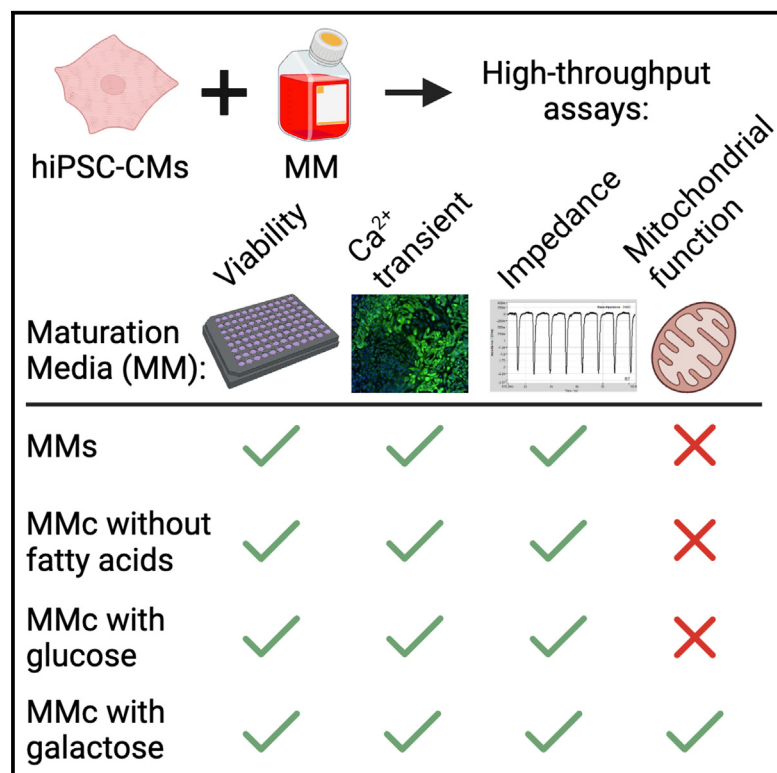


# Independent compartmentalization of functional, metabolic, and transcriptional maturation of hiPSC-derived cardiomyocytes

## Graphical abstract



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## In brief

Fetterman et al. systematically evaluated individual medium component contribution to hiPSC-CM maturation and long-term viability using high-throughput methods. They developed an optimized maturation media and discovered that hiPSC-CM maturation can be sub-specified into functional, metabolic, and transcriptomic maturation. This study establishes a framework for screening novel promoters of maturation.

## Highlights

- High-throughput evaluation of hiPSC-CM viability and maturation
- Identification of individual medium component contribution to viability and function
- Functional and metabolic maturation are largely independent



## Article

# Independent compartmentalization of functional, metabolic, and transcriptional maturation of hiPSC-derived cardiomyocytes

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## SUMMARY

Human induced pluripotent stem cell-derived cardiomyocytes (hiPSC-CMs) recapitulate numerous disease and drug response phenotypes, but cell immaturity may limit their accuracy and fidelity as a model system. Cell culture medium modification is a common method for enhancing maturation, yet prior studies have used complex media with little understanding of individual component contribution, which may compromise long-term hiPSC-CM viability. Here, we developed high-throughput methods to measure hiPSC-CM maturation, determined factors that enhanced viability, and then systematically assessed the contribution of individual maturation medium components. We developed a medium that is compatible with extended culture. We discovered that hiPSC-CM maturation can be sub-specified into electrophysiological/EC coupling, metabolism, and gene expression and that induction of these attributes is largely independent. In this work, we establish a defined baseline for future studies of cardiomyocyte maturation. Furthermore, we provide a selection of medium formulae, optimized for distinct applications and priorities, that promote measurable attributes of maturation.

## INTRODUCTION

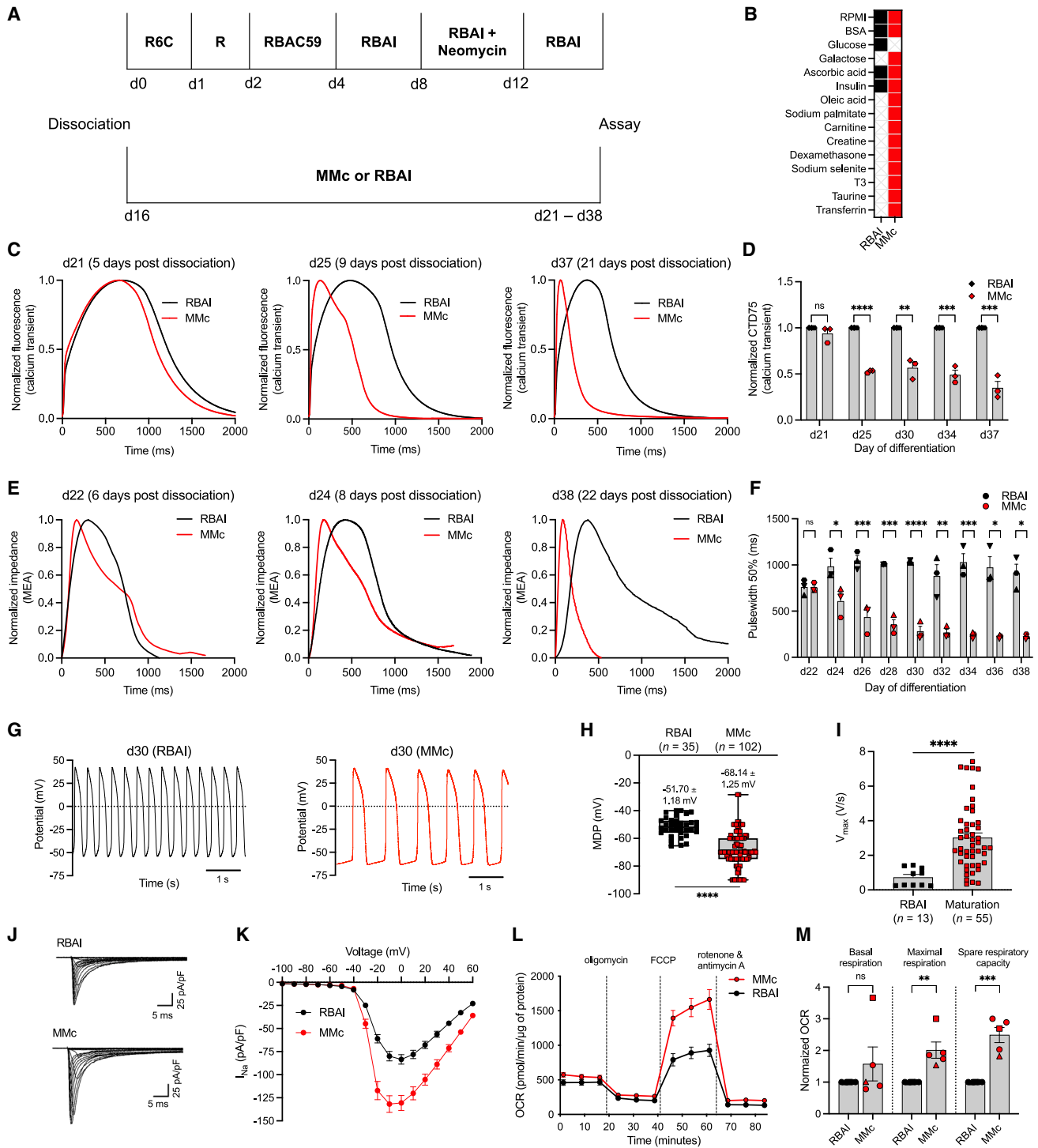
Human induced pluripotent stem cell-derived cardiomyocytes (hiPSC-CMs) are a powerful *in vitro* tool to screen therapeutics and to model patient-specific diseases and drug responses. hiPSC-CMs offer a minimally invasive source with unlimited supply compared to difficult-to-obtain and -maintain primary human CMs. However, a frequently cited limitation of hiPSC-CMs is their immaturity, as they have been suggested to more closely resemble fetal CMs. hiPSC-CMs differ from adult CMs structurally, electrophysiologically, mechanically, metabolically, and transcriptionally.<sup>1</sup> Several methods have been described to induce more adult-like properties in hiPSC-CMs, including the use of long-term culture (80+ days),<sup>2,3</sup> engineered growth surfaces that more closely resemble the consistency of the human heart,<sup>4</sup> and mechanical and electrical stimulation.<sup>5,6</sup> However, these methodologies are either slow or low throughput and not suitable for hiPSC-CM applications requiring large quantities of cells or that use multiple cell lines. An alternative approach is modification of the cell culture medium composition.<sup>1,5</sup> Induction of maturation through biochemical cues, by adding components to the medium rather than culturing in specialized systems, allows for reproducible, high-yield generation of more mature

hiPSC-CMs amenable to high-throughput applications for disease modeling and drug screening.

Previous studies of cell culture medium-based maturation have focused on biochemical cues involved in human cardiac maturation during the neonatal period, including metabolic substrates and hormones. At birth, the heart switches from glycolysis to more efficient fatty acid  $\beta$ -oxidation (FAO) to support greater postnatal energy demands.<sup>7</sup> Because hiPSC-CMs primarily rely on glycolysis as their main energy source, researchers investigated methods to promote FAO to enhance maturation. One strategy is to add fatty acids such as palmitate and oleate, which are the most abundant fatty acids in the serum of infants, to the medium as oxidative metabolism substrates.<sup>8–10</sup> Another strategy, used in combination with the addition of fatty acids, is to make glycolysis inefficient by reducing glucose concentration,<sup>11</sup> removing glucose,<sup>12</sup> or replacing glucose with galactose.<sup>8</sup>

In addition to metabolic substrates, thyroid hormones and glucocorticoids are essential for development and maturation of the fetal heart *in vivo*.<sup>13,14</sup> Elevated levels of the thyroid hormone triiodothyronine (T3) occur concurrent with rapid maturation of the heart postnatally.<sup>14</sup> Plasma concentrations of the endogenous glucocorticoid cortisol increase before birth and remain elevated immediately after birth.<sup>15</sup> Insulin growth factor 1 (IGF1) and





**Figure 1. High-throughput assays detect changes in maturation status of hiPSC-CMs**

(A) Schematic of hiPSC-CM differentiation with RBAI or MMc starting at day 16 until day of assay.

(B) Components of RBAI and MMc.

(C) Representative spontaneous high-throughput  $\text{Ca}^{2+}$  transient recordings of hiPSC-CMs in RBAI or MMc.

(D) CTD75 of  $\text{Ca}^{2+}$  transient recordings ( $n = 3$ ).

(E) Representative spontaneous high-throughput impedance recordings of hiPSC-CMs in RBAI or MMc.

(F) Pulse width at 50% of impedance recordings ( $n = 3$ ).

(G) Representative spontaneous AP traces of hiPSC-CMs in RBAI or MMc using manual patchclamp.

(legend continued on next page)

insulin support cardiac growth in the developing heart through interactions with the IGF1 receptor.<sup>14</sup> Studies have shown that T3, the glucocorticoid dexamethasone, and IGF1/insulin induce maturation in hiPSC-CMs, and, consequently, these components are frequently included in maturation media.<sup>16–18</sup>

Additional components have been added to maturation media to support the energy demands and overall survival of more mature hiPSC-CMs. Ascorbic acid, an antioxidant, both enhances cardiac differentiation by increasing proliferation of cardiac progenitor cells and induces maturation.<sup>19,20</sup> Taurine and L-carnitine are believed to enhance metabolism by supporting FAO through buffering the mitochondrial matrix and transporting fatty acids into the mitochondria, respectively.<sup>21</sup> Combinations of creatine, sodium selenite, transferrin, and insulin have been used to maintain cell viability in serum-free culture.<sup>21,22</sup> Existing maturation media formulations vary in complexity and together provide an extensive list of components that may contribute variably to promote maturation of hiPSC-CMs. However, these studies utilize formulations composed of many components, and the individual contribution of each component is rarely investigated, resulting in a lack of thorough investigation into the mechanism and necessity of each component for cell survival or maturation.

We established high-throughput techniques to study functional and metabolic maturation of hiPSC-CMs using individual medium components previously established in the literature to promote hiPSC-CM maturation and viability as a baseline. This in-depth analysis demonstrated that functional, metabolic, and transcriptional maturation of hiPSC-CMs are not inherently linked. We determined that certain composition modifications, such as replacement of galactose with glucose or removal of fatty acids, only affected mitochondrial function but did not change intracellular Ca<sup>2+</sup> dynamics, impedance, or voltage-gated sodium (Nav) current parameters. Overall, our work develops and extensively characterizes multiple maturation medium formulations that range in complexity and creates a powerful platform for unbiased screening for novel medium formulations.

## RESULTS

### High-throughput assays detect changes in maturation status of hiPSC-CMs

To assess the effect of cell culture media on CM maturation, hiPSC-CMs were maintained in either glucose-based maintenance medium (RBAI- RPMI with BSA, ascorbic acid, and insulin) or galactose and fatty acid-based complete maturation medium (MMc; Figures 1A and 1B; Table S1). MMc includes components cited in the literature to promote maturation and

viability. To determine whether culturing in MMc produced more mature hiPSC-CMs, we developed two high-throughput assays to assess maturation metrics: Ca<sup>2+</sup> dynamics and micro-electrode array (MEA)-based impedance recordings. After 9 days of MMc exposure, MMc-cultured hiPSC-CMs had a significantly shorter Ca<sup>2+</sup> transient duration at 75% (CTD75) compared to RBAI-cultured hiPSC-CMs (MMc: 0.53 ± 0.01 vs. RBAI: 1.0 ± 0; Figures 1C and 1D). Maximum upstroke and downstroke velocity were also significantly faster after 9 days cultured in MMc (1.78 ± 0.10 and 1.14 ± 0.10) compared to the control RBAI (1.0 ± 0; Figures S1A and S1B). Although all time points between 9 and 21 days in MMc produced similar Ca<sup>2+</sup> transient parameters, only 21 days in MMc produced a homogeneous response in all recorded wells (Figures 1D, S1A, S1B, S1E, and S1F). For the Ca<sup>2+</sup> transient assay, hiPSC-CMs tolerated culture in galactose for 21 days, the latest time point we assessed in this study (Figures 1C, 1D, S1A, and S1B). After testing a narrowed window of 17–21 days, we determined that hiPSC-CMs need at least 19 days in MMc starting at day 16 for all wells to fully respond (Figures S1C–S1F). While day 16 hiPSC-CMs required 19 days of MMc exposure to achieve a uniform Ca<sup>2+</sup> transient response, hiPSC-CMs cultured in MMc medium for only 12 days starting at day 20 or 10 days starting at day 24 produced an equivalent CTD75, indicating that older hiPSC-CMs respond faster to MMc (Figures S1G and S1H).

Using impedance recordings as a proxy for contraction of hiPSC-CM monolayers, we determined that hiPSC-CMs cultured in MMc for at least 8 days starting at day 16 had a significantly shorter pulse width at 50% compared to those grown in RBAI (Figures 1E and 1F). Although not always significant, hiPSC-CMs cultured in MMc also tended to produce a faster maximum upstroke and downstroke velocity compared to RBAI at all time points (Figures S1I and S1J). For the impedance assay, hiPSC-CMs tolerated culture in galactose for 22 days, the latest time point we assessed in this study (Figures 1C, 1D, S1A, and S1B). Because the contractility response of hiPSC-CMs is consistent following at least 8 days of MMc exposure starting on either day 16 or day 20, we designated 12 days of MMc starting at day 20 as the optimal time frame to induce maturation based on Ca<sup>2+</sup> transient and impedance recordings (Figure S1K).

Action potential (AP) and Nav current recordings revealed that culture in MMc resulted in hiPSC-CMs with more mature electrophysiological properties. Specifically, spontaneously beating hiPSC-CMs maintained in MMc exhibited a significantly more hyperpolarized maximum diastolic potential (MDP; −68.14 ± 1.25 mV) relative to RBAI (−51.70 ± 1.18 mV; Figures 1G and 1H). Paced hiPSC-CMs cultured in MMc had a significantly higher maximum upstroke velocity (V<sub>max</sub>) relative to those

(H) Maximum diastolic potentials (MDPs) of individual cells measured in spontaneously beating hiPSC-CMs (*n* > 3).

(I) Maximum upstroke velocities of individual cells measured in hiPSC-CMs paced at 1 Hz (*n* > 3).

(J) Representative recordings of Nav current (I<sub>Nav</sub>) normalized to cell capacitance.

(K) Mean I<sub>Nav</sub> current-voltage plot from automated patch-clamp experiments (*n* = 7).

(L) Mean oxygen consumption rate (OCR) of hiPSC-CMs cultured in MMc or RBAI (*n* = 5).

(M) Basal respiration, maximal respiration, and spare respiratory capacity of hiPSC-CMs cultured in MMc or RBAI (*n* = 5).

Each data point shape indicates a different hiPSC line. Data are presented as mean ± SEM. *n* = experimental replicates, unpaired Student's *t* test, \**p* ≤ 0.05, \*\**p* ≤ 0.01, \*\*\**p* ≤ 0.005, \*\*\*\**p* ≤ 0.0001; ns, not significant. See also Figure S1.

maintained in RBAI (MMc:  $30.23 \pm 2.76$  mV/ms vs. RBAI:  $7.33 \pm 1.64$  mV/ms), while the AP duration at 90% of repolarization (APD<sub>90</sub>) (MMc:  $43.04 \pm 4.39$  ms vs. RBAI:  $44.35 \pm 3.41$  ms) and peak amplitude (MMc:  $94.21 \pm 3.62$  mV vs. RBAI:  $89.67 \pm 1.88$  mV) remained unchanged (Figure 1I, S1L, and S1M). Nav currents were recorded by automated patch-clamp recording. Whole-cell recordings revealed that cells cultured in MMc exhibited greater peak current density compared to cells grown in RBAI (at 0 mV, MMc:  $-130.6 \pm 8.17$  pA/pF vs. RBAI:  $-80.73 \pm 4.83$  pA/pF; Figures 1J, 1K, and S1N). Cell capacitance did not differ between cells cultured in RBAI or MMc (MMc:  $19.02 \pm 0.44$  vs. RBAI:  $19.01 \pm 0.49$ ; Table S2). The calculated current voltage dependence of activation  $V_{1/2}$  was similar for both MMc- and RBAI-treated cells, and both curves exhibited similar slopes (k). Likewise, the voltage dependence of inactivation  $V_{1/2}$  for the Na<sub>v</sub> currents was similar between both treatments, and the inactivation curves also had similar slopes (Figure S1O; Table S2).

During mitochondrial stress tests, hiPSC-CMs cultured in MMc had more mature metabolic parameters compared to those cultured in RBAI, as indicated by increased oxygen consumption rates (OCRs). hiPSC-CMs maintained in MMc had the same basal respiration as RBAI-cultured cells (MMc:  $1.57 \pm 0.54$  vs. RBAI:  $1.0 \pm 0$ ) but greater maximal respiration (MMc:  $2.01 \pm 0.26$  vs. RBAI:  $1.0 \pm 0$ ) and spare respiratory capacity (MMc:  $2.49 \pm 0.24$  vs. RBAI:  $1.0 \pm 0$ ), indicating an enhanced mitochondrial oxidative capacity (Figures 1L and 1M).

### Optimized candidate component contribution to viability and Ca<sup>2+</sup> transient phenotype

To determine the necessity of candidate components, we evaluated hiPSC-CM viability and Ca<sup>2+</sup> dynamics by performing single-addition experiments in a minimal formulation consisting of base components (MMb) and then single-subtraction experiments in MMc (Figure 2A). Due to the complexity of the experiments, we established an experimental design to identify contributing components through strict statistical analysis on three experimental replicates. The final optimized candidate component concentrations determined by viability closely match those used in other hiPSC-CM maturation studies, except for a lower galactose concentration (Figure S2). Based on these results, we lowered the concentration of galactose from 10 mM to 2 mM to perform inclusion and exclusion experiments for each component as well as in all remaining studies. Inclusion of sodium selenite ( $1.11 \pm 0.01$ ) or insulin ( $1.25 \pm 0.08$ ) to MMb significantly improved viability, while exclusion of sodium selenite ( $0.92 \pm 0.03$ ), transferrin ( $0.91 \pm 0.01$ ), insulin ( $0.91 \pm 0.02$ ), ascorbic acid ( $0.88 \pm 0.04$ ), or T3 ( $0.81 \pm 0.03$ ) from MMc resulted in significantly lower viability (Figures 2B, 2C, and S3I).

When comparing Ca<sup>2+</sup> transient parameters, MMc cultured hiPSC-CMs, compared to those grown in MMb, had a significantly shorter CTD75 (MMc:  $0.28 \pm 0.04$  vs. MMb:  $1 \pm 0$ ) as well as a faster upstroke (MMc:  $2.28 \pm 0.24$  vs. MMb:  $1 \pm 0$ ) and downstroke velocity (MMc:  $2.32 \pm 0.40$  vs. MMb:  $1 \pm 0$ ; Figures 2D, 2F, and S3A–S3D). Using the additive approach, no single candidate component included in MMb was able to produce Ca<sup>2+</sup> transients equivalent to MMc. However, inclusion of transferrin ( $0.90 \pm 0.03$ ), insulin ( $0.73 \pm 0.08$ ), dexamethasone ( $0.69 \pm 0.08$ ), or T3 ( $0.66 \pm$

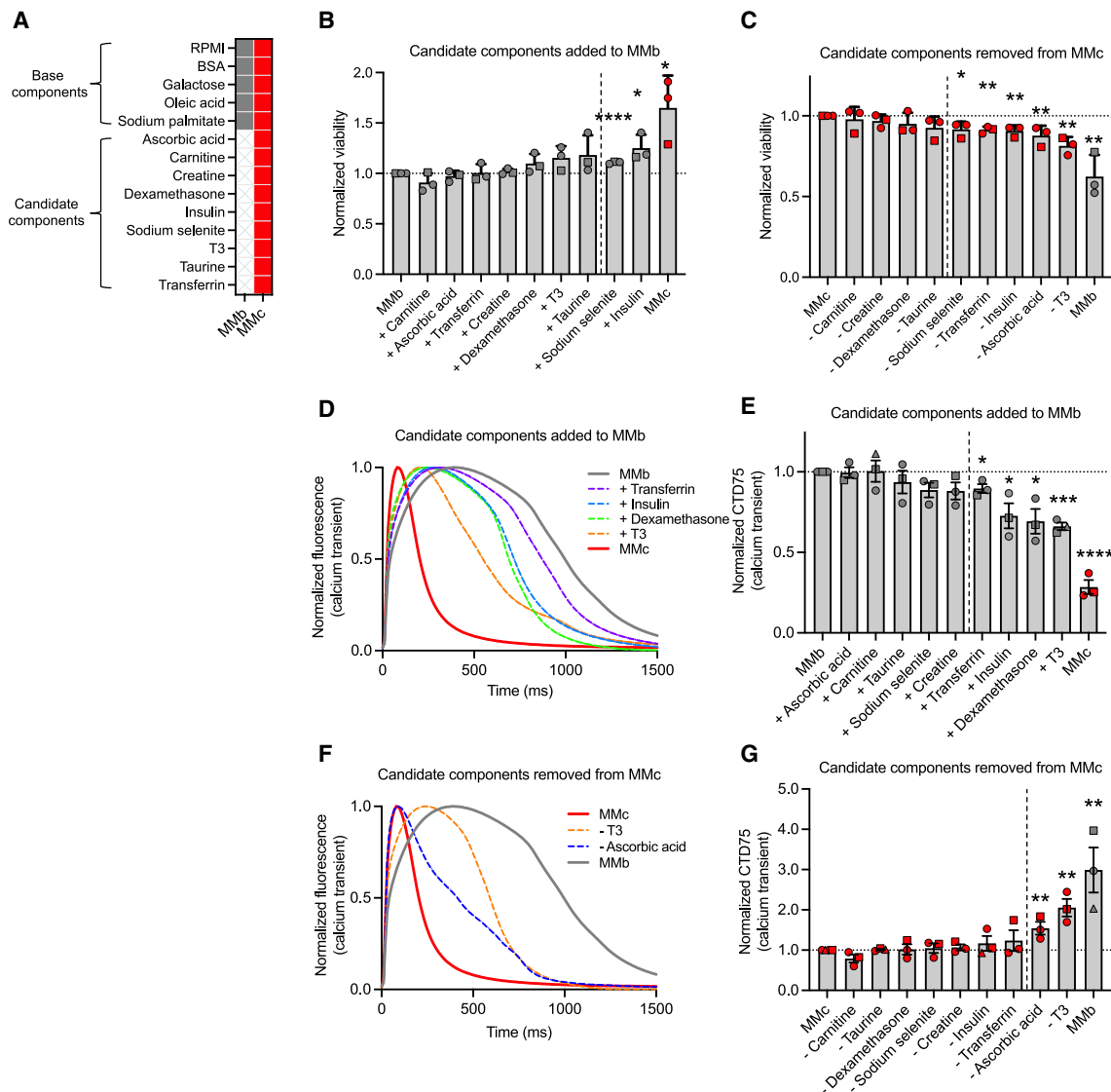
$0.02$ ) to MMb produced a shorter CTD75 compared to MMb only ( $1.0 \pm 0$ ; Figures 2D and 2E). The upstroke velocity was faster with inclusion of insulin ( $1.26 \pm 0.09$ ) relative to MMb only ( $1 \pm 0$ ; Figures S3A and S3B). Inclusion of sodium selenite ( $1.07 \pm 0.01$ ), ascorbic acid ( $1.16 \pm 0.03$ ), dexamethasone ( $1.30 \pm 0.08$ ), or insulin ( $1.32 \pm 0.08$ ) resulted in faster downstroke velocity compared to MMb only ( $1 \pm 0$ ; Figures S3C and S3D). Using the subtractive approach, we found that the exclusion of either ascorbic acid ( $1.54 \pm 0.16$ ) or T3 ( $2.05 \pm 0.22$ ) resulted in a longer CTD75 compared to MMc ( $1 \pm 0$ ; Figures 2F and 2G). Additionally, exclusion of ascorbic acid from MMc slowed both the upstroke and downstroke velocity (Figures S3E–S3H). While the additive and subtractive approaches were largely concordant regarding which candidate components promote a more mature Ca<sup>2+</sup> transient phenotype, we observed that removing insulin or sodium selenite resulted in a faster upstroke velocity or a faster upstroke and downstroke velocity, respectively (Figures S3E–S3H and S3J).

### Simple maturation medium reduces mitochondrial function compared to MMc

We next developed a simplified maturation medium (MMs) formulation by excluding the candidate components (carnitine, creatine, and taurine) that did not contribute to improving viability or promoting more mature Ca<sup>2+</sup> transients (Figure 3A). We compared viability, Ca<sup>2+</sup> transients, impedance, and metabolism between cells cultured in MMs and MMc. There was no difference in viability of hiPSC-CMs cultured in each medium (MMs:  $1.00 \pm 0.07$  vs. MMc:  $1 \pm 0$ ; Figure 3B). We observed a slight but significant improvement in Ca<sup>2+</sup> transient parameters with MMs, indicated by a shorter CTD75 (MMs:  $0.80 \pm 0.04$  vs. MMc:  $1 \pm 0$ ) and by greater maximum upstroke (MMs:  $1.19 \pm 0.05$  vs. MMc:  $1 \pm 0$ ) and downstroke (MMs:  $1.19 \pm 0.04$  vs. MMc:  $1 \pm 0$ ) velocities (Figures 3C and 3D). For measured impedance, there was no difference in pulse width at 50% (MMs:  $1.14 \pm 0.30$  vs. MMc:  $1 \pm 0$ ), maximum upstroke velocity (MMs:  $1.41 \pm 0.30$  vs. MMc:  $1 \pm 0$ ), or maximum downstroke velocity (MMs:  $1.24 \pm 0.24$  vs. MMc:  $1 \pm 0$ ) between paced hiPSC-CMs grown in MMs or MMc (Figures 3E and 3F). Although there was no difference in basal respiration (MMs:  $1.08 \pm 0.08$  vs. MMc:  $1 \pm 0$ ), the maximal respiration (MMs:  $0.79 \pm 0.04$  vs. MMc:  $1 \pm 0$ ) and spare respiratory capacity (MMs:  $0.67 \pm 0.04$  vs. MMc:  $1 \pm 0$ ) were lower for cells grown in MMs (Figures 3G and 3H).

### Galactose improves mitochondrial basal respiration

We next examined the effect of base components by first comparing glucose and galactose formulations of MMb, MMs, and MMc on hiPSC-CM viability and maturation (Figure 4A). Prior hiPSC-CM maturation media used galactose instead of glucose as an input to glycolysis. Metabolism of galactose through glycolysis generates no net ATP and, in turn, undergoes subsequent mitochondrial oxidative phosphorylation to generate additional energy.<sup>23</sup> Therefore, replacing glucose with galactose is expected to shift hiPSC-CMs from glycolysis to an oxidative metabolism that can support the increased energy demands of more mature cells. We found that glucose and galactose formulations did not differ in cell viability, Ca<sup>2+</sup> transient recordings, or impedance parameters (Figures 4B–4F and S4A–S4D). Of note, hiPSC-CMs grown in



**Figure 2. Optimized candidate component contribution to viability and Ca<sup>2+</sup> transient phenotype**

(A) MMB and MMc formulations.

(B) Additive approach to determine changes in hiPSC-CM viability when each candidate component is added to MMB one at a time from day 20 to day 33 ( $n = 3$ ).

(C) Subtractive approach to determine changes in hiPSC-CM viability when each candidate component is removed from MMc one at a time from day 20 to day 33 ( $n = 3$ ).

(D) Representative spontaneous hiPSC-CM Ca<sup>2+</sup> transient recordings of candidate components that significantly shorten CTD75 when added one at time to MMB from day 20 to day 35.

(E) CTD75 measured when each candidate component is added to MMB ( $n = 3$ ).

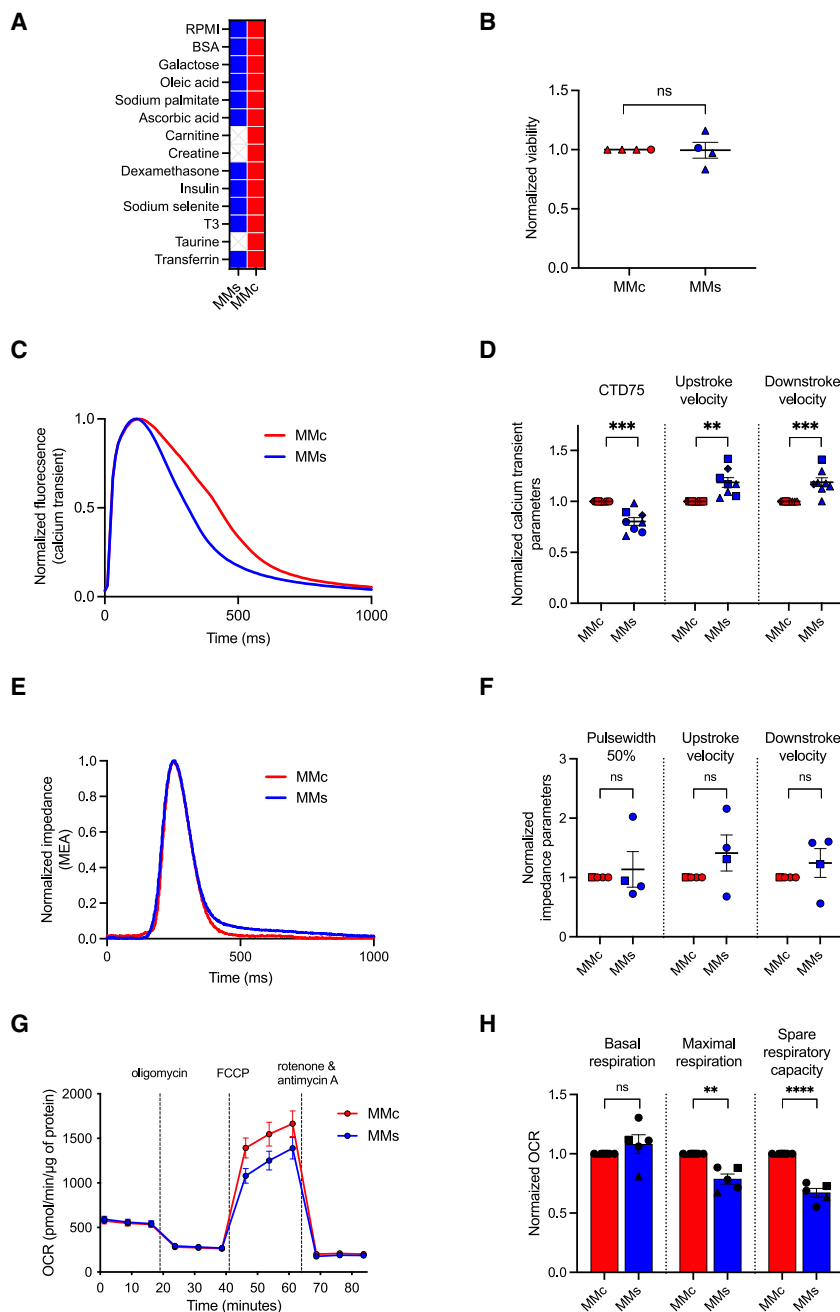
(F) Representative spontaneous hiPSC-CM Ca<sup>2+</sup> transient recordings of candidate components that significantly increase CTD75 when removed one at a time from MMc.

(G) CTD75 measured when each candidate component is removed from MMc ( $n = 3$ ).

Each data point shape indicates a different hiPSC line. Data are presented as mean  $\pm$  SEM.  $n =$  experimental replicates, unpaired Student's  $t$  test,  $*p \leq 0.05$ ,  $**p \leq 0.01$ ,  $***p \leq 0.005$ ,  $****p \leq 0.0001$ . All components to the right of the dashed line have  $p \leq 0.05$ . See also [Figure S3](#).

glucose containing MMB never reached the expected beat rate dictated by our pacing protocol, and therefore impedance parameters were not analyzed for this condition. hiPSC-CMs cultured in glucose- or galactose-containing MMs or MMc had no differences in peak Nav current density and the same  $V_{1/2}$  and  $k$  values for Nav current voltage-dependence of

activation and inactivation ([Figures S4E–S4G](#); [Table S2](#)). Mitochondrial stress tests revealed higher basal respiration when galactose replaced glucose in MMB (MMb-gal:  $1.28 \pm 0.15$  vs. MMb-glu:  $0.86 \pm 0.09$ ), MMs (MMs-gal:  $1.08 \pm 0.08$  vs. MMs-glu:  $0.55 \pm 0.08$ ), and MMc (MMc-gal:  $1.0 \pm 0$  vs. MMc-glu:  $0.57 \pm 0.08$ ; [Figures 4G](#) and [4H](#)). However, substitution



**Figure 3. Simple maturation medium reduces mitochondrial function compared to MMc**

(A) MMc and MMc formulations. (B) Viability of hiPSC-CMs cultured in MMc or MMc from day 20 to day 33 ( $n = 4$ ). (C) Representative spontaneous  $\text{Ca}^{2+}$  transient recordings of hiPSC-CMs cultured in MMc or MMc from day 20 to day 35. (D) CTD75 measured when hiPSC-CMs are cultured in MMc or MMc ( $n = 8$ ). (E) Representative paced (0.8 Hz) impedance recordings of hiPSC-CMs cultured in MMc or MMc. (F) Pulse width at 50% measured from impedance recordings of hiPSC-CMs cultured in MMc or MMc from day 20 to day 32 ( $n = 4$ ). (G) Mean OCR of hiPSC-CMs cultured in MMc or MMc from day 20 to day 33 ( $n = 5$ ). (H) Basal respiration, maximal respiration, and spare respiratory capacity of hiPSC-CMs cultured in MMc or MMc ( $n = 5$ ). Each data point shape indicates a different hiPSC line. Data are presented as mean  $\pm$  SEM.  $n =$  biological replicates, unpaired Student's  $t$  test, \* $p \leq 0.05$ , \*\* $p \leq 0.01$ , \*\*\* $p \leq 0.005$ , \*\*\*\* $p \leq 0.0001$ .

different  $V_{1/2}$  for inactivation when FAs were removed from MMc. No difference was observed when FAs were removed from MMc (Figures S5E–S5I; Table S2). For metabolic function, we saw no change in measured parameters when we removed FAs from MMc. However, in the absence of FAs, basal respiration (MMc:  $1.0 \pm 0$  vs. MMc-no FA:  $0.75 \pm 0.06$ ), maximal respiration (MMc:  $1.0 \pm 0$  vs. MMc-no FA:  $0.71 \pm 0.08$ ), and spare respiratory capacity (MMc:  $1.0 \pm 0$  vs. MMc-no FA:  $0.70 \pm 0.09$ ) were significantly lower compared to hiPSC-CMs cultured in MMc (Figures 5G and 5H).

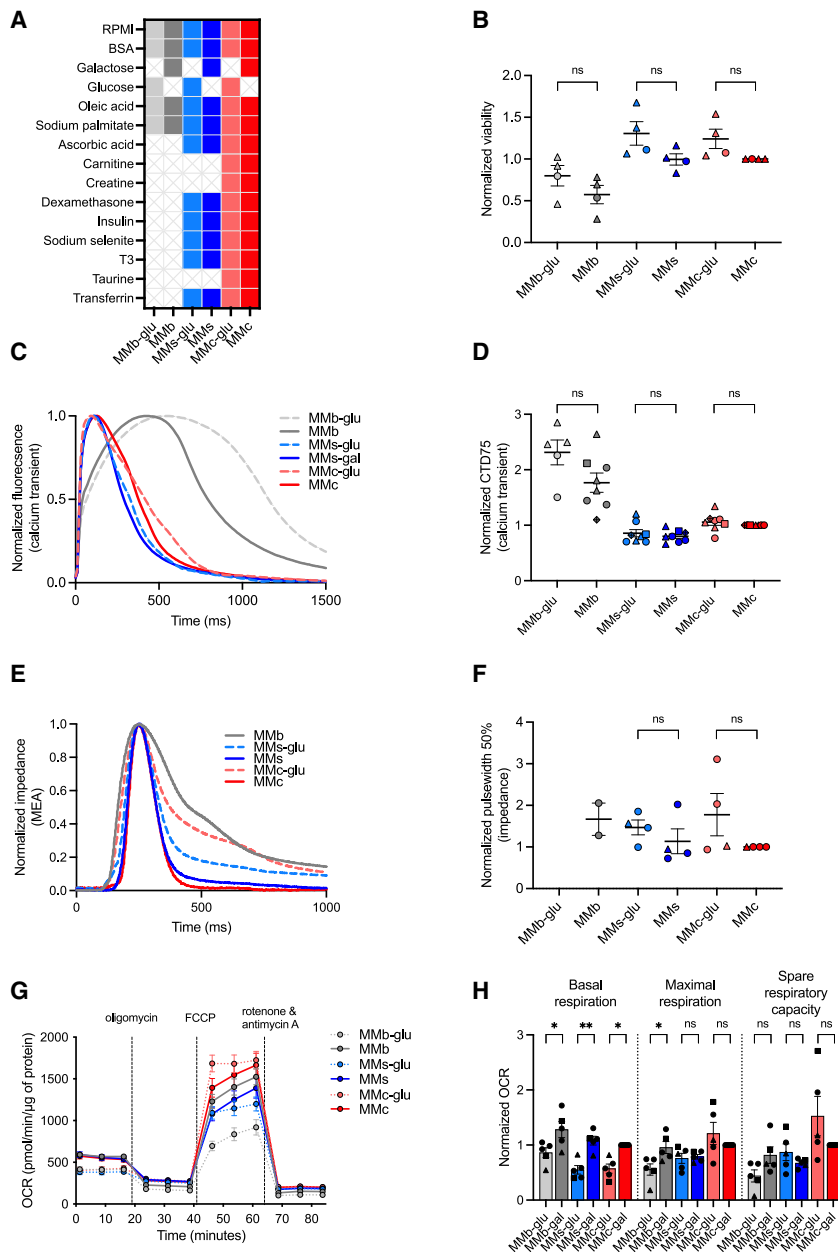
To evaluate whether FAs and BSA could be removed to make the formulation chemically defined (CD), we tested MMc and MMc formulations without FA and BSA (MMc-CD and MMc-CD; Figure 5A). We observed no change in viability or impedance parameters for cells grown in MMc and MMc compared to those

grown in their respective CD formulations. Only cells cultured in the MMc-CD formulation had  $\text{Ca}^{2+}$  transients with lower maximum upstroke and downstroke velocities (Figures 5B–5F and S5A–S5D). We observed no change in peak Nav current density for hiPSC-CMs grown in MMc and MMc compared to those grown in MMc-CD or MMc-CD, respectively. Kinetic parameters of Nav channels remained the same, except for decreased  $V_{1/2}$  values of both Nav current activation and inactivation when FAs and BSA were removed from MMc (Figures S5E–S5I; Table S2). For metabolic function, we found that basal respiration, maximal respiration, and spare respiratory capacity were

### Fatty acids contribute to metabolism but not viability, $\text{Ca}^{2+}$ dynamics, impedance, or Nav current

To evaluate the necessity of fatty acids (FAs), we tested MMc and MMc formulations with FA (MMc and MMc) and without FA (MMc-no FA and MMc-no FA; Figure 5A). Removing FAs from MMc or MMc did not change viability,  $\text{Ca}^{2+}$  dynamics, or impedance parameters (Figures 5B–5F and S5A–S5D). For Nav current recordings, we observed a lower peak density and

of glucose with galactose in MMc or MMc did not alter maximal respiration or spare respiratory capacity (Figures 4G and 4H).



**Figure 4. Galactose improves mitochondrial basal respiration**

(A) Glucose and galactose formulations of MMb, MMs, and MMc.

(B) Viability of hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc from day 20 to day 33 ( $n = 4$ ).

(C) Representative spontaneous  $Ca^{2+}$  transient recordings of hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc from day 20 to day 35.

(D) CTD75 of hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc ( $n = 8$ ).

(E) Representative paced (0.8 Hz) impedance recordings of hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc from day 20 to day 32.

(F) Pulse width at 50% measured from impedance recordings of paced (0.8 Hz) hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc ( $n = 4$ ).

(G) Mean OCR of hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc from day 20 to day 33 ( $n = 5$ ).

(H) Basal respiration, maximal respiration, and spare respiratory capacity of hiPSC-CMs cultured in glucose or galactose formulations of MMb, MMs, or MMc ( $n = 5$ ).

Each data point shape indicates a different hiPSC line. Data are presented as mean  $\pm$  SEM.  $n =$  experimental replicates, unpaired Student's  $t$  test,  $*p \leq 0.05$ ,  $**p \leq 0.01$ ,  $***p \leq 0.005$ ,  $****p \leq 0.0001$ . See also [Figure S4](#).

tering of the top 100 expressed genes and principal-component analysis revealed that glucose- and galactose-based formulations grouped together, suggesting that energy substrate was an important determinant of clustering and resulted in the largest transcriptomic shift (Figures 6A and 6B). Differential gene expression analysis demonstrated a strong separation between glucose and galactose conditions and very little separation between various galactose conditions. For example, galactose-based MMc-cultured cells compared

not different between hiPSC-CMs grown in MMs and MMs-CD. Cells grown in MMc and MMc-CD exhibited comparable basal respiration, while maximal respiration (MMc:  $1.0 \pm 0$  vs. MMc-CD:  $0.60 \pm 0.07$ ) and spare respiratory capacity (MMc:  $1.0 \pm 0$  vs. MMc-CD:  $0.51 \pm 0.06$ ) were significantly higher for hiPSC-CMs grown in MMc (Figures 5G and 5H).

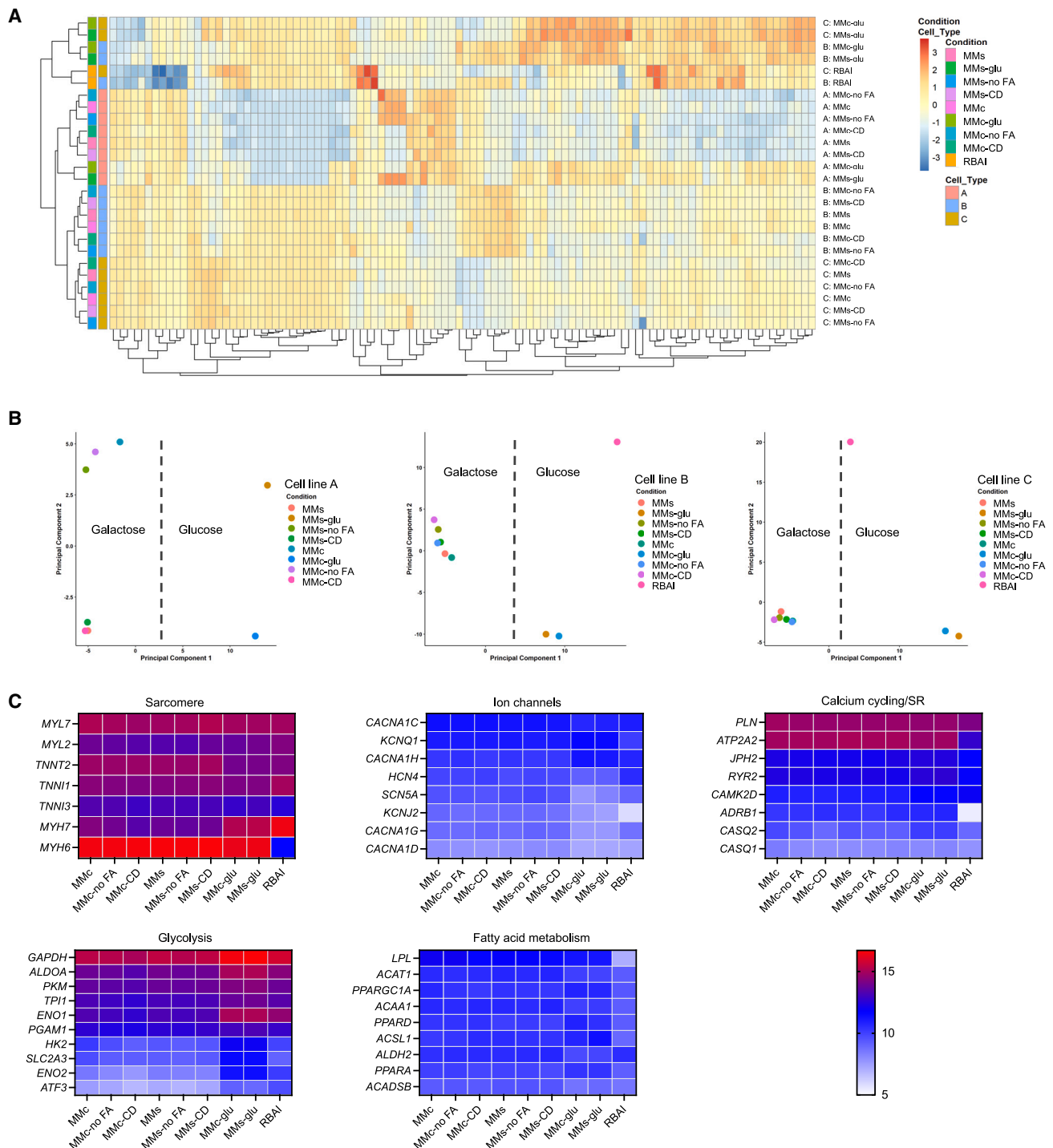
### Energy substrate is a key driver of hiPSC-CM transcriptomics

To assess differences in gene expression, RNA sequencing (RNA-seq) was performed on day 33 hiPSC-CMs cultured in MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, MMs-CD, or RBAI for 2 weeks. Both hierarchical clus-

tering of the top 100 expressed genes and principal-component analysis revealed that glucose- and galactose-based formulations grouped together, suggesting that energy substrate was an important determinant of clustering and resulted in the largest transcriptomic shift (Figures 6A and 6B). Differential gene expression analysis demonstrated a strong separation between glucose and galactose conditions and very little separation between various galactose conditions. For example, galactose-based MMc-cultured cells compared to glucose-based MMc-glu- and RBAI-grown cells had 4,347 and 4,847 differentially expressed genes, respectively (Table S3). Similarly, cells grown in MMs compared to MMs-glu and RBAI had 3,816 and 4,670 differentially expressed genes, respectively. MMc cultured cells had very few differentially expressed genes compared to cells cultured in other galactose-based formulations (MMc vs. MMs: 2 genes, MMc vs. MMc-no FA: 0 genes, and MMc vs. MMc-CD: 16 genes). hiPSC-CMs grown in MMc had differentially expressed genes involved in sarcomere structure, ion channels, and  $Ca^{2+}$  handling compared to cells cultured in RBAI and MMc-glu (Figure 6C; Table S3). These differences correlate with known features of maturation. For example, we observed a switch in sarcomeric







**Figure 6. Energy substrate is key driver of hiPSC-CM transcriptomics**

(A) Heatmap of top 100 expressed genes for hiPSC-CMs generated from 3 different hiPSC lines and cultured in 9 different medium formulations from day 20 to day 33.

(B) Principal-component analysis (PCA) plots of hiPSC-CMs generated from 3 different hiPSC lines and cultured in 9 different medium formulations.

(C) Heatmaps of genes related to metabolism and cardiac structure and function.

See also [Table S3](#).

that ascorbic acid improved structural and functional maturation of hiPSC-CMs.<sup>19</sup> Another study demonstrated that, when added to a maintenance medium, T3 improved morphological, molecular, Ca<sup>2+</sup> transient, contractility, and metabolic parameters of hiPSC-CM maturation.<sup>16</sup> We found that ascorbic acid and T3 produced more mature Ca<sup>2+</sup> transients, which aligns with these two studies.<sup>16,19</sup> Studies have shown that dexamethasone and IGF1, which activates the same receptor as insulin, did not improve the specific areas of hiPSC-CM maturation investigated. However, when each is combined with T3 or all three combined together, synergistic effects promoting maturation have been reported.<sup>17,18,24</sup> For example, Birket et al. found that T3 alone, along with various combinations of T3 with dexamethasone and IGF1, positively modulated the resting membrane potential, as determined through a proxy fluorescence assay. They further demonstrated that combining all three components consistently outperformed single or dual combinations in regard to improved maturation of metabolic, AP, and contractility properties.<sup>17</sup> Although the combinations of carnitine, creatine, and taurine<sup>11,12,21</sup> as well as insulin, transferrin, and selenium<sup>12,21</sup> have been included in multicomponent maturation medium formulations, the individual role of each was not explored. For the first time, we determined that dexamethasone, insulin, sodium selenite, and transferrin are individually important for Ca<sup>2+</sup> dynamics, while carnitine, creatine, and taurine are dispensable. It is unsurprising that the removal of these 3 components identified as dispensable from the Ca<sup>2+</sup> transient screen did not change the performance of hiPSC-CMs in subsequent Ca<sup>2+</sup> dynamic, impedance, and Nav current recordings, since these measure closely related aspects of the AP and excitation-contraction (EC) coupling. This suggests that Ca<sup>2+</sup> imaging is sensitive enough to detect components that induce maturation of hiPSC-CM AP and EC coupling-related functions and is an appropriate methodology to screen established and novel components of maturation in future studies.

When investigating metabolic parameters of hiPSC-CMs, we discovered that although carnitine, creatine, and taurine were dispensable for AP-related assays, they were not dispensable for mitochondrial function. These three components are often added to maturation media together and, although not individually examined and validated, it is hypothesized that they contribute to hiPSC-CM bioenergetics.<sup>11,12,21</sup> Cells cultured in MMc had higher mitochondrial respiration parameters compared to cells cultured in MMc without carnitine, creatine, and taurine, which is indicative of a transition from a more immature glycolytic profile to a more mature and efficient oxidative metabolism. This correlates with the number of reports showing their importance in regulating cell energy demands. Taurine is a regulator of the electron transport chain. Schaffer et al. observed increased glycolysis, reduced oxidation of glucose and FAs, and decreased ATP production in mice with taurine-deficient hearts.<sup>25</sup> This can explain why the absence of taurine resulted in a less oxidative metabolism as observed in our study. Within the creatine kinase pathway, creatine is responsible for shuttling ATP from the mitochondria to the cytosol and regulates this process based on the energy demands of the cell.<sup>26</sup> Removing creatine from the medium potentially decreases the creatine pool available to shuttle ATP and makes the cell less equipped to handle cell stressors, which is an indicator of

immaturity. Carnitine is required for long-chain FA transport from the cytosol into the mitochondria, where subsequent FAO occurs.<sup>27</sup> The absence of carnitine from the medium would then result in a less mature metabolism due to reduced FAO and could explain the decrease we observed in mitochondrial function. Interestingly, carnitine palmitoyltransferase 1A (*CPT1A*), which encodes an enzyme for carnitine-dependent transport into the mitochondria, was one of only two genes differentially expressed in hiPSC-CMs cultured in MMc compared to MMc, indicating that the presence of carnitine in MMc might be influencing this gene regulation.<sup>28</sup> With the knowledge that one or more of these components have the potential to increase ATP production within hiPSC-CMs, a future study can investigate the OCR of cells cultured in carnitine, creatine, or taurine to identify which of these three components are contributing to improved metabolic maturation.

In previous studies, an alternative energy substrate to the high glucose concentrations found in most basal media, such as low glucose, no glucose, or galactose, was part of complex maturation medium formulations being compared to a simple maintenance medium. When there was a direct comparison of the same formulation with two different energy substrates, only metabolic maturation was assessed leaving the impact on other aspects of maturation unknown. For example, Rana et al. demonstrated that energy substrate, specifically galactose, improved metabolic maturation.<sup>29</sup> However, the effect of these metabolic substrates on other areas of maturation, such as structure or physiological function, was not reported. In addition to improved metabolic maturation, Correia et al. demonstrated improved transcriptional, structural, and functional maturation status of hiPSC-CMs grown in a galactose-based medium with FAs compared to a glucose-based medium without FAs, making it difficult to distinguish if the observed difference was due to galactose, FAs, or the combination of the two.<sup>8</sup> Our study builds upon these studies by directly comparing galactose and glucose versions of three medium formulations to distinguish the effect of the energy substrate on functional and metabolic hiPSC-CM maturation. Our findings align with these studies in that galactose rather than glucose improves metabolic maturation status. Glucose and galactose versions of the same medium also had around 4,000 differentially expressed genes, indicating that energy substrate greatly influences the transcriptional profile of hiPSC-CMs. This suggests that, when the components contributing to more mature Ca<sup>2+</sup> transients are included in the medium, replacing glucose with galactose enhances metabolic maturation and influences the transcriptome but does not further enhance Ca<sup>2+</sup> transient, impedance, or Nav current maturation status.

We found that removing FAs from the formulations also decreased mitochondrial function while not impacting functional parameters. Only a handful of studies that include FAs have direct comparisons of medium formulations with and without FAs, and often both FAs and energy substrate are being altered at the same time. Of these studies, there are conflicting reports on whether FAs improve maturation. For example, Yang et al. used a glucose-based medium and compared adding palmitate, oleate, and linoleate to the same medium and demonstrated that these additions improved Ca<sup>2+</sup> transient kinetics, contractile force, AP parameters, and mitochondrial function.<sup>9</sup> This

supports the concept that FAs, even in the presence of glucose, have a role in several aspects of hiPSC-CM maturation. Hu et al. also added FAs to a glucose-based medium but found no significant improvement in metabolic or structural maturation. However, when they added FAs to a formulation without glucose or galactose, metabolic, structural, contractile, and calcium transient parameters improved, indicating increased maturation.<sup>30</sup> These results indicate that an alternative energy substrate to glucose is required for FAs to impact maturation. Our study supports the concept that the combination of FAs and galactose improves metabolic maturation; however, we did not see an improvement in other areas of maturation. When we removed FAs from MMc, we saw a decreased oxidative metabolism similar to the levels observed in cells cultured in MMs. But interestingly, no additional loss was observed with the removal of FAs from MMs suggesting that without carnitine, creatine, or taurine, FAs cannot be utilized as an oxidative substrate. This could explain the difference between our study and the findings of Rana et al., where they observed no change in metabolic maturation when adding FAs to a galactose- or glucose-based medium.<sup>29</sup> Additionally, we did not see a difference in transcriptional profiles of hiPSC-CMs cultured with or without FAs, making them dispensable for gene regulation.

This leaves us with the question of how much further can we refine hiPSC-CM functional and metabolic maturation using a medium-based approach and whether certain aspects should be focused on depending on the applications. For example, for drug screening and safety testing, future studies should examine whether there is a differential drug response with varying levels of functional and metabolic maturity. If both are important, we recommend combining Ca<sup>2+</sup> imaging and mitochondrial stress tests for future screens of inducers of maturation. These screens can include novel or established components targeting identified pathways important for maturation in both MMb to better understand their individual role as well as in MMc to determine whether there is an additive effect. For example, small molecules that have previously been identified to improve hiPSC-CM maturation and are regulators of metabolic pathways, the cell cycle, or developmental pathways can be screened.<sup>30–33</sup> Additional medium alterations, such as increasing Ca<sup>2+</sup> concentrations in the basal medium, which is less than one-third of physiological levels, could increase the maturation status of Ca<sup>2+</sup> transients or contractility, as observed previously in increased contractile force of human engineered heart tissues.<sup>34</sup>

In summary, we found that ascorbic acid, dexamethasone, insulin, sodium selenite, T3, and transferrin contribute to viability and more mature Ca<sup>2+</sup> transients and contractility. Galactose and FAs, along with a combination of carnitine, creatine, and taurine, contribute to improved metabolism. Hence, we recommend MMc as a balanced formulation for enhancing multiple facets of maturation and to use as a baseline in combination with the high-throughput strategies we established to screen for novel inducers of maturation.

### Limitations of the study

In this study, we generated both a high-throughput system to investigate various facets of hiPSC-CM maturation and an optimized maturation medium using components established in the

literature as a baseline. Therefore, we did not screen and identify novel inducers of maturation or viability in this study. Also, while we probed multiple aspects of maturation using specific assays to measure viability, Ca<sup>2+</sup> transients, impedance, mitochondrial function, and electrophysiology, we did not further examine component effects on structures or pathways related to these assays, such as the presence of t-tubules, sarcomeric organization, exit from the cell cycle, or multinucleation. Additionally, previous studies have indicated that galactose could have toxic effects on CMs.<sup>35</sup> In this study, most experiments were performed using hiPSC-CMs cultured in galactose for 2 weeks and, in the case of Ca<sup>2+</sup> dynamic and impedance recordings, up to 3 weeks. Although we did not observe toxicity to hiPSC-CMs in these studies, potential toxic effects of extended culture in galactose could be examined in future studies. Last, both beneficial and detrimental effects of the maturation media could be masked due to the culture of hiPSC-CMs in monolayers rather than in a 3D tissue format. This high-throughput system will be a powerful tool to identify components contributing to maturation and to inform further in-depth mechanistic studies.

### STAR★METHODS

Detailed methods are provided in the online version of this paper and include the following:

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### SUPPLEMENTAL INFORMATION

Supplemental information can be found online at <https://doi.org/10.1016/j.celrep.2024.114160>.

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### AUTHOR CONTRIBUTIONS

P.W.B., K.A.F., and M.B. designed the research. K.A.F. completed most experiments, along with M.B., D.M.L.-L., C.G.V., H.F., and M.J. The plasmid was generated by J.-M.L.D. and A.L.G. RNA-seq data were analyzed by

B.L. and Y.S. P.W.B. supervised the project. P.W.B., K.A.F., and M.B. wrote the manuscript with input from all other authors.

#### DECLARATION OF INTERESTS

The authors declare no competing interests.

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## STAR★METHODS

### KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
<b>Bacterial and virus strains</b>		
CytoTune-iPS 2.0 Sendai Reprogramming Kit	Invitrogen	Cat#A16518
<b>Chemicals, peptides, and recombinant proteins</b>		
Thiazovivin	LC Labs	Cat#T-9753
CHIR99021	LC Labs	Cat#C-6556
Wnt-C59	Biorbyt	Cat#orb1881132
L-ascorbic acid 2-phosphate trisodium salt	Wako	Cat#321-44823
Fatty acid-free bovine serum albumin	GenDEPOT	Cat#A0100
Recombinant human insulin	Gibco	Cat#A11382IJ
Neomycin	Gibco	Cat#10131027
Liberase TH	Roche	Cat#5401151001
Galactose	Fisher	Cat#BP656-500
Sodium palmitate	Sigma	Cat#P9767
Oleic acid	Sigma	Cat#O1383
Creatine phosphate disodium salt tetrahydrate	Dot Scientific	Cat#DSC70300-25
Taurine	Sigma	Cat#T8691
Recombinant human transferrin	In Vitria	Cat#777TRF029
Sodium selenite	Sigma	Cat#S5261
L-carnitine hydrochloride	Sigma	Cat#C0283
Dexamethasone	Sigma	Cat#C0283
3,3',5-Triiodo-L-thyronine sodium salt	Sigma	Cat#T6397
Pluronic F-127	Sigma	Cat#P2443
Probenecid	Sigma	Cat#P8761
<b>Critical commercial assays</b>		
MycAlert PLUS Kit	Lonza	Cat#LT07-705
PrestoBlue	Invitrogen	Cat#A13262
Cal-520 a.m.	AAT Bioquest	Cat#21130
Seahorse XF Cell Mito Stress Test Kit	Agilent Technologies	Cat#103015-100
BCA protein assay	Thermo Scientific	Cat#23227
Direct-zol RNA MicroPrep kit	Zymo	Cat#R2062
<b>Deposited data</b>		
Raw and analyzed data	This paper	GEO: GSE244962
<b>Experimental models: Cell lines</b>		
19c3	Kuo et al. <sup>36</sup>	N/A
21c10	Lyra-Leite et al. <sup>37</sup>	N/A
22c10	Lyra-Leite et al. <sup>37</sup>	N/A
23c1	Kuo et al. <sup>36</sup>	N/A
25c1	This paper	N/A
26c3	This paper	N/A
GW124c9	This paper	N/A
GW132c2B	This paper	N/A
<b>Recombinant DNA</b>		
pAAVS1-Puro-TNNT2-Neo	This paper	RRID: Addgene_214013

(Continued on next page)

**Continued**

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Software and algorithms		
SOAPnuke	Chen et al. <sup>44</sup>	<a href="https://github.com/BGI-flexlab/SOAPnuke">https://github.com/BGI-flexlab/SOAPnuke</a>
STAR	Dobin et al. <sup>45</sup>	<a href="https://code.google.com/archive/p/rna-star/">https://code.google.com/archive/p/rna-star/</a>
RSEM	Li et al. <sup>46</sup>	<a href="http://deweylab.github.io/RSEM/">http://deweylab.github.io/RSEM/</a>
DESeq2 R package	Love et al. <sup>47</sup>	<a href="https://www.bioconductor.org/packages/release/bioc/html/DESeq2.html">https://www.bioconductor.org/packages/release/bioc/html/DESeq2.html</a>
Excel (version 16.81)	Microsoft	<a href="https://www.microsoft.com/en-us/microsoft-365/">https://www.microsoft.com/en-us/microsoft-365/</a>
GraphPad Prism (version 10.0.1)	GraphPad	<a href="https://www.graphpad.com/features/">https://www.graphpad.com/features/</a>
CyteSeer Analysis (version 2.9)	Vala Sciences	<a href="https://valasciences.com/">https://valasciences.com/</a>
CardioExcyte Control 96 (version 1.8)	Nanon Technologies	<a href="https://www.nanion.de/">https://www.nanion.de/</a>
Data Controller 384 (version 1.6)	Nanon Technologies	<a href="https://www.nanion.de/">https://www.nanion.de/</a>
Seahorse Wave (version 2.6)	Agilent Technologies	<a href="https://www.agilent.com/en/product/cell-analysis/real-time-cell-metabolic-analysis/xf-software">https://www.agilent.com/en/product/cell-analysis/real-time-cell-metabolic-analysis/xf-software</a>

**RESOURCE AVAILABILITY**

**Lead contact**

Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact, Paul Burrige ([paul.burrige@northwestern.edu](mailto:paul.burrige@northwestern.edu)).

**Materials availability**

Plasmids used in this study have been deposited to Addgene ([pAAVS1-Puro-TNNT2-Neo](https://addgene.org/pAAVS1-Puro-TNNT2-Neo), Addgene#214013). hiPSC lines used in this study are available from the **lead contact**, Paul Burrige ([paul.burrige@northwestern.edu](mailto:paul.burrige@northwestern.edu)), with a completed Materials Transfer Agreement.

**Data and code availability**

- RNA-seq datasets generated in this study are available at the NCBI Gene Expression Omnibus (GEO) as accession number GSE244962.
- The software and algorithms for data analyses used in this study are published and referenced.
- Any additional information required to reanalyze the data reported in this work paper is available from the **lead contact** upon request.

**EXPERIMENTAL MODEL AND STUDY PARTICIPANT DETAILS**

**Human induced pluripotent stem cell culture**

The hiPSC lines used in this publication include 19c3 (M), 21c10 (F), 22c10 (M), 23c9 (M), 25c3 (M), 26c3 (M), GW124c9 (M), and GW132c2B (F).<sup>36,37</sup> Protocols were approved by the Northwestern University Institutional Review Board and written informed consent was obtained from all volunteers. hiPSC lines were derived from isolated peripheral blood mononuclear cells of healthy volunteers using a Sendai virus (Invitrogen, A16518) reprogramming protocol and cultured in B8 as previously described.<sup>36</sup> Once established, each line was transfected with an exogenous *TNNT2* promoter-driven neomycin resistance cassette targeting the AAVS1 locus for cardiomyocyte selection during differentiation. Cells were maintained in B8 medium on 1:800 growth factor reduced Matrigel (Corning, 356234) diluted in DMEM (Corning, 10013CV), except for the first 24 h after passage when B8 was supplemented with 2  $\mu$ M thiazovivin (B8T, LC Labs, T-9753).<sup>36,38,39</sup> hiPSC lines at  $\sim$ 75% confluency were passaged in B8T at a ratio of 1:15 every 4 days using 0.5 mM EDTA (Corning, 46-034-CI) diluted in DPBS<sup>-/-</sup> (Corning, 20-031-CV) to a final concentration of 0.5  $\mu$ M for 6 min at RT. All established pluripotent lines and lines undergoing reprogramming were maintained at 37°C in Heracell VIOS 160i humidified incubators (Thermo) with 5% CO<sub>2</sub> and 5% O<sub>2</sub>. All cultures were routinely tested for mycoplasma using a MycoAlert PLUS Kit (Lonza, LT07-710) and a Varioskan LUX (Thermo) plate reader.

**Cardiac differentiation**

hiPSC lines were differentiated into cardiomyocytes using a previously described RBAI protocol with slight modifications.<sup>40</sup> Briefly, hiPSC lines were grown in B8 medium for 4 days until reaching  $\sim$ 75% confluency. To start the differentiation (day 0), B8 medium was



changed to R6C which is RPMI 1640 (Corning, 10-040-CM) supplemented with 6  $\mu$ M of glycogen synthase kinase 3-b inhibitor CHIR99021 (LC Labs, C-6556). On day 1, medium was changed to R which is RPMI 1640 (Corning, 10-040-CM) basal medium alone, and on day 2, medium was changed to RBA-C59 which is RPMI 1640 (Corning, 10-040-CM) supplemented with 2 mg/mL fatty acid-free bovine serum albumin (GenDEPOT, A0100), 200  $\mu$ g/mL L-ascorbic acid 2-phosphate (Wako, 321-44823), and 2  $\mu$ M Wnt-C59 (Biorbyt, orb181132). Medium was then changed every other day starting on day 4 with RBAI which is RPMI 1640 (Corning, 10-040-CM) supplemented with 2 mg/mL fatty acid-free bovine serum albumin, 200  $\mu$ g/mL L-ascorbic acid 2-phosphate, and 5  $\mu$ g/mL *E. coli*-derived recombinant human insulin (Gibco, A11382IJ). Contracting cells were observed starting at day 7 and were treated with 100  $\mu$ g/mL of neomycin (Gibco, 10131027) from day 8 to day 12 to select for *TNNT2*<sup>+</sup> cardiomyocytes. On day 16 of differentiation, hiPSC-CMs were dissociated using DPBS (Corning, 21-031-CV) for 20 min at 37°C, 5% CO<sub>2</sub> followed by 1:200 Liberase TH (Roche, 5401151001) diluted in DPBS for 20 min at 37°C, 5% CO<sub>2</sub>. The collected cells were centrifuged at 300 × *g* for 5 min and filtered through a 100  $\mu$ m cell strainer (Fisherbrand, 22-363-549). Cells were then plated in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI) for 2 days on 1:800 Matrigel-coated plates for each assay. Media was then replaced with RBAI or maturation medium which was changed every 2–3 days until cells were assayed. Cells were maintained at 37°C in Heracell VIOS 160i humidified incubators (Thermo) with 5% CO<sub>2</sub> and atmospheric O<sub>2</sub> during differentiation.

### Maturation media formulation

Complete maturation media (MMc) basal medium is RPMI 1640 with no glucose (Corning, 10-043-CV). Sodium palmitate (Sigma, P9767) was complexed with fatty acid-free bovine serum albumin to enhance solubility. Sodium palmitate was dissolved in 50% ethanol at 52°C for 10 min and added to fatty acid-free bovine serum albumin at 37°C for 1 h with occasional mixing for a final concentration of 3 mM sodium palmitate and 120 mg/mL BSA. The following components were added to the basal medium: 2 mM galactose (Fisher, BP656-500), 50  $\mu$ M oleic acid (water soluble, Sigma, O1383), 50  $\mu$ M sodium palmitate complexed with 2 mg/mL fatty acid-free bovine serum albumin (GenDEPOT, A0100), 5 mM creatine phosphate (Dot Scientific, DSC70300-25), 5 mM taurine (Sigma T8691), 200  $\mu$ g/mL L-ascorbic acid 2-phosphate, 20 mg/mL *Oryza sativa*-derived recombinant human transferrin (Invitria, 777TRF029), 15 ng/mL sodium selenite (Sigma, S5261), 2 mM L-carnitine hydrochloride (Sigma, C0283), 10  $\mu$ g/mL *E. coli*-derived recombinant human insulin (Gibco, A11382IJ), 1  $\mu$ M dexamethasone (Sigma, D4902), and 3,3',5-Triiodo-L-thyronine sodium salt (T3, Sigma T6397). Base maturation media (MMb) and simple maturation media (MMs) are composed of 5 and 11 of the above components, respectively (Table S1). Additional derivatives of MMc and MMs, including fatty acid-free and chemically defined formulations can be found in Table S1.

### Intracellular Ca<sup>2+</sup> transient imaging

Intracellular Ca<sup>2+</sup> transients were recorded using an IC200 Kinetic Image Cytometer (KIC, Vala Sciences) as previously described.<sup>41</sup> Briefly, hiPSC-CMs were dissociated on d16 and plated at 60,000 cells per well in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI) on a Matrigel-coated 96-well black microplate (Greiner, 655090). Media was replaced with RBAI on d18. Starting on d20, medium in each well was changed to RBAI, MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, or MMs-CD every 3 days until day of assay (d35). On the day of imaging, cells were incubated at 37°C, 5% CO<sub>2</sub> in Hanks' Balanced Salt Solution (HBSS, Corning, 21-023-CV), 20 mM HEPES (Corning, 25-060-CI), 0.04% Pluronic F-127 (Sigma, P2443), 2.5 mM probenecid (Sigma, P8761), 2 drops per 10 mL NucBlue Live ReadyProbes Reagent (Invitrogen, R37605), and 2  $\mu$ M Cal-520 a.m. (AAT Bioquest, 21130) for 1 h. The Ca<sup>2+</sup> dye loading solution was then replaced with FluoroBrite DMEM (Gibco, A1896702) and 2.5 mM probenecid. Cells were imaged on an IC200 KIC at 37°C, 5% CO<sub>2</sub> for a 10 s time series at an acquisition frequency of 99.75 Hz Ca<sup>2+</sup> transients at the single cell level were analyzed for all wells using CyteSeer Analysis software (Vala Sciences). We used the average of all single cell Ca<sup>2+</sup> transients per well for traces and trace quantification including maximum downstroke velocity, maximum upstroke velocity, peak value, Ca<sup>2+</sup> transient duration at 75% (CTD75).

### Impedance recordings

Impedance recordings were measured using a CardioExcyte96 (Nanon). Briefly, hiPSC-CMs were dissociated on d16 and plated at 100,000 cells per well in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI) on Matrigel-coated Cardioexcyte96 sensor plates with stimulation electrode (Nanon, 20-1003). Media was replaced with RBAI on d18. Starting on d20, medium in each well was changed to RBAI, MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, or MMs-CD every 3 days until day of assay (d32). Impedance was measured at 37°C, 5% CO<sub>2</sub>, and 80% humidity using CardioExcyte Control 96 software (Nanon). Spontaneous and then paced (0.8 Hz) recordings were captured using a 30 s sweep duration every 5 min for a minimum of 1 h. Impedance traces were analyzed using Data Control (Nanon) software and the beat rate (beat/min), pulsewidth at 50% (sec), upstroke velocity (ohm/s), and downstroke velocity (ohm/s) were calculated. All wells were analyzed unless their impedance value was less than 1 or wells had less than 45 beats per min when paced at 0.8 Hz.

### Action potential recordings

hiPSC-CMs were dissociated on d20 and plated in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI) on Matrigel-coated 18 mm glass coverslips (Warner Instruments, 64-0384). Medium was replaced every three days with RBAI or MMc. Action potentials (APs) were measured on d30 hiPSC-CMs with manual patch clamp at 37°C from spontaneously beating hiPSC-CMs

using the amphotericin-B perforated patch-clamp technique with a Multiclamp 700B amplifier and Clampex 10.3 software (Molecular Devices). Pipettes (resistance 3–3.5 M $\Omega$ ) were pulled from thin wall borosilicate glass capillaries (WPI, 1B120F-4) using a horizontal microelectrode puller (Sutter instrument, P-1000). Signals were low-pass-filtered with a cutoff of 10 kHz and digitized at 10 kHz. Bath solution contained: 140 mM NaCl, 4.0 mM KCl, 1.0 mM CaCl<sub>2</sub>, 0.5 mM MgCl<sub>2</sub>, 10 mM glucose, 10 mM HEPES; pH 7.4 (NaOH). Pipettes were filled with solution containing: 125 mM K-gluconate, 20 mM KCl, 5.0 mM NaCl, 0.26 mM amphotericin-B, 5.0 mM HEPES; pH 7.2 (KOH). To overcome the spontaneous activity and depolarized state of hiPSC-CMs, an ohmic current  $\sim 4$  pA/pF was continuously injected to maintain a stable resting potential at approximately  $-80$  mV, except where mentioned otherwise. APs were evoked at 1 Hz by 4-ms,  $\sim 1.3\times$  threshold current pulses through the patch pipette and were characterized by maximum AP amplitude (APA), AP duration at 90% of repolarization (APD<sub>90</sub>), and maximal upstroke velocity ( $V_{\max}$ ). The maximal diastolic potential was analyzed during spontaneous activity. Potentials were corrected for the calculated liquid junction potential.

### hiPSC-CM isolation for automated high-throughput electrophysiology

hiPSC-CMs were dissociated on d16 and plated in Matrigel-coated 6-well plates at a density of  $4 \times 10^6$  cells per well in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI). Medium was changed on d18 to RBAI. Starting on d20, medium in each well was changed to RBAI, MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, or MMs-CD every 3 days until day of assay (d32). Only wells with beating (contracting) cells were utilized. The day of the experiment, each well was first washed with 1 mL DPBS (Corning, 21031CV). Solution was removed from the well and then incubated with 2 mL DPBS for 30 min at 37°C, 5% CO<sub>2</sub>. After this incubation, the solution was aspirated and replaced with 1 mL DPBS + liberase (50 units/ml, Liberase TH Research Grade, Sigma), and incubated for 25–27 min at 37°C, 5% CO<sub>2</sub>. hiPSC-CMs were then dissociated by gentle mechanical cell separation (trituration) using a 5 mL stripette. Two mL DPBS were added to cell suspension and cell number and viability were determined by automated cell counting (ViCell, Beckman Coulter). hiPSC-CMs were diluted to  $0.5 \times 10^6$  per mL viable count with DPBS and placed on the electrophysiology platform cell container and allowed to recover for at least 30 min at 16°C, shaking at 250 RPM.

### Automated high-throughput electrophysiology

High-throughput automated electrophysiology was successfully used to record and analyze voltage-gated sodium whole-cell currents from hiPSC-CMs in a 384-well plate format using the SyncroPatch 384 platform (Nanion Technologies) as previously described.<sup>42,43</sup> Nav currents recordings were performed at 21°C. The external solution contained (in mM): 140 NaCl, 4 KCl, 2.0 CaCl<sub>2</sub>, 1 MgCl<sub>2</sub>, 10 HEPES, 5 glucose, pH 7.4. The internal solution consisted of (in mM): 110 CsF, 10 CsF, 10 NaCl, 20 EGTA, 10 HEPES, 2 mM MgATP, pH 7.2. Pulse generation and data collection were performed with PatchController384 V2.2 (Nanion Technologies). Whole-cell currents were filtered at 3 kHz and digitized at 10 kHz. The access resistance and apparent membrane capacitance were estimated using built-in protocols. Series resistance was compensated for 70% and leak and capacitance artifacts were subtracted using the P/4 method. Whole-cell current peak current amplitude and voltage-dependence of activation and inactivation were measured using a double pulse protocol from a holding potential of  $-120$  mV.

### Automated high-throughput electrophysiology data analysis

Data were analyzed and plotted using a combination of DataController384 V2.3 (Nanion Technologies), Excel (Microsoft), and GraphPad Prism 10 (GraphPad Software). The peak current was normalized for cell capacitance and plotted against step voltage to generate peak current density–voltage relationships. Whole-cell conductance ( $G_{\text{Na}}$ ) was calculated as  $G_{\text{Na}} = I/(V - E_{\text{rev}})$ , where  $I$  is the measured peak current,  $V$ , is the step voltage, and  $E_{\text{rev}}$  is the calculated sodium reversal potential.  $G_{\text{Na}}$  at each voltage step was normalized to the maximum conductance between  $-80$  mV and 40 mV. To calculate voltage dependence of activation normalized  $G_{\text{Na}}$  was plotted against voltage and fitted with the Boltzmann function  $G/G_{\text{max}} = (1 + \exp[(V - V_{1/2})/k])^{-1}$ , where  $V_{1/2}$  indicates the voltage at half-maximal activation and  $k$  is a slope factor describing voltage sensitivity of the channel. Voltage dependence of steady-state inactivation was assessed by plotting currents generated by the  $-20$  mV postpulse voltage step normalized to the maximum current against the 500 ms prepulse voltage step from  $-120$  to 0 mV in 10-mV increments. Normalized currents were plotted against voltage and fitted with the Boltzmann function. Number of cells ( $n$ ) is given in the figure legends. Statistical significance was established at  $p \leq 0.05$ .

### Viability

hiPSC-CMs were dissociated on d16 and plated at 100,000 cells per well in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI) on a Matrigel-coated 96-well black microplate (Greiner, 655090). Media was replaced with RBAI on d18. Starting on d20, medium in each well was changed to RBAI, MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, or MMs-CD every 3 days until day of assay (d33). Viability was assessed by diluting PrestoBlue (Invitrogen, A13262) 1:10 with DPBS<sup>-/-</sup> (Corning, 21-031-CV) and replacing the media in 96-well plates with 100  $\mu$ L per well. The plate was then incubated for 2 h at 37°C, 5% CO<sub>2</sub>. Fluorescence (560 nm excitation, 590 nm emission) was then measured using a Varioskan LUX (Thermo Scientific) plate reader with ‘top read’ function.

### Seahorse OCR/ECAR measurement

The Seahorse XF96 extracellular flux analyzer was used to assess cellular metabolism. On d16, hiPSC-CMs were dissociated and plated at 100,000 cells per well in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI) on a Matrigel-coated XF96 plate (Agilent, 101085-004). Media was replaced with RBAI on d18. Starting on d20, medium in each well was changed to RBAI, MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, or MMs-CD every 3 days until day of assay (d33). On day 34, RPMI with no glucose and no sodium bicarbonate (Made in house) was supplemented with 10 mM glucose, 2 M L-glutamine, and 1 mM sodium pyruvate (pH 7.4). The medium in the XF96 plate was replaced with this and the plate was incubated for 1 h in a 37°C, no-CO<sub>2</sub> incubator. The wells of a hydrated sensor cartridge were then loaded with mitochondrial stress test inhibitors. A standard mitochondrial stress test was then conducted and the following inhibitors were injected during the protocol: oligomycin (1 μM), FCCP (2 μM), and antimycin A and rotenone (1 μM). The oxygen consumption rate (OCR) and extracellular acidification rate (ECAR) values were normalized to total protein content. Basal respiration was determined by subtracting the OCR after antimycin/rotenone injection from the OCR at baseline. Spare respiratory capacity was calculated by subtracting the baseline OCR from the OCR after FCCP injection. Nonmitochondrial respiration was determined from the OCR value after antimycin/rotenone injection. Maximal respiration was determined by subtracting nonmitochondrial respiration from OCR after FCCP injection.

### Protein concentration measurement

After OCR/ECAR measurements, wells were rinsed twice with DPBS and 100 μL of 1:5 radioimmunoprecipitation assay buffer (Thermo, 89900) in DPBS was added to each well. Cell lysates were transferred to a 96-well PCR plate and stored at -20°C. BCA protein assay (Thermo, 23227) was performed according to the manufacturer's instructions. Briefly, the working reagent was made by mixing 50 parts of BCA reagent A and 1 part of BCA reagent B. In a 96-well plate, 200 μL of the working reagent and 25 μL of the cell lysates or serial dilutions of the standard (BSA) were added per well and mixed on a plate shaker for 30 s. After a 30 min incubation at 37°C, absorbance was read at a wavelength of 562 nm using a plate reader (Varioskan LUX, Thermo). To calculate protein concentration, absorbance values were fitted to the generated protein standard curve. Total protein mass per well of the XF96 plate was calculated by multiplying the protein concentration by the total volume of the lysate (100 μL).

### RNA-sequencing

hiPSC-CMs were dissociated on d16 and plated in Matrigel-coated 6-well plates at a density of  $4 \times 10^6$  cells per well in RBAI +10% Cosmic Calf Serum (Hyclone, SH3008703HI). Medium was changed on d18 to RBAI. Starting on d20, medium in each well was changed to RBAI, MMc, MMc-glu, MMc-no FA, MMc-CD, MMs, MMs-glu, MMs-no FA, or MMs-CD every 3 days. On d33, cell lysis was collected with 300 μL per well of TRIzol Reagent (Thermo Fisher, 15596026). RNA was then purified using Direct-zol RNA MicroPrep kit (Zymo, R2062) including on-column DNase digestion to remove genomic DNA. Sample purity was confirmed using a Thermo Scientific NanoDrop 8000 and samples were then shipped to Novogene on dry ice for library preparation and sequencing. Upon arrival, all samples underwent QC using electrophoresis, Nanodrop, and Agilent2100 to determine RNA Integrating Number (RIN). The eukaryotic mRNA library with poly A enrichment was prepared and resulted in the construction of 250–300 bp insert cDNA library. Paired-end (150 bp) RNA-sequencing on hiPSC-CMs was performed using the Illumina NovaSeq 6000 sequencing platform at Novogene.

Using SOAPnuke,<sup>44</sup> raw fastq files were processed to trim/remove adaptors, low-quality reads, and N reads. Clean sequencing reads were mapped to the GRCh38 reference genome using STAR<sup>45</sup> and counted using RSEM.<sup>46</sup> Genes with less than 10 counts across all 26 samples were excluded from subsequent analysis. Following variance stabilizing transformation in DESeq2 R package,<sup>47</sup> principal component analysis was performed to visualize the clustering of samples. Using the 250 most variable genes, unsupervised hierarchical clustering based on Euclidean distance was performed by the pheatmap R package. Differential expression analysis was performed using the DESeq2 R package<sup>47</sup> accounting for the matched pair design, cell passage, and an interaction term assessing the gene expression change by cell passage. Results were shown by a volcano plot generated using the ggplot2 R package. Genes with adjusted *p*-value < 0.05 corrected for multiple testing using the Benjamini Hochberg method were considered as differentially expressed. Ingenuity Pathway Analysis (IPA) was performed to identify canonical pathways based on the differentially expressed genes.<sup>48</sup> This was used to identify differences in pathways related to biological processes that were relevant between our samples.

### QUANTIFICATION AND STATISTICAL METHODS

Data were analyzed in Excel and GraphPad Prism. Detailed statistical information is included in the corresponding figure legends. Data were presented as mean ± SEM. Data were checked for normal distribution and comparisons were conducted via an unpaired two-tailed Student's *t*-test or one-way analysis of variance (ANOVA) with Dunnett's multiple comparisons test. Significant differences are defined as *p* < 0.05 (\*), *p* < 0.01 (\*\*), *p* < 0.005 (\*\*\*), and *p* < 0.0001 (\*\*\*\*). No statistical methods were used to predetermine sample size. The experiments were not randomized, and the investigators were not blinded to allocation during experiments and outcome assessment.