figure 2D* are from a combined clinical and modelling study, which showed a much flatter slope for GLS vs. EF than for circumferential strain vs. EF.<sup>8</sup> This would imply that EF is less sensitive



**Figure 1** LV strain (longitudinal and circumferential) in hypertension and HFpEF. Left panel: average longitudinal and circumferential systolic strain among normal controls, hypertensive heart disease, and HFpEF. Right panel: three categories of HFpEF based on LVEF. \*P < 0.0001 vs. controls and between hypertensive heart disease and HFpEF overall for longitudinal strain and circumferential strain.  $^{\#}P < 0.0002$  vs. controls. <sup>†</sup>LVEF-adjusted P < 0.001 compared with controls.<sup>4</sup>

to reductions in longitudinal shortening, which may explain why EF is often normal while GLS is reduced in patients with mild LV systolic dysfunction such as in HFpEF.

Third, EF has limited ability to diagnose specific cardiomyopathies, which is becoming increasingly important with the introduction of patient-specific therapies for some of these diseases. In many cases, assessment of regional myocardial function is important for correct diagnosis of specific cardiomyopathies.

A technical limitation of LVEF is poor reproducibility. When possible, two-dimensional (2D) LVEF should be substituted with threedimensional (3D) LVEF due to its superior reproducibility.

Despite its limitations, LVEF is still the first-line imaging parameter used in patients suspected of having HF.

### Myocardial strain imaging

Strain means deformation and is an excellent parameter for quantification of myocardial function. The current echocardiographic standard is to measure myocardial strain by speckle tracking echocardiography (STE). The most widely used strain parameter of LV systolic function is GLS, which is calculated as the average of peak systolic strain from all LV segments in apical four-, three-, and two-chamber views. Data on GLS are presented along with bull's eye plots of segmental strains, as illustrated by the examples in the *Graphical Abstract*. Measurements of GLS are highly reproducible and comparable among vendors.<sup>9</sup>

Regarding LV segmental strains, there is significant inter-vendor variability, and there is a lack of sufficiently validated reference values. However, distribution patterns of LV segmental strains displayed as bull's eye plots provide important diagnostic information and are used in the diagnostic workup of patients suspected of cardiac amyloidosis, Fabry disease, and other specific cardiomyopathies. This is illustrated in the *Graphical Abstract*. One of the reasons why a reduction in GLS often precedes a reduction in EF is that myofibres that account for longitudinal shortening are located mainly in the vulnerable subendocardium. Furthermore, with concentric hypertrophy, which is common in HFpEF, there is typically a small LV cavity, which may close almost completely in systole, and therefore, EF is normal or supernormal even when stroke volume and contractility are reduced. In these cases, GLS is often reduced. Typical examples of cardiac diseases where EF may not reflect systolic function are hypertrophic cardiomyopathy and amyloidosis.<sup>10,11</sup>

For most echocardiography systems, absolute values for GLS are reported between 18 and 22% in healthy individuals.<sup>12</sup> Values are slightly lower for males than females, and a slight fall in GLS with ageing was observed in females.<sup>13</sup> In adults, average normal values for GLS are around 20%, and GLS < 16% is considered subnormal. Values of GLS between 16 and 18% are considered borderline.<sup>13</sup> By convention, negative strain means shortening and positive strain means lengthening or thickening. To avoid confusion when communicating and reporting strain data clinically, we recommend referring to strain in absolute values.

For GLS, there are only small differences between equipment for most of the vendors, but there are some exceptions.<sup>9</sup> Therefore, it is essential to use reference values that are defined for each specific machine and software. In particular, when doing serial evaluations, it is important to use not only similar equipment but also similar algorithms for calculating strain.

Whereas GLS is widely implemented in clinical practice, circumferential and radial strains are used mainly for research. When measuring LV global circumferential strain (GCS), one should be aware of the large transmural gradient with markedly higher absolute values for subendocardial than subepicardial strains. This complicates the definition of normal reference values for GCS.<sup>14,15</sup> There is also a base-to-apex gradient, with the lowest absolute value at the mitral valve level, which increases progressively towards the apex. Therefore, values for GCS should be reported and interpreted with specification of location of sampling volume.



**Figure 2** EF as a prognostic indicator: (A) 5-year mortality was similar in HF patients with preserved, borderline, and reduced LVEF. Modified from Shah *et al.*<sup>5</sup> (B) A U-shaped relationship was observed between LVEF and adjusted hazard ratios in patients with HF (number of echocardiograms = 40 616). Error bars, 95% confidence interval.<sup>6</sup> (C) A U-shaped relationship was observed between LV GCS and the incidence rate of HF and/or CD (2874 patients).<sup>7</sup> (D) Relationships between EF and LV strains, showing a much flatter slope for GLS vs. EF than for GCS vs. EF. CD, cardiovascular death; EF, ejection fraction; GCS, global circumferential strain; GLS, global longitudinal strain. EDV, end-diastolic volume; WT, wall thickness. Adapted from Stokke et *al.*<sup>8</sup>

As suggested by recent data from a large retrospective study of a general population, elevated GCS was independently associated with a higher risk of HF/cardiac death when LVEF was above 50% (*Figure 2C*).<sup>7</sup> These observations, suggesting a role for measuring LV GCS clinically, need to be tested in future prospective studies.

Measurement of radial strain by STE is challenging because fewer speckles are present, and similar to circumferential strain, radial strains increase markedly from the outer to the inner layers of the LV wall due to a geometrical effect. There is also a transmural gradient for longitudinal strain, but it is much smaller than for circumferential and radial strains due to a larger radius of curvature in the long axis.<sup>16</sup>

Strain imaging may also be used to measure LV twist and torsion, but so far, this application has been limited to research studies.<sup>17</sup> The strain rate is another parameter that is feasible by STE but has so far not been implemented in clinical routine.

As explained in this section, myocardial strain imaging is a useful supplement to EF in HF diagnostics. Measurement of GLS should be considered in every patient who is evaluated for potential systolic dysfunction. For diagnosing specific cardiomyopathies, LV strain provides valuable diagnostic information that cannot be obtained by measuring EF or by visual assessment of contractile function. In addition, GLS is a strong prognostic marker.

## Other parameters of systolic function

Cardiac output is an important parameter of systolic function, which is expressed as the amount of blood pumped out in the aorta per time unit. Cardiac output can be measured using the Doppler velocity– time integral combined with the LV outflow tract diameter to measure stroke volume, which is then multiplied by the heart rate. Peak systolic mitral annular velocity (s') using tissue Doppler and mitral annular plane



**Figure 3** (A) Calculation of MW indices in a normal subject and in a patient with cardiomyopathy.<sup>20</sup> (B) Measurements in a patient with congestive HF and left bundle branch block. The formula for calculation of MW efficiency (WE) is shown. There is low WE in the septum due to substantial wasted work (WW) and therefore low global WE, as shown in the bull's eye plot. Arrows indicate the direction of rotation of pressure–strain coordinates. (*C*) Reference ranges for normal MW indices.<sup>21</sup> (*D*) Hypothetical illustration suggesting how the echocardiographic MW index may be used as an indicator of pump function and to reflect myocardial workload as a stimulus to adverse remodelling. Data adapted from Chan *et al.*<sup>22</sup> showing a patient with non-ischaemic cardiomyopathy (left), one with hypertension (right), and a normal subject (centre).

systolic excursion (MAPSE) using M-mode are useful alternatives to LVEF and strain in patients with poor image quality.<sup>18</sup>

### Myocardial work and efficiency

Myocardial work (MW) is a recent non-invasive modality that combines LV strain with a non-invasive estimate of LV pressure via cuff blood pressure.<sup>19</sup> It includes a tool that shows the pressure–strain curves. Since MW indices incorporate systolic pressure, these parameters may be applied during changes in afterload. Furthermore, whereas GLS provides a measure at only one time point during the heart cycle, work utilizes strain values from the entire systole from onset contraction until onset of LV filling (*Figure 3A*). In addition, this modality includes a measure of efficiency and therefore provides more comprehensive data on LV function than by just measuring strain. Furthermore, regional differences in MW correlate with regional myocardial glucose metabolism, evaluated using positron emission tomography (PET) imaging.<sup>19</sup>

The MW index is calculated by differentiation of the strain curve and multiplying it with instantaneous LV pressure. This product is a measure of instantaneous power, which is integrated over time from mitral valve closure to mitral valve opening and gives segmental and global MW.<sup>23</sup> Alternatively, MW can also be calculated as the area of the LV pressure–strain loop.<sup>19</sup> Importantly, these estimates of work use pressure as a surrogate for force, use relative dimension, and do not incorporate radii of curvature. Furthermore, the LV pressure estimate does not take into consideration individual differences in LV diastolic pressure. These limitations should be kept in mind when interpreting MW indices.

The LV global work index (GWI) is calculated as an average of segmental values. As illustrated in *Figure 3*, several different work indices may be calculated. Constructive work (CW) is defined as work that contributes to global LV pump function and is measured as work during segmental shortening. In dysfunctional ventricles, there may be segments that lengthen in systole, and the work performed on these segments by other parts of the ventricle represents a waste of energy. Calculation of wasted work (WW) is illustrated in *Figure 3B*. Myocardial shortening during LV isovolumic relaxation (post-systolic shortening) is also considered a waste of energy. As illustrated in *Figure 3*, work efficiency (WE) is calculated as CW divided by the sum of CW and WW.

Approximate normal values of the indices of work are as follows: GWI 1900 mmHg%, global CW 2200 mmHg%, and global WE 96% (*Figure 3C*). The GWI is slightly higher in women than in men, and it increases with age.

The MW index based on LV pressure–strain analysis measures global as well as segmental work, which may be of importance to localize segments with impaired performance, and in some disorders, it may be important to identify segments with abnormally high workload or asymmetry in workload, as illustrated in *Figure 3B* and *D*.

Studies of the clinical value of MW indices have been published in the field of cardio-oncology<sup>24</sup> and in patients who are candidates for cardiac resynchronization therapy.<sup>25</sup> There are also promising data on application of MW indices in the evaluation of patients with ischaemic heart diseases or valvular heart diseases. The clinical demonstration of its value remains a matter of large prospective studies. The 'tool' remains young and is a very promising less load–dependent method for assessing LV systolic function.

### Cardiac power

Cardiac power is a measure of cardiac performance that integrates pressure (afterload), flow, and heart rate and expresses the energy transfer from the LV to the aorta per unit time. The unit is Watt, equal to 1 J/s.

Cardiac power = stroke volume  $\times$  mean arterial pressure  $\times$  heart rate  $\times k$ .

What is needed for calculation of cardiac power is stroke volume and simultaneous mean aortic pressure. Stroke volume can be measured at the LV outflow tract from Doppler velocities and outflow tract diameter, and *k* is a conversion constant to Watt/100 g LV myocardium.<sup>26</sup> A large study in patients suspected of heart disease with normal EF showed that peak cardiac power calculated during physical exercise was a more powerful prognostic marker than resting power and EF.<sup>11,26</sup>

As reviewed recently,<sup>11</sup> several studies indicate that cardiac power is a strong predictor of mortality in HF patients regardless of EF. This suggests that cardiac power could be a more suitable measure of systolic function than EF. A limitation of peak power, however, is that the measurement is somewhat complicated since a stress test with peak performance is needed to identify peak power. When compared with work based on segmental strain analysis, power is exclusively a global parameter and does not provide data on regional function or LV efficiency.

The novel PV-derived measures MW, power, and efficiency may improve phenotyping of HF, but it remains to be shown that using these novel parameters to guide treatment results in better health outcomes.

## Methods to evaluate LV diastolic function

There are no good pathophysiological reasons to maintain a strict distinction between LV diastolic and systolic dysfunction, as was done previously by using the terms diastolic and systolic HF, respectively. The two phases of the cardiac cycle are tightly coupled so that a reduction in systolic function leads to impairment of diastolic function due to associated slowing of myocardial relaxation and loss of restoring forces, which impair LV filling. Furthermore, reflexes activated by reduced cardiac output lead to translocation of blood from the venous reservoirs to the central circulation that increases LV filling pressure and activates the Frank–Starling mechanism as a compensatory mechanism to maintain stroke volume. Long-term compensatory mechanisms include fluid retention, and there is typically macro- and microscopic adverse remodelling of the LV, which may increase diastolic stiffness.

Figure 4A illustrates the mechanisms of diastolic dysfunction. The physiological principles of normal diastolic function include fast LV relaxation that causes a rapid fall in LV pressure, release of restoring forces that cause diastolic suction, and a compliant ventricle that allows filling with little rise in diastolic pressure. In HF, these mechanisms may fail, which leads to compensatory elevation of LV diastolic pressure, which may cause pulmonary vascular congestion and shortness of breath. *Figure 4B* illustrates how diastolic function can be measured by invasive reference methods.

In routine clinical practice, diastolic function is evaluated by measuring echocardiographic parameters that reflect LV relaxation and diastolic stiffness. The *Graphical Abstract (Panel C)* illustrates echocardiographic parameters of diastolic function.

Useful echocardiographic markers of LV diastolic function include mitral early (E) and atrial contraction–induced (A) blood flow velocities, the E/A ratio, early diastolic mitral annular velocity (e'), the E/e' ratio, left atrial (LA) volume, and LA reservoir strain. Pulmonary artery systolic pressure estimated by measurement of tricuspid regurgitation velocity is also used as a marker of LV filling pressure. In addition, mitral E deceleration time, which is related to LV diastolic stiffness, and duration of pulmonary venous reverse velocity during atrial contraction, which is related to LV enddiastolic pressure (LVEDP), may be used as supplementary markers when evaluating diastolic function. Each one of these parameters is related to diastolic function, but the strength of the association for single parameters is only moderate, and therefore, none of the indices should be used as single parameters when assessing LV diastolic function. By using a combination of echocardiographic parameters, however, it is possible to assess and evaluate LV diastolic function non-invasively. Details regarding each of the echocardiographic parameters used in the evaluation of diastolic function are presented in more detail in previously published reports on the topic.<sup>29,30</sup>

## Estimation of LV filling pressure by echocardiography

Since HF symptoms are rather non-specific and EF is often normal as in HFpEF, it is important to search for objective measures of heart dysfunction. Elevated LV filling pressure is a hallmark of HF and should be assessed routinely in patients suspected of HFpEF. In patients with HFrEF and symptoms of pulmonary vascular congestion, it is also important to know LV filling pressure.

When using echocardiographic parameters to assess LV filling pressure, it is important to understand that there are several definitions of filling pressure. Since the LA–LV pressure gradient represents the driving force for LV filling, LA mean pressure is named LV filling pressure. Because LA pressure is rarely available, the indirect measures pulmonary capillary wedge pressure (PCWP) and LV pre-atrial contraction pressure (pre-A pressure) are used as parameters of LV filling pressure. In most patients, PCWP and LV pre-A pressure correspond well with mean LA pressure. Finally, LVEDP is often used as a parameter of LV filling pressure but may markedly exceed LA mean pressure. *Figure 5* illustrates the different definitions of LV filling pressure.

When the issue is pulmonary vascular congestion, the most relevant parameter of filling pressure is PCWP or LV pre-A pressure since they represent LA mean pressure, which determines pulmonary venous pressure. When considering LV mechanical function, however, LVEDP, which represents LV preload, is a more appropriate measure of filling pressure. In a ventricle with normal function, LVEDP is typically a few mmHg higher than pre-A pressure. In patients with a stiff ventricle and acute HF, however, LVEDP often exceeds LV pre-A pressure by >10 mmHg.

Figure 6A shows an algorithm for assessing LV filling pressure (LA mean pressure) in patients suspected of HF or with established HF regardless of EF. Several parameters that are related to LV relaxation, restoring forces, or diastolic stiffness are used in combination and can differentiate between normal and elevated LV filling pressures with good accuracy. None of the parameters should be used as a stand-alone marker of filling pressure due to limited diagnostic accuracy for single parameters. Importantly, this algorithm should not be applied in acute HF since some of the parameters have a weaker association with filling pressure in acute patients. When assessing filling pressure by echocardiography, one should incorporate clinical data when available, and other diagnostic information such as natriuretic peptides or chest X-ray should be considered.

Figure 6B shows the current criteria for the definition of diastolic dysfunction based on a set of echocardiographic parameters.<sup>30</sup> Figure 6C shows criteria for grading of diastolic dysfunction based on mitral flow velocity patterns and estimates of LV filling pressure.<sup>30</sup>

#### **Diastolic stress test**

In patients with HFpEF, LV filling pressure is often normal at rest, and an exercise test is needed to demonstrate elevated filling pressure.<sup>32</sup> *Figure 7A* compares haemodynamic response to exercise in a normal heart and a failing heart. In the normal heart (left panel), the transmitral pressure gradient and flow rate increased during exercise with no rise in LA pressure. This was in part due to diastolic suction, as indicated by a reduction in LV minimum pressure to negative values.



**Figure 4** (*A*) The three fundamental mechanisms of LV diastolic dysfunction are impaired myocardial relaxation, loss of restoring forces, and increased passive elastic stiffness. Each one of these mechanisms may impair LV filling, and as a compensatory mechanism, there is elevated LV filling pressure. Based on Opdahl *et al.*<sup>27</sup>  $L_{min}$ , minimum length of the compressed spring;  $L_0$ , unstressed length. (*B*) Illustration of invasive methods for measuring diastolic function. The left panel shows calculation of the time constant of LV isovolumic pressure fall (tau).<sup>28</sup> The middle panel shows LV diastolic stiffness calculated as the slope of the diastolic PV curve. The right panel shows the measurement of LV filling pressure.

During congestive HF (right panel), there was loss of diastolic suction, as indicated by elevated minimum LV pressure, and increased transmitral flow during exercise was attributed to a marked increase in LA pressure. *Figure* 7B shows data from two patients, one with slightly negative LV early diastolic pressures during exercise and one with marked elevation of early and late diastolic pressures, indicating diastolic dysfunction.

A non-invasive diastolic stress test with measurement of E/e' and peak TR velocity as markers of LV filling pressure during exercise can be added in the setting of suspected HFpEF and normal resting LV filling pressure (*Figure 8A*).<sup>34</sup> Candidates for the test are patients with Grade I diastolic dysfunction and signs of delayed myocardial relaxation as indicated by septal e' < 7 or lateral e' < 10 cm/s. Criteria for positive diastolic stress test are signs of elevated filling pressure, as shown in

*Figure 8A.* For further details of the test, it is referred to Ha *et al.*<sup>35</sup> In some cases, an invasive diastolic stress test may be needed for a conclusive diagnosis of HFpEF, as illustrated in *Figure 8B.* 

### The LA as a mirror of LV function

Imaging of the LA provides important diagnostic information in patients suspected of HF, as summarized in *Figure 9*. In the absence of atrial arrhythmias, an enlarged LA is often the result of long-standing elevation of LV filling pressure. The recommended upper normal limit for LAVi by 2D echocardiography is 34 mL/m<sup>2</sup>. However, ~10% of apparently heart-healthy individuals have LAVi above 34 mL/m<sup>2.40</sup> LA volume can also be quantified by 3D echocardiography and cardiac magnetic



Figure 5 Definitions of LV filling pressure. The left panel shows recordings of pulmonary arterial pressure along with PCWP. The right panel shows simultaneous recordings of LV and LA pressure, and LV pre-A pressure and LVEDP are indicated. The horizontal dashed line indicates mean LA pressure.



**Figure 6** (A) Algorithm for assessing LV filling pressure by echocardiography. According to a consensus document from EACVI.<sup>31</sup> LBBB, left bundle branch block; RV, right ventricular; CRT, cardiac resynchronization therapy; HCM, hypertrophic cardiomyopathy; MR, mitral regurgitation; MS, mitral stenosis; MAC, mitral annular calcification; MV, mitral valve. (B) Criteria for normal and abnormal LV diastolic function. (C) Criteria for grading of diastolic dysfunction. According to a consensus document.<sup>31</sup>



**Figure 7** (A) Loss of diastolic suction in the failing heart: experimental study showing a normal heart (left panel), which generates markedly negative diastolic pressure during exercise, causing LV filling by suction. Thereby, the normal heart can increase mitral *E* with no rise in LA pressure. During HF (right panel), LV minimum pressure does not decrease during exercise and transmitral flow increases by elevation of LA pressure. Transmitral flow rate was measured as dV/dt. Adapted from Cheng et al.<sup>31</sup> (B) Recordings from two patients 1 year after percutaneous coronary intervention but no coronary stenosis at the time of the study. Patient A responds to bicycle exercise with mild elevation of LVEDP and a fall in minimum LV pressure (Pmin), indicating maintained diastolic suction. In Patient B, however, LVEDP approaches 30 mmHg during exercise and there is a marked elevation of minimum LV pressure, indicating loss of diastolic suction. To maintain LV filling during exercise, Patient B would require marked elevation of LA pressure. Adapted from Hong et al.<sup>33</sup>

resonance (CMR) (of note, values derived from 3D echocardiography and CMR are usually greater than those derived from 2D echocardiography).

When using LA strain to assess diastolic function, elevated LV filling pressure is reflected in reductions in LA reservoir and pump strains (*Figure 9C*). Recent studies have shown that LA strain has a stronger correlation with invasive LV filling pressure than LAVi.<sup>39</sup> There are small age– and sex-related differences in normal values for LA reservoir and pump strains.<sup>36</sup> Values for LA reservoir strain < 19–23% are considered abnormally low.

The optimal cut-off to differentiate between normal and elevated LV filling pressures was 18% for LA reservoir strain and 8% for pump strain, when defining PCWP > 12 mmHg as elevated, and 16 and 6%,

respectively, when using PCWP  $\geq$  15 mmHg as a criterion for elevated filling pressure.<sup>39</sup> The association between LA strain and LV filling pressure was strongest in patients with reduced LVEF. In the most recent EACVI consensus document on imaging of patients suspected of HFpEF, it is recommended to include LA reservoir strain as a parameter of LV filling pressure (*Figure 6A*).

# Diastolic stiffness by cardiac shear wave elastography

Increased LV diastolic stiffness is a cardinal feature of HFpEF, but previously, no non-invasive parameter of diastolic stiffness was available.



**Figure 8** (A) Illustration of a non-invasive diastolic stress test using echocardiography. The inserted traces show mitral flow velocity, mitral annular velocity, and tricuspid regurgitant velocity at rest and during exercise. (B) Illustration of an invasive diastolic stress test with bicycle exercise during right heart catheterization. During the test, PCWP as measure of LV filling pressure is recorded.

Cardiac shear wave elastography was recently proposed as a method to assess LV stiffness.

It is well established that the elastance or stiffness of the myocardium is related to how and at which velocity a shear wave is propagated along the myocardium. With technological advances in echocardiography, it has become possible to image the velocity of the shear wave along the myocardium. The technique is based on high–frame rate shear wave elastography and was introduced very recently in the human heart.<sup>41</sup> The shear wave is based on a tissue displacement perpendicular to the wave propagation direction, which originates from a vibration at the onset region. This vibration can originate naturally upon valve closure—aortic and mitral valves when focusing on the LV—or might be induced mechanically by the probe or another external source.<sup>42</sup> The shear wave velocity is then calculated from the M-mode along the myocardium from base to apex. When three LV imaging planes are acquired, it is possible to map the shear wave velocity on a LV bull's eye plot (*Figure 10*).<sup>43</sup>

There have been several pre-clinical and clinical studies that clearly demonstrate the value of shear wave imaging for the evaluation of myocardial stiffness.<sup>43</sup> Nevertheless, shear wave velocity is a surrogate of myocardial stiffness and might be limited by confounding mechanical and/or haemodynamic factors. Therefore, it remains to be studied the ideal setting for shear wave imaging accounting for these factors. And ultimately, it remains to be studied how shear wave velocity is related to global cardiac stiffness as quantified from the LVEDP-volume relationship. $^{42}$ 

### Use of echocardiography to differentiate between specific cardiomyopathies

Cardiomyopathy is defined as a myocardial disorder in which the heart muscle is structurally and functionally abnormal in the absence of coronary artery disease, hypertension, valvular disease, and congenital heart disease sufficient to cause the observed myocardial abnormality.<sup>44</sup> The diagnosis is often challenging, and in many cases, echocardiography does not provide all the diagnostic information needed. Therefore, supplementary imaging by CMR, nuclear techniques, computed tomography (CT), and genetic testing is often needed.

With the introduction of therapies for several cardiomyopathies, it is increasingly important to be aware of echocardiographic features of the different phenotypes, such as amyloidosis, Fabry disease, and glycogen



**Figure 9** The LA as a biomarker in HF. (A) Prevalence of LA enlargement in HFpEF patients.<sup>37</sup> (B) LA volume as a marker of LV filling pressure in patients evaluated for HF. Data from a multicentre study in 450 patients with HF of different aetiologies.<sup>38</sup> (C) LA strain as a marker of LV filling pressure. Data from a multicentre study of 322 patients with cardiovascular disease of different aetiologies.<sup>39</sup> Left: relationship between LA reservoir strain and LV filling pressure. Right: receiver operating characteristic curves showing the ability of LA reservoir strain to classify LV filling pressure as normal or elevated. Two different definitions of elevated LV filling pressure were used with cut-offs of >12 and ≥15 mmHg. Classification was best in patients with reduced systolic function. Adapted from Inoue et al.<sup>39</sup>

storage disease, among others. Distribution patterns of segmental myocardial strains may provide diagnostic clues.

### **Right ventricular function**

The presence of right ventricular (RV) dysfunction in HF is strongly associated with increased morbidity and mortality.<sup>45</sup> Right-sided HF is present when there is evidence of RV dysfunction and signs/symptoms of RV failure.<sup>46</sup>

Echocardiography is the first-line imaging modality used in patients with suspected RV dysfunction and/or pulmonary hypertension. It provides a quantification of right-sided cardiac chamber sizes and function and an estimation of pulmonary arterial systolic pressure (PASP) using the peak tricuspid regurgitation systolic velocity with a cut-off value of >2.8 m/s signifying pulmonary hypertension. RV systolic function is assessed by parameters similar to its counterpart, the LV. These include tricuspid annular plane systolic excursion (TAPSE), fractional area change (FAC), s', averaged peak longitudinal strain over the three segments of the RV free wall, or global RV strain, which includes both the

fee wall and the septum and 3D RVEF. Estimation of right atrial pressure, RV hypertrophy, and septal motion is also performed.

The most frequently used parameter of systolic function is TAPSE with a cut-off value of <17 mm signifying dysfunction followed by FAC, with a cut-off value of <35%. TAPSE and FAC are the most studied parameters with accumulating evidence in relation to prognosis and should preferably be assessed in all patients if possible.<sup>46,47</sup> RV strain, with a cut-off value of <20% for impaired RV free wall strain (<23% in case of severe tricuspid regurgitation), is angle independent and may detect regional changes when conventional parameters are normal.<sup>48</sup> It is also less sensitive to tethering effects of the LV, which may influence both TAPSE and s'. 3D RVEF with a cut-off of <45% is an emerging method to quantify systolic function.

Septal position and motion during the cardiac cycle are important in the evaluation of RV dysfunction. Ventricular interdependency is more pronounced in a setting of biventricular failure affecting the septum. In general, septal flattening during systole is associated with RV pressure overload and during diastole with RV volume overload, in both cases an effect of the reduced LV-to-RV transseptal pressure gradient.



**Figure 10** Schematic representation of mechanical shear wave velocity acquisition (left) and example of shear wave mapping for quantifying passive stiffness (right), based on Salles et al.<sup>43</sup> High–frame rate M-mode echocardiography along the myocardium captures the tissue displacement acceleration and deceleration originating from mitral valve closure. The slope of the peak displacement over time and over myocardial length gives the shear wave velocity. A stiff myocardium is characterized by a high shear wave velocity. LV, left ventricle.



Figure 11 Use of digital twin technologies to extract cardiac functional biomarkers, by either mechanistic models that extract the parameters that rule LV systolic and diastolic function or statistical models that learn from previous examples to rank the disease stage (systolic and diastolic indices).<sup>50</sup>

The RV is sensitive to changes in afterload, and assessment of the interplay between RV contractility and afterload is important. The ratio of end-systolic elastance (Ees) (ventricular contractility) to arterial elastance (Ea) (end-systolic pressure/stroke volume) is obtained invasively and is considered the gold standard of RV–pulmonary arterial coupling. The optimal Ees/Ea is between 1.5

and 2, where a ratio of <0.8–0.6 has been associated with worse outcomes.<sup>49</sup> Low values of the non-invasive surrogate, the TAPSE/ PASP ratio, are associated with worse prognosis in both HFrEF and HFpEF.<sup>49</sup>

When RV images by echocardiography are suboptimal, which occurs especially in obesity and chronic obstructive pulmonary disease, or a specific diagnosis such as ARVC is suspected, further imaging with CMR is necessary.

## A digital twin of systolic and diastolic performance

The ability to build a computational representation of patient-specific LV performance, i.e. its digital twin, offers new opportunities for better management of HF. A digital twin is a model, a simplified representation of reality, which brings a computer-enhanced ability to reason, either through deduction (using mechanistic models) or through induction (using statistic models).<sup>50</sup>

Unveiling the hidden parameters that govern the heartbeat is one of the main values provided by a digital twin (*Figure 11*). Systole may be simplified into the ability to generate tension by myocytes. And there are two main mechanistic processes that govern filling, the active relaxation of myocytes and the passive storage of strain energy. The quest is then for the extraction of the temporal profile of active tension (generation and relaxation) and the stiffness of the myocardium. The way to estimate these key hidden parameters is the personalization of a mechanical model accounting for the 3D anatomy, material constitutive parameters, and cellular contraction and relaxation.<sup>51</sup>

Decaying active tension and myocardial stiffness become the fundamental properties able to dissect out the aetiology of impaired filling. These model-derived biomarkers may provide novel and more specific myocardial diagnostics than global pressure-volume loop–derived chamber stiffness.<sup>52</sup> There are nevertheless a range of challenges that need careful consideration in the extraction of these LV functional biomarkers.

The first challenge is access to the right data, specifically filling pressure. In fact, one would need the pericardial pressure to get the actual pressure difference that drives diastolic filling. Taking informed guesses of filling pressure, the healthy stiffness of the human myocardium has been estimated at  $1.2 \pm 0.4$  kPa.<sup>52</sup> Novel methods to estimate filling pressure would be a promising strategy to get these needed data.

The second challenge is the choice of modelling assumptions that are suitable for the question asked and the data available. Cardiac mechanics is a multiscale process spanning through organ, tissue, cell, and ion levels. But the data for each patient are far too limited to personalize models at all those scales. Assumptions for the orientation of fibre bundles for tissue incompressibility or for reference configuration are part of the collection of model choices needed to hit the right level of complexity.<sup>51,52</sup>

Even at the tissue level, myocardial tissue displays a non-linear behaviour that is difficult to parameterize with the limited range of deformation observed during a heartbeat. In other words, it is difficult to uncouple the linear and exponential parts of the constitutive material behaviour,<sup>51</sup> and previous works mainly aim to estimate the linear one. The choice of metrics that fundamentally remove the interplay, such as energy cost function, is a promising strategy to address it.<sup>53</sup>

Once the hidden parameters are unveiled, simulations hold the potential to predict long-term effects of concentric or eccentric remodelling. Digital twin technologies also encompass the ability to teach machines how to interpret medical images through statistical models, i.e. machine learning. These models extract the hidden patterns in the data to solve a task and have for example recently been used to extract HF severity via random forest models.<sup>54</sup> The main challenges here are related to statistical inductive inference, i.e. bounds of generality and robustness and the lack of interpretability or mechanisms that explain the inference.

Although digital twin technology is at an early stage, it holds promise as a future approach for a better understanding of mechanisms of HF and may serve as a means to refine phenotyping.

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#### Data availability

No new data were generated or analysed in support of this research.

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