SCIENTIFIC REPORTS

natureresearch

OPEN

Triple-marker cardiac MRI detects sequential tissue changes of healing myocardium after a hydrogel-based therapy

Maaike van den Boomen (1^{1,2,3}, Hanne B. Kause⁴, Hans C. van Assen⁴, Patricia Y. W. Dankers^{5,6}, Carlijn V. C. Bouten^{1,5} & Katrien Vandoorne^{1*}

Regenerative therapies based on injectable biomaterials, hold an unparalleled potential for treating myocardial ischemia. Yet, noninvasive evaluation of their efficacy has been lagging behind. Here, we report the development and longitudinal application of multiparametric cardiac magnetic resonance imaging (MRI) to evaluate a hydrogel-based cardiac regenerative therapy. A pH-switchable hydrogel was loaded with slow releasing insulin growth factor 1 and vascular endothelial growth factor, followed by intramyocardial injection in a mouse model of ischemia reperfusion injury. Longitudinal cardiac MRI assessed three hallmarks of cardiac regeneration: angiogenesis, resolution of fibrosis and (re)muscularization after infarction. The multiparametric approach contained dynamic contrast enhanced MRI that measured improved vessel features by assessing fractional blood volume and permeability*surface area product, T₁-mapping that displayed reduced fibrosis, and tagging MRI that showed improved regional myocardial strain in hydrogel treated infarcts. Finally, standard volumetric MRI demonstrated improved left ventricular functioning in hydrogel treated mice followed over time. Histology confirmed MR-based vessel features and fibrotic measurements. Our novel triple-marker strategy enabled detection of ameliorated regeneration in hydrogel treated hearts highlighting the translational potential of these longitudinal MRI approaches.

Cardiovascular diseases, including myocardial infarction (MI), remain the leading cause of mortality across the world¹. MI is caused by an occlusion of a coronary artery, resulting in cardiomyocyte cell death due to insufficient nutrient and oxygen supply. This primary injury provokes a cascade of events that eventually could lead to cardiac remodeling and heart failure. Firstly, local cell death induces the inflammatory phase of infarct healing, starting shortly after the MI. Blood vessels become permeable allowing inflammatory cells to clean the wound of dead cells and debris². Secondly, the proliferative phase begins several days after MI. Activated myofibroblasts produce extracellular matrix proteins accompanied by angiogenesis at the infarct borders. Finally, during maturation phase a collagen-rich scar is formed, replacing viable myocardium and stabilizing the ventricular wall. Because of the loss of healthy cardiomyocytes by scar formation, the non-ischemic remote myocardium undergoes hypertrophy to compensate for the reduced contractile force development after acute MI. Chronically, adverse cardiac remodeling deteriorates cardiac function resulting in heart failure development³.

Several regenerative approaches attempting to improve outcome or even regenerate the damaged heart after MI, are still in their infancy. Highly promising strategies to regenerate viable myocardium by grafting or activating stem and/or progenitor cells or by re-entering cardiac myocytes into the cell cycle are still an unfulfilled ambition⁴. Transplantation of adult stem cells improve short-term cardiac function post-MI, yet excreted paracrine

¹Department of Biomedical Engineering, Cell-Matrix Interaction for Cardiovascular Tissue Regeneration, Eindhoven University of Technology, Eindhoven, The Netherlands. ²Department of Radiology, University Medical Center Groningen, University of Groningen, Groningen, Netherlands. ³Department of Radiology, Athinoula A. Martinos Center for Biomedical Imaging, Massachusetts General Hospital, Harvard Medical School, Charlestown, MA, United States. ⁴Department of Electrical Engineering, Eindhoven University of Technology, Eindhoven, The Netherlands. ⁵Institute for Complex Molecular Systems (ICMS), Eindhoven University of Technology, Eindhoven, The Netherlands. ⁶Department of Biomedical Engineering, Laboratory of Chemical Biology, Eindhoven University of Technology, Eindhoven, The Netherlands. *email: k.vandoorne@tue.nl factors, such as vascular endothelial growth factor (VEGF) and insulin growth factor 1 (IGF1) account for this therapeutic improvement⁴. VEGF is a cytokine involved in the formation of new blood vessels or angiogenesis⁵. IGF1 is a key regulator of cell proliferation and survival, differentiation, and metabolism with cardioprotective properties⁶⁻⁸.

A promising regenerative strategy involves the application of biomaterials as scaffolds that can stimulate repair and regeneration^{9,10}. Injectable hydrogels have been proposed and tested to deliver biological agents post-MI^{11,12}. The use of hydrogels could create a three-dimensional (3D) matrix, resembling the endogenous extracellular matrix¹¹ and sustained delivery of entrapped growth factors¹³. Here, we used a hydrogel based on supramolecular ureido-pyrimidinone (UPy) moieties coupled to poly(ethylene glycol) chains (UPy-hydrogel) loaded with VEGF and IGF1 (UPy^{GF}-hydrogel). Previously, we showed that a local catheter injection of this UPy-hydrogel into porcine hearts after MI allowed local release of hepatocyte growth factor (HGF) and IGF1 reducing the size of the infarct scar¹⁴. The transient network of the UPy-hydrogel was shown to be pH-responsive, which enables injection in the solution state at basic pH followed by formation of a transient network at neutral tissue pH. Rheology and viscosity measurements of the UPy-hydrogel have been previously described¹⁴. Additionally, we recently demonstrated the successful *in vivo* identification of an injected UPy-hydrogel based on a UPy-unit modified with gadolinium (Gd) complex by magnetic resonance imaging (MRI)¹⁵. In the present study an UPy^{GF}-hydrogel was locally injected to deliver VEGF and IGF1 in order to promote tissue repair to improve outcome after MI^{5,7}.

Cardiac MRI is a powerful translational technology¹⁶ that could improve the assessment of cardiac healing aspects of novel regenerative treatments. Each novel cardiac regenerative therapy changes the complex spatial and temporal tissue dynamics of infarct healing after MI. Yet, *in vivo* cardiac imaging methods to serially evaluate these tissue changes with respect to the efficacy of novel regenerative treatments, are still an unmet need¹⁷. Cardiac MRI has previously reported on each of these hallmarks of interest separately¹⁸. First, albumin-based dynamic contrast enhanced (DCE) MRI allows noninvasive assessment of vascular density and permeability, which are both vessel features that could indicate angiogenesis^{19,20}. Second, mapping T1 relaxation times supports *in vivo* evaluation of fibrosis^{21,22}. Lastly, tagging MRI to measure strain, indicates local (re)muscularization²³.

The novelty of this study is the combinatorial assessment of three hallmarks of regeneration in one single MRI session, namely angiogenesis, resolution of fibrosis and remuscularization simultaneously¹⁸. This integrated approach offers tremendous benefits by assessing dynamic cardiac regeneration and remodeling processes at high spatial and temporal resolution. We envision that such multiparametric platforms will enable simultaneous non-invasive studies of novel regenerative cardiac therapies by evaluating cardiac hallmarks in the clinics, which gives improved insights about the efficacy those therapies. To evaluate this triple-marker approach, we noninvasively assessed a novel local cardiac treatment of a UPy^{GF}-hydrogel in a murine ischemia reperfusion (I/R) injury model, which is expected to alter each of these biomarkers based on each of their independent regenerative capacities.

Results

UPy^{GF}-hydrogel specifications and tracking. In vitro release of IGF1 was sustained from the UPy^{GF}hydrogel for the first 7 days until $84 \pm 5\%$, and the release of VEGF approached $33 \pm 1\%$ after 7 days (Fig. 1a). This indicated that incorporation of these growth factors in the UPy^{GF}-hydrogel enabled a sustained release for the active phases of cardiac repair³. The UPy^{GF}-hydrogel loaded with IGF1 and VEGF was intramyocardially injected at two locations at the border of the ischemic area 2 min before reperfusion (Fig. 1b). In order to verify its intramyocardial localization, the UPy^{GF}-hydrogel was loaded with ultrasmall superparamagnetic iron oxide (USPIO). During I/R injury, USPIO-loaded UPy^{GF}-hydrogel was locally injected at the border zone. Ex vivo T₂*weighted MR imaging of isolated hearts successfully identified the two injection sites (Fig. 1c).

Implementation of *in vivo* **triple-marker cardiac MRI in healthy hearts.** The hallmarks of cardiac repair were assessed *in vivo* before and at several timepoints after I/R injury by MRI as shown in the study outline (Fig. 1d). Firstly, to quantify vascular repair processes, intravenous injection of paramagnetically-labeled albumin was followed by DCE MRI (Fig. 2a,b). Cardiac MRI-derived parametric maps confirmed healthy myocardial fractional blood volume (fBV) of 0.10 ± 0.01 , a measure for microvascular density and permeability*surface area product (PS) of $0.0014 \pm 0.0004 \text{ min}^{-1}$, detecting endothelial barrier function (Fig. 2a)^{19,20}. The fBV was calculated from the initial enhancement by the macromolecular albumin immediately after injection (intercept with the y-axis), when albumin was confined to the blood vessels. The PS was derived from the rate of change in contrast concentration in the myocardium with time (Fig. 2b). Secondly, the degree of myocardial fibrosis was measured by mapping T₁ relaxation times from pre-contrast signal intensities at variable flip angles of cardiac MRI. Mean T₁ value of healthy myocardium measured 1.541 ± 0.030 s (Fig. 2c,d), which is similar to previously published data^{19,24}. Thirdly, tagging MRI was performed with local spatial tag frequency estimation to analyze regional myocardial function^{23,25} to determine changes in the peak myocardial strain (Fig. 2e; Supplementary Movie 1). Healthy peak strains in the myocardium were for $9.1 \pm 0.8\%$ for radial strain (Err) and $-12.8 \pm 1.4\%$ for circumferential strain (Ecc) (Fig. 2f,g).

DCE MRI reveals improved angiogenesis in hydrogel treated infarcts. At day 1 after I/R, GdDTPA was intravenously injected to verify infarct size by late gadolinium enhanced (LGE) MRI (Fig. 3a). Serially at day 3 and 22 after I/R, macromolecular GdDTPA-albumin-RhoB was administered to characterize vascular parameters fBV (Fig. 3b) and PS (Fig. 3c). LGE MRI showed a small infarct size for saline $(12.4 \pm 1.2\%)$ and UPy^{GF}-hydrogel (11.1 ± 1.1%) treated mice (Fig. 3d) similar to previously published data^{26,27}. This I/R injury model is clinically very relevant^{27,28} and the similar infarct size allowed further comparison of consequent cardiac repair.

To follow the effect of slow releasing IGF1 and VEGF from the UPy^{GF}-hydrogel at the border zone of the infarcted myocardium, vascular features were followed by albumin-based DCE MRI. Longitudinal follow-up showed an increase of fBV at day 3 (0.17 ± 0.02) and at day 22 (0.21 ± 0.01) in the reperfused myocardium



Figure 1. UPy^{GF}-hydrogel characterization and *in vivo* setup. (a) *In vitro* release of IGF1/VEGF embedded in the UPy^{GF}-hydrogel by daily collection of medium at 37 °C over one week (mean \pm s.e.m, n = 4 measurements). (b) Localization of intramyocardial delivery of UPy^{GF}-hydrogel 2 min before reperfusion in a mouse model of myocardial ischemia reperfusion (I/R). pH-switchable UPy^{GF}-hydrogel loaded with insulin-like growth factor 1 (IGF1) and vascular endothelial growth factor (VEGF) in a solution state during basic conditions. After local injection, the UPy^{GF}-hydrogel slowly released insulin-like growth factor 1 (IGF1) and vascular endothelial growth factor (VEGF). (c) Proof-of-concept *ex vivo* T₂* MRI to verify intramyocardial UPy^{GF}-hydrogel injections (arrows) labeled with ultrasmall superparamagnetic iron oxide at an infarcted heart 30 min after I/R. (d) *In vivo* experimental set-up of serial cardiac magnetic resonance imaging (MRI) and histology of hearts before and after I/R. The illustration of the heart (1b) and the mouse (1d) were modified from Servier Medical Art (http://smart.servier.com/), licensed under a Creative Common Attribution 3.0 Generic License.

treated with the UPy^{GF}-hydrogel compared to healthy myocardium (0.11 ± 0.01) . The increase of fBV was not significantly different at day 3 (0.14 ± 0.03) and at day 22 (0.12 ± 0.04) after I/R in the saline treated reperfused myocardium compared to healthy myocardium (Fig. 3e). Furthermore, the endothelial barrier function was analyzed. The PS values in the infarcted area at day 3 in saline-treated $(4.2 \pm 0.9 \times 10^{-3} \text{min}^{-1})$ and UPy^{GF}-hydrogel treated $(3.6 \pm 1.1 \times 10^{-3} \text{min}^{-1}; P = 0.0593)$ appeared higher than healthy PS values, but were not significantly different from healthy myocardium. Additionally at day 22, PS values of saline-treated reperfused myocardium $(3.6 \pm 1.4 \times 10^{-3} \text{min}^{-1})$ remained similar to the healthy myocardium. Only at day 22 after I/R a significant increase of PS was demonstrated in the UPy^{GF}-hydrogel treated $(6.6 \pm 1.7 \times 10^{-3} \text{min}^{-1})$ compared to healthy myocardium (Fig. 3f). This indicated improved vascular density and enhanced angiogenesis at the UPy^{GF}-hydrogel treated infarcts.

T₁-mapping demonstrates mitigated cardiac fibrosis in hydrogel treated infarcts. Fibrosis is inherent to scar tissue formation and the fibrotic response of the tissue may be altered by UPy^{GF}-hydrogel injection after I/R. At day 3 post-infarction, T₁ values of both saline $(2.172 \pm 0.008 \text{ s})$ and UPy^{GF}-hydrogel $(1.780 \pm 0.083 \text{ s})$ injected ischemic myocardium were increased compared to T₁ values of healthy myocardium (1.541 ± 0.030 s) but only the saline group was significantly different (Fig. 4a,b). At day 22 after I/R, the



Figure 2. Noninvasive multiparametric cardiac MRI of healthy murine hearts. (**a**) Postcontrast parametric maps of fractional blood volume (fBV) and permeability*surface area product (PS) calculated from albumin-based dynamic contrast-enhanced MRI in hearts of healthy mice. (**b**) Contrast agent accumulation in the consecutive MR images for fBV (intercept at time 0) and PS (=slope) in control (n = 14). (**c**) Pixel-based parametric T₁ map of a healthy heart. (**d**) Flip angle based signal intensities to calculate T₁ cardiac maps (n = 14). (**e**) Tagging MR images of the healthy heart during diastole and systole. (**f**) Parametric maps of circumferential strain (Ecc) and radial strain (Err). (**g**) Individual values of circumferential and radial strain for 8 different cardiac phases (n = 13). Each dot represents an individual mouse; bars represent mean \pm s.e.m.

saline-injected infarcts still demonstrated a significantly increased T₁ (2.077 \pm 0.075 s), indicating increased fibrosis. At day 22 after I/R, T₁ values of UPy^{GF}-hydrogel treated infarcts (1.724 \pm 0.123 s) did not increase further and remained non-significantly different from healthy myocardium (Fig. 4a,b). This suggests reduced fibrosis in infarct treated with UPy^{GF}-hydrogel.



Figure 3. Serial contrast-enhanced cardiac MRI shows altered vascular features during cardiac repair in UPy^{GF}hydrogel injected infarcts. (**a**) Late gadolinium enhanced (LGE) MRI with arrows showing the infarct day 1 post-MI. (**b**) Postcontrast parametric maps of fractional blood volume (fBV) and (**c**) permeability*surface area product (PS) calculated from albumin-based dynamic contrast-enhanced MRI. (**d**) Infarct size one day after I/R. (**e**) Mean fBV and, (**f**) mean PS in healthy myocardium and in saline and UPy^{GF}-hydrogel injected infarcts day 3 and day 22 post-infarction. Each dot represents an individual mouse; healthy mice (n = 20), saline injected mice (n = 11, day 1; n = 7, day 3; n = 4, day 22), UPy^{GF} injected mice (n = 9. day 1; n = 8, day 3; n = 7, day 22); bars represent mean \pm s.e.m; Mann-Whitney U test; *P < 0.05, **P < 0.01.



Figure 4. Longitudinal T_1 mapping uncovers reduced fibrosis throughout cardiac healing in UPy^{GF}-hydrogel injected infarcts. (a) Longitudinal T_1 mapping of healthy hearts and hearts after I/R injected with saline or UPy^{GF}-hydrogel. (b) T_1 values. Each dot represents an individual mouse; n = 20 for healthy, healthy mice (n = 20), saline injected mice (n = 7, day 3; n = 4 day 22), UPy^{GF} injected mice (n = 8, day 3; n = 7, day 22); bars represent mean \pm s.e.m.; Mann-Whitney U test; **P < 0.01; *** P < 0.001.

Tagging MRI shows enhanced regional myocardial strain in hydrogel treated hearts. As the UPy^{GF}-hydrogel could possibly affect preservation of regional contractility of the heart, Err and Ecc were longitudinally assessed on day 1, day 3 and day 22 after I/R (Fig. 5a). For saline injected hearts, midventricular peak Err at day 1 ($4.2 \pm 1.1\%$), day 3 ($4.0 \pm 0.3\%$) and at day 22 ($4.2 \pm 0.8\%$) appeared reduced. Yet only at day 3 and day 22 this decrease was significant compared to the Err of healthy myocardium ($9.1 \pm 0.8\%$). For the UPy^{GF}-hydrogel treated hearts, midventricular peak Err at day 1 ($3.5 \pm 1.0\%$), day 3 ($5.3 \pm 1.7\%$) and day 22 ($5.9 \pm 0.5\%$) appeared



Figure 5. UPy^{GF}-hydrogel injection maintains cardiac strain as assessed by serial tagging MRI. (**a**) Longitudinal assessment of circumferential strain (Ecc), and radial strain (Err) for healthy hearts and infarcted hearts on day 1, 3 and 22 after I/R injected with saline or UPy^{GF}-hydrogel. (**b**) Ecc and Err values for healthy myocardium and infarcts. Each dot represents an individual mouse; healthy mice (n = 13), saline injected mice (n = 4, day 1; n = 5, day 3; n = 3, day 22), UPy^{GF} injected mice (n = 4, day 1; n = 4, day 3; n = 3, day 22); bars represent mean \pm s.e.m.; Mann-Whitney U test; *P < 0.05, **P < 0.01 compared to healthy values.

not significantly decreased compared to Err of healthy myocardium (Fig. 5a,b), indicating improved regional strain. Furthermore, the Ecc of saline injected hearts was declined at all timepoints after I/R (day 1: $-4.3 \pm 2.4\%$; day 3: $-1.3 \pm 0.5\%$; day 22: $-1.0 \pm 0.7\%$), and significantly different from Ecc of healthy myocardium prior to MI ($-12.8 \pm 1.4\%$). For the UPy^{GF}-hydrogel treated hearts, Ecc was significantly reduced at day 3 ($-4.1 \pm 3.2\%$) compared to Ecc of healthy hearts. Ecc of UPy^{GF}-hydrogel injected hearts appeared at day 1 ($-10.1 \pm 2.5\%$) and day 22 (-9.0 ± 1.0) after I/R, similar to healthy myocardium prior to MI (Fig. 5a,b; Supplementary Movie 2,3). These data clearly indicated that the UPy^{GF}-hydrogel preserved myocardial strain values, suggesting a protective effect on muscular deformation during cardiac remodeling.

Left ventricular function improves in hydrogel treated heart after MI. Survival rates for the saline and UPyGF-hydrogel treated mice were found not significantly different, however a trend towards improved survival in the UPyGF-hydrogel treated mice was observed; 77.7% of the initial UPyGF-hydrogel treated group survived, while 36.4% of the initial saline treated group survived (Mantel-Cox analysis p = 0.19, Fig. 6a). In addition to overall survival, LV global function was evaluated by calculation of the ejection fraction (EF) from cine MRI. The mean healthy EF was determined from healthy hearts ($51.7 \pm 1.5\%$). After I/R, the EF in saline injected hearts appeared significantly reduced after I/R (day 3: 41.7 \pm 3.5%; day 22: 38.0 \pm 6.0%). In UPy^{GF}-hydrogel-treated hearts post-infarction EF remained similar (day 3: $49.3 \pm 3.8\%$; day 22: $50.5 \pm 5.1\%$) to the EF of healthy hearts (Fig. 6b,c). In healthy hearts LV end-diastolic volume (LVEDV; $80.0 \pm 3.3 \,\mu$ L) and end-systolic volume (LVESV; $38.1 \pm 1.8 \,\mu\text{L}$) were measured. After infarction, the LVEDV in saline injected day 3: $87.1 \pm 4.4 \,\mu\text{L}$; day 22: $94.0\pm8.3\,\mu\text{L})$ and UPy^{GF}-hydrogel-treated (day 3: $85.3\pm4.2\,\mu\text{L};$ day 22: $89.1\pm2.3\,\mu\text{L})$ hearts appeared not signature of the statement of the stat nificantly elevated (Fig. 6d). The post-infarction LVESV in saline injected hearts appeared significantly elevated after I/R (day 3: $50.6 \pm 3.6 \,\mu$ L; day 22: $56.0 \pm 3.6 \,\mu$ L). Yet in UPy^{GF}-hydrogel-treated hearts post-infarction LVESV remained similar (day 3: $44.8 \pm 4.32 \,\mu$ L; day 22: $46.99 \pm 4.6 \,\mu$ L) to the LVESV of healthy hearts (Fig. 6e). We concluded that infarcted hearts treated with UPyGF-hydrogel were able to maintain its LV cardiac function after I/R, despite the tissue changes.

Histology confirms the tissue changes detected by multiparametric cardiac MRI. Microscopic evidence of reduced collagen content by picrosirius red staining is shown in UPy^{GF}-hydrogel treated hearts 22 days after I/R (Fig. 7a). Collagen content of each group, namely healthy hearts $(1.93 \pm 0.7\%)$, saline treated



Figure 6. Cardiac cine MRI reveals reduced LV remodeling after I/R injected with UPy^{GF}-hydrogel. (**a**) Survival of Saline and UPy^{GF}-hydrogel injected mice after ischemia reperfusion injury of the heart (Kaplan-Meier survival curve). (**b**) Ejection fraction. (**c**) End-diastolic and end-systolic long axis MR images of hearts on day 22 after I/R injected with saline or UPy^{GF}-hydrogel. (**d**) Left ventricular end-diastolic volume (LVEDV). (**e**) Left ventricular end-systolic volume (LVESV). Each dot represents an individual mouse; healthy mice (n = 20), saline injected mice (n = 7, day 3; n = 4, day 22), UPy^{GF} injected mice (n = 8, day 3; n = 7, day 22); bars represent mean \pm s.e.m.; Mann-Whitney U test; **P < 0.01.

(14.8 \pm 1.2%) and UPy^{GF}-hydrogel (11.7 \pm 0.5%) treated hearts 22 days after I/R, was significantly different (Fig. 7c). Cardiac MRI T₁ values correlated strongly with values of collagen content ($R^2 = 0.6980$; P = 0.0018), confirming T_1 mapping is a reliable approach to assess myocardial fibrosis after MI (Fig. 7d). Vascular features were assessed in histology by comparing early (FITC-albumin) with late (GdDTPA-albumin-RhoB) albumin localization. Fluorescence microscopy showed enhanced angiogenesis displayed by higher albumin signal at early and late time points in UPy^{GF}-hydrogel treated myocardium 22 days postinfarct (Fig. 7b). The area fraction of early albumin, which is a measure for vascular density, was significantly increased for the UPy^{GF}-hydrogel treated hearts ($10.8 \pm 0.8\%$) compared to healthy ($7.4 \pm 0.4\%$) and saline injected ($8.9 \pm 0.6\%$) hearts (Fig. 7e). As MR-based fBV is also calculated from an early albumin time point, fBV correlated well with early fluorescent FITC-albumin, ($R^2 = 0.4242$, P < 0.0001; Fig. 7f). Subtraction of the early FITC-albumin area from the late extravasated GdDTPA-albumin-RhoB revealed the amount of extravasated albumin. For healthy myocardium only $0.5 \pm 0.1\%$ extravasated. The % area extravasated albumin for saline treated myocardium (11.5 \pm 1.4%) was significantly higher compared to extravasation in healthy myocardium. Extravasation of albumin in UPyGF-hydrogel treated myocardium ($23.3 \pm 3.7\%$) was significantly increased compared with extravasation in healthy and saline injected myocardium (Fig. 7g). These histology-based findings were in positive correlation with the MR-based $PS(R^2 = 0.5751, P < 0.0001)$. To conclude, these findings confirmed the MR-based results for day 22, displaying reduced fibrosis and enhanced revascularization in the UPyGF-hydrogel treated group.



Figure 7. Histological validation of cardiac MRI data for infarcted hearts 22 days after I/R injected with UPy^{GF}hydrogel. (a) Representative images of picrosirius red for collagen. (b) Green fluorescence staining showing albumin-GFP injected at t = 4 min before euthanasia showing microvascular density and GdDTPA-albumin-RhoB at t = 35 min (after cardiac MRI) displaying vessel permeability in healthy, saline infarcts and UPy^{GF}hydrogel injected infarcts at day 22 after I/R. Merged images with blue: nuclear staining with DAPI, green: albumin-GFP and red: GdDTPA-albumin-RhoB. (c) Collagen volume fraction (n = 8 for healthy, n = 4 for day 22 Saline, n = 5 for day 22 UPy^{GF} mice). (d) Correlation of histological collagen volume fraction and MRbased T₁ mapping (R^2 and P based on n = 17). (e) Albumin t = 4 min showing microvascular density (% area; n = 10 for healthy, n = 4 for day 22 Saline, n = 6 for day 22 UPy^{GF} mice). (f) Correlation of fluorescence albumin t = 4 min and MR-based fractional blood volume (R^2 and P based on n = 20). (g) Extravasated albumin showing permeability (% area; n = 10 for healthy, n = 4 for day 22 Saline, n = 6 for day 22 UPy^{GF} mice). (h) Correlation of fluorescence extravasated albumin and MR-based permeability*Surface Area (R^2 and P based on n = 20). Each dot represents an individual mouse; bars represent mean ± s.e.m.; One-way ANOVA with Kruskal-Wallis posthoc test; *P < 0.05, **P < 0.01, ****P < 0.0001.



Figure 8. Longitudinal multiparametric cardiac MRI comparing saline and UPy^{GF}-hydrogel injected myocardial healing. Sequential tissue changes by saline and UPy^{GF}-hydrogel injections to the infarcted hearts at 3 and 22 days after I/R comparing injection normalized to mean values of healthy myocardium. (fBV: fractional blood volume; PS: permeability*surface area product; T_1 : T_1 relaxation time; Err: radial strain; Ecc: circumferential strain).

Discussion

In this study, we describe two advances: (1) a noninvasive multiparametric cardiac MRI tool aimed to characterize key regenerative processes after I/R injury; we established a unique triple-marker MRI approach assessing microvascular features, fibrosis and regional muscle strain at different time points of cardiac healing following hydrogel delivery. (2) Our noninvasive multiparametric MRI approach demonstrated the therapeutic effects of a VEGF/ IGF1-loaded UPy^{GF}-hydrogel after I/R injury by highlighting (i) the enhanced angiogenesis by fractional blood volume (fBV) and permeability * surface area product (PS), (ii) improved resolution of fibrosis by T₁-mapping and (iii) elevated mechanical support as well as (re)muscularization by strain analysis of infarcted murine hearts (Fig. 8). Both claims are supported by gold standard *ex vivo* immunohistochemical analysis displaying an excellent correlation of angiogenic and fibrotic MRI findings, showing the potential of this translational triple-marker MRI approach.

As the search for a novel and effective therapy to prevent the progression of post-MI heart failure continues, we tested a supramolecular UPy^{GF}-hydrogel loaded with VEGF/IGF1. Optimally, time-to-treatment should be at the earliest possible time after ischemic injury. The injection of the UPy^{GF}-hydrogel before reperfusion was intended to prevent damage from the oxidative stress of the reperfusion injury with release of oxygen-related free radicals²⁹⁻³¹. The UPy^{GF}-hydrogel prevented initial damage by providing a mechanical support in the tissue after injection that protects the injured myocardium in a high shear environment¹⁴. Furthermore, growth factor release from the UPy^{GF}-hydrogel peaked at day 2–3 after injection (Fig. 1a), which is an ideal timing to initiate angiogenesis, as the revascularization is initiated at day 3 after I/R injury^{29,31}. Despite our promising preclinical results and the fact that the delivery at time of reperfusion seems clinically optimal, future studies should examine the optimal time frame for treatment, both in clinical outcomes and patient burden.

Although stem cell therapy for cardiac repair and regeneration holds promising therapeutic potential, its beneficial effect has been greatly attributed to the release of growth factors, such as VEGF and IGF1, acting in a paracrine fashion on resident cells^{4,32}. IGF1 has been extensively studied to treat the heart after MI as it counteracts adverse cardiac remodeling working directly on cardiomyocytes and inflammatory cells; reduced apoptosis^{33,34}, cardioprotective effects against oxidative stress-dependent cell death³⁵ and modulation of the inflammatory response⁸ at the infarcted area are possible underlying mechanisms. IGF1 works through receptor binding and intracellularly activates the protein kinase B pathway, stimulating cell growth and proliferation, and inhibiting apoptosis^{6–8}.

VEGF, a cytokine that initiates the formation of new vessels, has been broadly examined as a treatment option to prevent heart failure after MI, as it also exerts cytoprotection, tissue regeneration, and neurohormonal effects⁵. VEGF works through receptor activation and molecular mediators resulting in inhibition of apoptosis by caspase-9 phosphorylation, vasodilation promoted through eNOS (endothelial nitric oxide synthase) activation with nitric oxide production, and activation of kinases inducing cellular proliferation, adhesion and migration. *In vivo* evidence has suggested that VEGF works both on local cells of the cardiac niche (e.i. stromal cells), as well as on the recruitment of distant bone marrow-derived cells (e.i. hematopoietic stem cells, monocytes), starting from cellular release, followed by cell migration, adhesion and, finally, diapedesis towards the damaged tissue⁵.

One of the major limitations for the therapeutic use of both VEGF and IGF1 is the very short half life following injection^{5,36}. Entrapment of these growth factors in an engineered degradable hydrogel overcomes this limitation enabling prolonged release of VEGF and IGF1 over 7 days during the phase of active cardiac healing³. The burst release of VEGF was slower than IGF1. Previously published data have shown similar burst release for VEGF³⁷ and IGF1¹⁴. However, the reason for discrepancy in burst release between VEGF and IGF1 has not been further explored. Possible explanations are partial degradation of VEGF hindering ELISA detection³⁸ or difference in size

between VEGF (39 kDa) and IGF-1 (7.6 kDa)³⁹. The correct intramyocardial injection was imaged by incorporating USPIOs to the UPy^{GF}-hydrogel. The very short T_2^* of the injected USPIOs created a susceptibility artifact, slightly overestimating the injected hydrogel area. Because of this, the hearts were isolated and placed in a tube, so the effective intramyocardial placement of the engineered hydrogel could be verified. These *in vitro* and *ex vivo* data demonstrated feasibility of the UPy^{GF}-hydrogel as an intramyocardial carrier system in murine hearts. For porcine hearts, minimally invasive delivery of a UPy-hydrogel loaded with Gd through a catheter has been shown, emphasizing the translational potential of the gel¹⁵.

The continuous search to lower mortality after MI also demands methods to assess the risks of developing adverse cardiovascular events. Risk stratification is crucial for decision-making in existing treatment options, such as revascularization, as well as robustly evaluating novel regenerative therapies to prevent progression to post-MI heart failure. LV ejection fraction (\leq 30%) has become a primary method for stratifying risk like anticipating sudden cardiac death⁴⁰. Yet, even patients with LV EF >30% may still suffer sudden cardiac death and this method does not provide any insights on aspects of cardiac healing⁴⁰. The evaluation of myocardial tissue changes post-MI can deliver a patient-specific risk stratification, ultimately contributing to personalized medicine.

Cardiac MRI has emerged as a leading imaging modality assessing various components of post-MI myocardium for risk assessment and personalized therapeutic decision making. Until now, measuring infarct size by LGE MRI has been a very strong predictor of mortality and heart failure⁴¹. Our study revealed that both the saline and UPy^{GF}-hydrogel treated hearts had similar infarct size upon LGE MRI at day 1 after MI, meaning similar initial risk for developing adverse cardiovascular events. A mouse model of I/R injury with small infarct sizes was used to mimic clinical conditions^{28,42}.

Cardiovascular albumin-based DCE MRI is a promising method to evaluate functional vascular features such as vascular density and permeability in mice^{19,20} and man^{43,44}. Serial imaging showed that UPy^{GF}-hydrogel therapy elevated the infarct fBV, a measure for microvascular density at day 3 and day 22 after I/R injury. Vascular permeability (PS) was not significantly different at day 3 post-MI. As permeability early after MI correlated with leukocyte transmigration, this indicated indirectly that the inflammatory reaction was not enhanced early post-MI²⁰. PS appeared only significant in UPy^{GF}-hydrogel treated mice late (day 22) after I/R injury. As permeability is a major indicator for angiogenesis⁴⁵, this may indicate that angiogenesis was still ongoing at day 22 post-MI in the inflarcted myocardium by prolonged release of VEGF from the UPy^{GF}-hydrogel.

Furthermore, MR-based T_1 -mapping assessing fibrosis has been shown to be a promising method for risk evaluation both preclinically^{24,46} and clinically^{21,22}. Our results showed that intramyocardial injection of UPy^{GF}-hydrogel alleviated myocardial fibrosis at day 3 and day 22 post-MI. These findings were confirmed by histomorphometric analysis.

Global strain has recently been shown to have incremental prognostic value for mortality superior to LV ejection fraction and infarct size^{47,48}. To include both intramycardial injection sites of saline or UPy^{GF}-hydrogel, we chose to assess midventricular Ecc and Err strain serially by tagging MRI²³. However, the use of tagging MRI for strain assessment resulted in the exclusion of multiple later timepoints due to tagging fading⁴⁹. Other strain assessment approaches, such as feature tracking, might result in less exclusion of images, but have a risk of unrealistic results with local stain variations as we expected in MI²³. Therefore tagging MRI is still the gold standard to rely on. We found compromised strain values for the saline injected group, whereas the strain values of the UPy^{GF}-hydrogel treated group remained similar to healthy strain values. This is likely due to the initial mechanical support of the UPy-hydrogel combined with the sustained release of growth factors to enhance survival of cardiomyocytes³⁴.

In addition to classical MR assessment of infarct size by LGE MRI and LV global function by cine MRI postinfarct, each separate MRI method, i.e. DCE MRI¹⁹, T₁ mapping²² and tagging MRI²³, has proven potential additional value for assessing distinct biomarkers of risk prediction after MI. Yet this combined triple-marker MR imaging method gives clear insights on post-MI tissue changes in one imaging session, allowing spatial and temporal comparison of the therapeutic effects of the UPy^{GF}-hydrogel. Other multi-biomarker studies have included simultaneous measurement of multiple tissue properties in a single acquisition measuring T₁, T₂ and T₂*^{50,51}. However, these measurements cannot provide functional data on regional muscle deformation or endothelial barrier function of the heart. Some studies have used cardiac positron emission tomography (PET)/MRI to assess cardiac inflammatory reactions, in addition to standard LGE, T₁ and T₂ MRI measurements⁵². Although PET is highly sensitive, for human applications MRI is favored as it is more widely available, nonradioactive, independent of cyclotron access, and cheaper.

This serial cardiac MRI strategy achieved (i) 3D characterization of vascular features showing increased microvascular density (fBV) and vascular permeability (PS) by DCE-MRI, (ii) MR-based evaluation of myocardial fibrosis picturing improved T_1 values of fibrosis and (iii) MR-based radial and circumferential strain analysis displaying enhanced regional wall motion in UPy^{GF}-hydrogel treated infarcts. Improved global LV function was attributed to increased angiogenesis, enhanced resolution of fibrosis and elevated mechanical support as well as (re)muscularization in infarcted hearts treated with UPy^{GF}-hydrogel. We envision that such multiparametric platforms will enable simultaneous studies of hallmarks for cardiac regeneration, at high resolution, to improve insights into the efficacy of novel regenerative cardiac therapies. Ultimately, this integrated *in vivo* MRI tool, can be translated clinically to provide longitudinal information of the regenerative aspects of novel cardiac therapies after MI.

Methods

Statement. All experiments and methods were performed in accordance with relevant guidelines and regulations. All mouse procedures were approved by Maastricht University Animal Care Committee, The Netherlands (DEC2014–053).

Synthesis and characteristics of UPy^{GF}-hydrogel. Based on the fourfold hydrogen bonding supramolecular ureido-pyrimidinone units were coupled with alkyl-urea to 10k poly(ethylene glycol) to synthesize the UPy-hydrogel (SyMO-Chem BV, Eindhoven, The Netherlands)¹⁴. A 10 wt% UPy-hydrogel was made by dissolving 10 wt% UPy-PEG in 90 wt% saline to a final pH 9. After one hour of stirring, the liquefied UPy-hydrogel was mixed with mouse recombinant VEGF and IGF1 (V4512–5UG and I8779–50UG, Sigma-Aldrich, St Louis, MO, USA) to a concentration of 500 ng/ml of both GF. In addition, a second batch of the UPy^{GF}-hydrogel was mixed with 13,6 µg/ml USPIOS (Sinerem, Guerbet, Villepoint, France) for *in vivo* tracking after delivery. To assess the cumulative release of IGF1 and VEGF, 100µl of the liquefied UPy-hydrogel was placed in a pipette at 24-well plate millicell hanging culture inserts (PIEP12R48, polyethylene terephtalate, 8.0µm; Merck Millipore, Darmstadt, Germany) and solidified by decreasing to pH 6.5 while adding hydrochloric acid. The MilliPores where surrounded with 800µl phosphate-buffers saline (PBS) and placed at a rotational shaker (100 rpm) at 37 °C for 7 days. The PBS surrounding the inserts was refreshed daily and the collected supernatant was quantified for VEGF and IGF1 by enzyme-linked immunosorbent assay detection (Mouse IGF1 ELISA Kit and Mouse VEGF ELISA Kit, Sigma-Aldrich, St Louis, USA).

Mice. Male outbred 12 ± 1 weeks old OF1 mice (n = 35) were purchased from Charles River. A first batch of n = 14 healthy mice were used for implementation of cardiac MRI, and subsequent histological analysis. A second batch of n = 20 healthy mice were imaged prior to infarct induction and were randomly assigned to the saline injected (n = 11) or UPy^{GF}-hydrogel injected (n = 9) group during I/R injury for serial cardiac MRI and histology at day 22 post infarction. To localize USPIO-loaded UPy^{GF}-hydrogel after I/R injury by *ex vivo* MRI n = 1 mouse was used as a proof-of-concept. For induction of I/R surgery and *in vivo* cardiac MRI, anesthesia of the mice was induced with 4% isoflurane in 0.3 L/min oxygen and maintained with 1–2% isoflurane. During anesthesia, the body temperature was monitored with rectal thermometry and maintained at 35.5 ± 0.5 °C using a heating system. All mouse procedures were approved by Maastricht University Animal Care Committee, Netherlands.

Myocardial I/R injury model. A well-established left anterior descending (LAD) coronary artery ligation model was used^{26,42}. In short, mice were anesthetized, endotracheally intubated and mechanically ventilated (Harvard Apparatus). Surgery was performed under an Olympus microscope. After thoracotomy, a 30 min ligation of the LAD coronary artery was performed with a 8–0 monofilament suture and a PE-10 tube placed between the LAD coronary artery and the suture to protect the vessel from injury. Although there is still some controversy about the ideal timing of injection after MI, we have well considered several options taking into account the nature of our regenerative therapy and its dynamics. The most favorable time-to-treatment should be as early as possible after ischemic injury to prevent damage^{29–31}. Two minutes prior to reperfusion, two intramyocardial injections of $10 \,\mu$ I saline or $10 \,\mu$ I UPy^{GF}-hydrogel were placed on both sides of the ischemic area (Fig. 1c) by a 90 degrees curved needle (0.3 mL U-100 insulin syringe, 29-gauge, BD Bioscience). At the end of the ischemic period, the LAD coronary artery ligation was removed and reperfusion of the LV was visually verified. Before and every 12 h until 72 h after the surgery, mice received buprenophine (0.05 mg/kg, SC) injections as analgesia. During the first 24 h after surgery, mice were kept in a recovery unit at 28 °C.

Cardiac MRI acquisition. A 9.4 T horizontal MRI scanner with 72-mm-diameter volume transmit coil with a four-element mouse cardiac phased-array surface receive coil (Bruker, Ettlingen, Germany) was used to perform all MRI experiments.

Ex vivo MRI protocol. Hearts were harvested 30 min after I/R injury and isolated to verify the intramyocardial localization of USPIO-loaded UPy^{GF}-hydrogel. The pericardium was removed and the hearts were fixated in paraformaldehyde (polyoxymethylene, P6148, Sigma-Aldrich, St Louis, USA) in an Eppendorf tube. This tube was positioned in the isocenter of the magnet and imaged by T₂*-weighted imaging performed with a standard gradient echo sequence using a thickness of 0.5 mm in long axis (20 slices) and short axis (25 slices) covering the whole heart. Following parameters were used: TE = 7 ms; flip angle = 30°; TR = 3355 ms; TEacq = 10.9 ms; spectral width = 407 Hz; FOV_{long axis} = 40 × 40 mm; FOV_{short axis} 30 × 30 mm²; N_x × N_y = 192 × 192 with zero filling to 256 × 256; acquisition time = 10m44s232ms.

In vivo MRI protocol. ECG electrodes were placed at the front paws to monitor the heart rate, which was maintained at 400–600 bpm by adjusting the isoflurane level. A respiratory sensor balloon was placed on the abdomen and the respiratory rate was kept at 70 ± 10 bpm (SA Instruments Model 1025, Stony Brook, NY, USA). The mouse was placed in the magnet so that the heart was positioned at the isocenter of the magnet in the middle of the phased array coil. Retrospective triggering was used to distinguish cardiac and respiratory phases from the images after acquisition. For healthy baseline and mice at days 3 and 21 after I/R, one imaging session accounted for DCE, T₁-mapping, tagging and volumetric Cardiac MRI (5–7 days prior to I/R surgery). For day 1 after I/R injury, the imaging session was minimized to only tagging and LGE MRI, to diminish the time under anesthesia and to consequently optimize survival. At day 3 and 22 after I/R, DCE, T₁-mapping, tagging and volumetric MRI were performed again (Fig. 1e).

Cardiac DCE MRI with precontrast T_1 *-mapping.* Prior to administration of the contrast agent, T_1 -weighted stacks of 2D fast low-angle shot (FLASH) images covering the whole heart were acquired with a series of variable flip angles (2°, 5°, 8°, 11°, 13°) to determine the endogenous precontrast T_1 as described in previous research^{19,24}. In short, a retrospectively triggered FLASH sequence with constant TR was used with variable

flip angles. An indwelling tail catheter was used to intravenously inject 150 µl (100 mg/ml) macromolecular bovine serum albumin labeled with gadolinium diethylenetriaminepentacetate (GdDTPA) and rhodamine B (GdDTPA-albumin-RhoB, 82 kDa, SyMo-Chem, Eindhoven, The Netherlands) at a rate of 50 µl/min¹⁹. Immediately after administration of the contrast agent a dynamic series of images was acquired with a flip angle of 13° to determine post contrast T₁ over time for quantification of contrast accumulation. Other imaging parameters were: TR = 10 ms; TE = 1.784 ms; n of repetitions = 22; FOV = 30 × 30; slice thickness = 10 mm; spectral bandwidth = 100,000 Hz; N_x × N_y = 128 × 64 with zerofilling to 128 × 128; number of slices = 15; cardiac frames = 6; acquisition time = 4m1s200ms.

Tagging MRI. Midventricular tagged MRI images were obtained by preceding a 2D-FLASH sequence with a SPAMM preparation step applying a tagging grid with following parameters: distance = 0.5 mm; thickness = 0.25 mm; angle = 45°; delay = 1.4 ms. These short axis tagged MRI images were positioned between the base and apex of the heart, containing the UPy^{GF}-hydrogel or saline injection site. This sequence was prospectively gated and respiratory triggered per phase step with a trigger delay of 1 ms. The tagging was applied prior to the systolic phase and acquired images were ordered from the systolic to the diastolic phase (Supplementary Movie 1). Other imaging parameters were: $\alpha = 13^\circ$; TR = 15 ms; TE = 2.549 ms; FOV = 30×30 mm; N_x × N_y = 256×128 with zerofilling to 256×256 ; cardiac frames = 16; acquisition time depends on cardiac triggering efficiency. Tagging series of insufficient image quality to assess tagging grid deformations⁴⁹ because of tagging grid fading were excluded from analysis.

Cardiac Volumetric MRI. A retrospectively gated FLASH sequence (Intragate, Bruker, Ettingen, Germany) was applied to acquire cine images of the long axis orientation and determine the position of the short axis DCE MRI or the LGE MRI. The following parameters were used: $\alpha = 10^{\circ}$; TR = 8 ms; TE = 3 ms; n of repetitions = 200; FOV = 30 × 30 mm; N_x × N_y = 192 × 192 with zerofilling to 256 × 256; slice thickness = 1 mm; cardiac frames = 15; acquisition time = 5m9s200ms.

LGE MRI. One day after surgery the infarct size was determined by LGE MRI with an increased flip angle preparation step before a T₁-weighted 3D-FLASH sequence. The LGE MRI images were acquired 20 min after 100 µl gadoterol (GdDTPA, 0.015 mmol/kg, Prohance, Bracco Diagnostics Inc.) was injected intravenously via an indwelling tail vein catheter at the same rate as above. The applied imaging parameters were: $\alpha = 30^\circ$; TR = 10 ms; TE = 1.784 ms; n of repetitions = 50; FOV = 30×30 ; slice thickeness = 10 mm; spectral width = 100,000 Hz; N_x × N_y = 128 × 64 with zerofilling to 128×128 ; number of slices = 15; cardiac frames = 6; acquisition time = 8m30s0ms.

Cardiac MRI data analysis. T_1 , *fBV and PS.* Cardiac T_1 -mapping and DCE MRI data analysis was done with Matlab (MathWorks Inc., USA). GdDTPA-albumin-RhoB concentrations were derived from the cardiac DCE MRI data on a pixel-by-pixel basis^{19,24}. In short, mean myocardial R_1 values (R_1 pre; $R_1 = 1/T_1$) Eq. 1:

$$I = \frac{M_0 \sin \alpha (1 - e^{-TR \cdot R1_{pre}})}{1 - \cos \alpha \cdot e^{-TR \cdot R1_{pre}}}$$
(1)

where *I* is the signal intensity as a function of the pulse flip angle α , TR is the repetition time and the pre-exponent term M₀ includes the spin density and T₂ relaxation effects, assumed to be unaffected by the contrast agent. Postcontrast R₁ values were calculated from signal intensities precontrast and postcontrast (I_{pre} and I_{post} ; Eq. 2):

$$\frac{I_{\text{pre}}}{I_{\text{post}}} = \frac{M_0 \sin \alpha (1 - e^{-TR \cdot R_1} \rho e) / (1 - \cos \alpha \cdot e^{-TR \cdot R_1} \rho e)}{M_0 \sin \alpha (1 - e^{-TR \cdot R_1} \rho e) / (1 - \cos \alpha \cdot e^{-TR \cdot R_1} \rho e)}$$
(2)

Lastly, concentrations of the contrast agent were derived from the measured *relaxivity* (R) of GdDTPA-albumin-RhoB ($R = 130 \text{ mM}^{-1}\text{s}^{-1}$ at 9.4 T; Eq. 3):

$$[GdDTPA - albumin - RhoB] = \frac{1}{R}(R1post - R1pre)$$
(3)

Regions of interest (ROIs) for T_1 , fBV and PS were defined as healthy before I/R injury for the entire myocardium and as infarcted for a hyper intense infarct region defined by LGE MRI images. From the temporal changes in these normalized concentrations fBV and PS were quantified. First, fBV was derived from the extrapolation of a linear regression of the normalized concentrations to the time of administration of the contrast. Second, the slope of these normalized concentration values (Fig. 1b), the rate of normalized concentration increase or PS (min⁻¹), was derived from a linear regression of the normalized concentrations over time. The PS quantified with GdDTPA-albumin-RhoB exhibited the extravasation of albumin from blood vessels and its accumulation in the tissue. Cardiac parametric T_1 , fBV and PS maps were projected to indicate the mean value in each pixel.

Strain. Strain calculations were done by using Wolfram Mathematica v10 based software, adapted from previous research²⁵. The method obtained the circumferential (Ecc) and radial (Err) strains from the tagging MRI data (Fig. 2e–g) and is based on local tagging frequency estimations described elsewhere^{25,53}. Briefly, the Gabor transform was applied to construct a local frequency representation of the tagging images A Gaussian filter was used to calculate the Gabor transform in each pixel and a single spatial frequency covector ω_t was extracted (t is the time frame of the MRI acquisition the covector was calculated from). Each ω_t is related to its counterpart in the first frame ω_0 for the same material point through the deformation tensor F Eq. 4):

$$\omega_{\rm t} = \omega_0 {\rm F}^{-1} \tag{4}$$

Where ω_t and ω_0 are are the frequencies of corresponding material points at different moments in time and F is the deformation tensor (Eq. 5). It is assumed that at the moment of applying the tagging grid t_0 , which is before acquisition of the image, the tag frequency is known and and equal for all material points. To be able to solve for F, frequency-matrices Ω_t and Ω_0 are derived by combining frequency covectors ω_t and ω_0 for multiple tagging directions extracted tagged images:

$$F = (\Omega_t^T \, \Omega_t)^{-1} \Omega_t^T \Omega_0 \tag{5}$$

Here Ω_T is the transpose of Ω . From this the Lagrangian strain tensor (Eq. 6) is defined as followed:

$$E = \frac{1}{2}(F^T F - I) \tag{6}$$

Where *I* is an unit tensor. From the 2×2 -tensor E the Err and Ecc strains can be extracted. Prior to these strain calculations the endocardial and epicardial borders were manually drawn into the image slices to limit the deformation analysis to that area. The peak Err and Ecc were calculated in the whole LV (Fig. 2f) and were analyzed by dividing the LV into 12 segments in the circumferential direction and two in the radial direction, which is a refinement of the American Heart Association (AHA) model. The peak strains of the infarct area segments were compared between the saline and UPy^{GF}-hydrogel groups. For healthy controls the same segments were used. For regional strain analysis, the accuracy of tagging MRI is known to be dependent on the image quality⁵⁴. Our data suffered from tag fading, especially in the diastolic phase, which is a known problem for this technique⁴⁹ making it impossible to accurately analyze some datasets. Datasets with excessive tagging grid fading were excluded (Supplementary Fig. 1), which explains the lower number of animals for regional strain analysis than T₁, fBV and PS analysis.

Infarct size, EF. To gain insights into the effect of the UPy^{GF}-hydrogel therapy in the heart, infarct size and global LV function were calculated with Segment v1.9 R3819 software (http://segment.heiberg.se). At day 1 postinfarction, 3D LGE MRI images were used to determine infarct sizes of the different saline and UPy^{GF}-hydrogel injected LVs. The infarct areas were defined from pixels with a signal intensity of more than 3 standard deviations above the mean signal intensity of the remote area (Fig. 3a). The precontrast 3D FLASH images with 13° flip angle from the healthy control and day 3 and 22 for the saline and UPy^{GF}-hydrogel groups were used to determine the LV EF. Segment v1.9 R3819 software was used to manually draw the endocardial and epicardial borders in the short axis images and automatically calculated the EF from the difference in LVEDV and LVESV divided by the LVEDV.

Histological analysis. *Ex vivo histology preparation.* After the MRI experiment (healthy and at day 22 after infarction), $150 \mu l$ fluorescein isothiocyanate labeled BSA (FITC-albumin, 100 mg/ml) was intravenously injected via the indwelling catheter as an early albumin marker to confirm MR-based fBV. Mice were sacrificed 4 min after FITC-albumin and 35 min after GdDTPA-albumin-RhoB injection by cervical dislocation while anesthetized. The hearts were isolated, rinsed and fixed in paraformaldehyde. Afterwards, the hearts were mounted on OCT embedding compound (Fisher Scientific, Hampton, NH, USA) and frozen at $-80 \, ^\circ$ C. Hearts were cryosectioned at 7 μ m through the short axis at $-35 \, ^\circ$ C.

Collagen content. For Picrosirius Red staining of collagen, 3–4 sections per heart were incubated with 0.1% Sirius Red (Direct Red 80, Sigma-Aldrich, St Louis, USA). Sections were visualized with identical exposure settings in a light microscope (3DHistech microscope, Budapest, Hungary). The interstitial collagen fraction (dark red) was determined by quantitative morphometry of the picrosirius-stained sections with with ImageJ software. The density of labeled areas was measured from 3 randomly selected fields of each section at a x10 magnification. The expressed value was the ratio of the dark red collagen area to total area.

Fluorescent albumin quantification. In adjacent section, nuclei where stained in blue with 4',6-diamidino-2-phenylindole (DAPI, D9542, Sigma-Aldrich, St Louis, USA). To visualize fluorescence of FITC-albumin injected for 4 min, GdDTPA-albumin-RhoB injected for 35 min, and DAPI, 3–4 slices were imaged with identical exposure times (3DHistech microscope, CMOS camera). The density of labeled areas was qualitatively estimated from 3 randomly selected fields of each section at a x20 magnification. The % area of FITC-albumin (4 min) was the ratio of the green fluorescence area to total area. Subtraction of this fraction from the red fluorescent fraction (GdDTPA-albumin-RhoB; 35 min injected) provided the contrast leakage from the vasculature and therefore an estimation for the permeability. All fluorescent images were analyzed with imageJ software.

Statistics. Statistical analysis was performed using GraphPad Prism (version 8.00; GraphPad, San Diego, CA). Normality was checked by the Shapiro–Wilk test. Differences between not normal distributed groups were analyzed for statistical significance with the parametric Mann-Whitney U test. Multiple comparisons were corrected for statistical significance with the Bonferroni-Dunn method. For histology, three groups were compared using a one-way ANOVA with Kruskal-Wallis post-hoc test. To assess correlation between two variables, Pearson's R² and two-tailed P value were computed. Data are presented as mean \pm SEM and a *P* value of ≤ 0.05 was considered significant.

Received: 12 August 2019; Accepted: 3 December 2019; Published online: 18 December 2019

References

- 1. Benjamin, E. J. et al. Heart Disease and Stroke Statistics-2017 Update: A Report From the American Heart Association. Circulation 135, e146–e603 (2017).
- Nahrendorf, M. et al. The healing myocardium sequentially mobilizes two monocyte subsets with divergent and complementary functions. J Exp Med 204, 3037–3047 (2007).
- 3. Prabhu, S. D. & Frangogiannis, N. G. The Biological Basis for Cardiac Repair After Myocardial Infarction: From Inflammation to Fibrosis. Circ Res 119, 91–112 (2016).
- Hodgkinson, C. P., Bareja, A., Gomez, J. A. & Dzau, V. J. Emerging Concepts in Paracrine Mechanisms in Regenerative Cardiovascular Medicine and Biology. *Circ Res* 118, 95–107 (2016).
- 5. Taimeh, Z., Loughran, J., Birks, E. J. & Bolli, R. Vascular endothelial growth factor in heart failure. *Nat Rev Cardiol* 10, 519–530 (2013).
- Juul, A., Scheike, T., Davidsen, M., Gyllenborg, J. & Jørgensen, T. Low serum insulin-like growth factor I is associated with increased risk of ischemic heart disease: a population-based case-control study. *Circulation* 106, 939–944 (2002).
- Bourron, O. et al. Impact of age-adjusted insulin-like growth factor 1 on major cardiovascular events after acute myocardial infarction: results from the fast-MI registry. J Clin Endocrinol Metab 100, 1879–1886 (2015).
- Heinen, A. et al. IGF1 Treatment Improves Cardiac Remodeling after Infarction by Targeting Myeloid Cells. Mol Ther 27, 46–58 (2019).
- 9. Christman, K. L. Biomaterials for tissue repair. Science 363, 340-341 (2019).
- Spang, M. T. & Christman, K. L. Extracellular matrix hydrogel therapies: In vivo applications and development. Acta Biomater 68, 1–14 (2018).
- 11. Hasan, A. et al. Injectable Hydrogels for Cardiac Tissue Repair after Myocardial Infarction. Adv Sci (Weinh) 2, 1500122 (2015).
- 12. Wang, L. L. et al. Local and sustained miRNA delivery from an injectable hydrogel promotes cardiomyocyte proliferation and functional regeneration after ischemic injury. Nat Biomed Eng 1, 983–992 (2017).
- Domenech, M., Polo-Corrales, L., Ramirez-Vick, J. E. & Freytes, D. O. Tissue Engineering Strategies for Myocardial Regeneration: Acellular Versus Cellular Scaffolds. *Tissue Eng Part B Rev* 22, 438–458 (2016).
- 14. Bastings, M. M. *et al.* A fast pH-switchable and self-healing supramolecular hydrogel carrier for guided, local catheter injection in the infarcted myocardium. *Adv Healthc Mater* **3**, 70–78 (2014).
- Bakker, M. H. et al. MRI Visualization of Injectable Ureidopyrimidinone Hydrogelators by Supramolecular Contrast Agent Labeling. Adv Healthc Mater 7, e1701139 (2018).
- Bakermans, A. J. et al. Small animal cardiovascular MR imaging and spectroscopy. Prog Nucl Magn Reson Spectrosc 88-89, 1–47 (2015).
- 17. Scarfe, L. *et al.* Preclinical imaging methods for assessing the safety and efficacy of regenerative medicine therapies. *NPJ Regen Med* 2, 28 (2017).
- 18. Bertero, A. & Murry, C. E. Hallmarks of cardiac regeneration. Nat Rev Cardiol 15, 579-580 (2018).
- Vandoorne, K. et al. Noninvasive mapping of endothelial dysfunction in myocardial ischemia by magnetic resonance imaging using an albumin-based contrast agent. NMR Biomed 29, 1500–1510 (2016).
- Leenders, G. J. et al. Statins Promote Cardiac Infarct Healing by Modulating Endothelial Barrier Function Revealed by Contrast-Enhanced Magnetic Resonance Imaging. Arterioscler Thromb Vasc Biol 38, 186–194 (2018).
- 21. Everett, R. J. et al. Assessment of myocardial fibrosis with T1 mapping MRI. Clin Radiol 71, 768-778 (2016).
- Haaf, P. et al. Cardiac T1 Mapping and Extracellular Volume (ECV) in clinical practice: a comprehensive review. J Cardiovasc Magn Reson 18, 89 (2016).
- Scatteia, A., Baritussio, A. & Bucciarelli-Ducci, C. Strain imaging using cardiac magnetic resonance. Heart Fail Rev 22, 465–476 (2017).
- 24. Coolen, B. F. *et al.* Three-dimensional T1 mapping of the mouse heart using variable flip angle steady-state MR imaging. *NMR Biomed* 24, 154–162 (2011).
- 25. Kause, H. B. et al. Direct myocardial strain assessment from frequency estimation in tagging MRI (2013).
- Gandhi, C., Khan, M. M., Lentz, S. R. & Chauhan, A. K. ADAMTS13 reduces vascular inflammation and the development of early atherosclerosis in mice. *Blood* 119, 2385–2391 (2012).
- 27. von Elverfeldt, D. *et al.* Dual-contrast molecular imaging allows noninvasive characterization of myocardial ischemia/reperfusion injury after coronary vessel occlusion in mice by magnetic resonance imaging. *Circulation* **130**, 676–687 (2014).
- 28. Abarbanell, A. M. et al. Animal models of myocardial and vascular injury. J Surg Res 162, 239-249 (2010).
- Silvestre, J. S., Smadja, D. M. & Lévy, B. I. Postischemic revascularization: from cellular and molecular mechanisms to clinical applications. *Physiol Rev* 93, 1743–1802 (2013).
- González-Montero, J., Brito, R., Gajardo, A. I. & Rodrigo, R. Myocardial reperfusion injury and oxidative stress: Therapeutic opportunities. World J Cardiol 10, 74–86 (2018).
- 31. Frangogiannis, N. G. The mechanistic basis of infarct healing. Antioxid Redox Signal 8, 1907-1939 (2006).
- Gnecchi, M. et al. Paracrine action accounts for marked protection of ischemic heart by Akt-modified mesenchymal stem cells. Nat Med 11, 367–368 (2005).
- Davani, E. Y. et al. Insulin-like growth factor-1 protects ischemic murine myocardium from ischemia/reperfusion associated injury. Crit Care 7, R176–83 (2003).
- Davis, M. E. et al. Local myocardial insulin-like growth factor 1 (IGF-1) delivery with biotinylated peptide nanofibers improves cell therapy for myocardial infarction. Proc Natl Acad Sci USA 103, 8155–8160 (2006).
- Vinciguerra, M., Santini, M. P., Claycomb, W. C., Ladurner, A. G. & Rosenthal, N. Local IGF-1 isoform protects cardiomyocytes from hypertrophic and oxidative stresses via SirT1 activity. *Aging (Albany NY)* 2, 43–62 (2009).
- 36. Khan, R. S. et al. Targeting extracellular DNA to deliver IGF-1 to the injured heart. Sci Rep 4, 4257 (2014).
- Claaßen, C., Sewald, L., Tovar, G. E. M. & Borchers, K. Controlled Release of Vascular Endothelial Growth Factor from Heparin-Functionalized Gelatin Type A and Albumin Hydrogels. *Gels* 3, (2017).
- Vempati, P., Popel, A. S. & Mac Gabhann, F. Extracellular regulation of VEGF: isoforms, proteolysis, and vascular patterning. Cytokine Growth Factor Rev 25, 1–19 (2014).
- 39. Li, J. & Mooney, D. J. Designing hydrogels for controlled drug delivery. Nat Rev Mater 1, (2016).
- Dagres, N. & Hindricks, G. Risk stratification after myocardial infarction: is left ventricular ejection fraction enough to prevent sudden cardiac death. Eur Heart J 34, 1964–1971 (2013).
- Ordovas, K. G. & Higgins, C. B. Delayed contrast enhancement on MR images of myocardium: past, present, future. Radiology 261, 358–374 (2011).
- 42. Michael, L. H. et al. Myocardial ischemia and reperfusion: a murine model. Am J Physiol 269, H2147-54 (1995).
- Nahrendorf, M. & Vandoorne, K. Albumin-Binding MR Probe Detects High-Risk Coronary Plaques in Patients. JACC Cardiovasc Imaging 12, 307–309 (2019).

- Engel, L. C. et al. Novel Approach for In Vivo Detection of Vulnerable Coronary Plaques Using Molecular 3-T CMR Imaging With an Albumin-Binding Probe. JACC Cardiovasc Imaging 12, 297–306 (2019).
- Vandoorne, K., Addadi, Y. & Neeman, M. Visualizing vascular permeability and lymphatic drainage using labeled serum albumin. Angiogenesis 13, 75–85 (2010).
- de Graaf, W. L., Vandoorne, K., Arslan, F., Nicolay, K. & Strijkers, G. J. Contrast-Enhanced T1-Mapping MRI for the Assessment of Myocardial Fibrosis. Current Cardiovascular Imaging Reports 7, 9260 (2014).
- Eitel, I. et al. Cardiac Magnetic Resonance Myocardial Feature Tracking for Optimized Prediction of Cardiovascular Events Following Myocardial Infarction. JACC Cardiovasc Imaging 11, 1433–1444 (2018).
- Romano, S. *et al.* Feature-Tracking Global Longitudinal Strain Predicts Death in a Multicenter Population of Patients With Ischemic and Nonischemic Dilated Cardiomyopathy Incremental to Ejection Fraction and Late Gadolinium Enhancement. JACC Cardiovasc Imaging 11, 1419–1429 (2018).
- 49. Jeung, M. Y. *et al.* Myocardial tagging with MR imaging: overview of normal and pathologic findings. *Radiographics* **32**, 1381–1398 (2012).
- Christodoulou, A. G. *et al.* Magnetic resonance multitasking for motion-resolved quantitative cardiovascular imaging. *Nat Biomed* Eng 2, 215–226 (2018).
- Liu, Y., Hamilton, J., Rajagopalan, S. & Seiberlich, N. Cardiac Magnetic Resonance Fingerprinting: Technical Overview and Initial Results. JACC Cardiovasc Imaging 11, 1837–1853 (2018).
- 52. Vandoorne, K. & Nahrendorf, M. Multiparametric Imaging of Organ System Interfaces. Circ Cardiovasc Imaging 10, (2017).
- Duits, R. *et al.* Evolution equations on Gabor transforms and their applications. *Appl. Comput. Harmon. Anal.* 35, 483–526 (2013).
 Iles, L. *et al.* Myocardial fibrosis predicts appropriate device therapy in patients with implantable cardioverter-defibrillators for primary prevention of sudden cardiac death. *J Am Coll Cardiol* 57, 821–828 (2011).

Acknowledgements

The authors wish to thank David Veraert for animal handling, Leonie Niesen for performing animal surgeries and Klaas Nicolay for his scientific input and his warm support. This study was supported by the Technology Foundation STW, the Dutch Technology Foundation STW, which is part of the Netherlands Organisation for Scientific Research (NWO): K.V. was funded by grant 14716, H.B.K. was funded by grant 11865 and H.C.v.A. was supported by grant 11865.

Author contributions

M.v.d.B., P.Y.W.D., C.V.C.B. and K.V. conceived the study. M.v.d.B. and K.V. designed, performed, and analyzed most experiments and contributed to writing the manuscript. M.v.d.B., H.B.K. and H.C.v.A. performed strain analysis. H.C.v.A., P.Y.W.D., C.V.C.B. and K.V. discussed and interpreted data, provided strategic input, raised funding, and edited the manuscript. K.V. supervised the study and wrote the manuscript with input from all authors.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information is available for this paper at https://doi.org/10.1038/s41598-019-55864-7.

Correspondence and requests for materials should be addressed to K.V.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2019