

ORIGINAL ARTICLE

Energy Metabolism in Human Pluripotent Stem and Differentiated Cells Compared Using a Seahorse XF96 Extracellular Flux Analyzer

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Evaluating cell metabolism is crucial during pluripotent stem cell (PSC) differentiation and somatic cell reprogramming as it affects cell fate. As cultured stem cells are heterogeneous, a comparative analysis of relative metabolism using existing metabolic analysis methods is difficult, resulting in inaccuracies. In this study, we measured human PSC basal metabolic levels using a Seahorse analyzer. We used fibroblasts, human induced PSCs, and human embryonic stem cells to monitor changes in basal metabolic levels according to cell number and determine the number of cells suitable for analysis. We evaluated normalization methods using glucose and selected the most suitable for the metabolic analysis of heterogeneous PSCs during the reprogramming stage. The response of fibroblasts to glucose increased with starvation time, with oxygen consumption rate and extracellular acidification rate responding most effectively to glucose 4 hours after starvation and declining after 5 hours of starvation. Fibroblasts and PSCs achieved appropriate responses to glucose without damaging their metabolism 2~4 and 2~3 hours after starvation, respectively. We developed a novel method for comparing basal metabolic rates of fibroblasts and PSCs, focusing on quantitative analysis of glycolysis and oxidative phosphorylation using glucose without enzyme inhibitors. This protocol enables efficient comparison of energy metabolism among cell types, including undifferentiated PSCs, differentiated cells, and cells undergoing cellular reprogramming, and addresses critical issues, such as differences in basal metabolic levels and sensitivity to normalization, providing valuable insights into cellular energetics.

Keywords: Pluripotent stem cells, Glycolysis, Oxidative phosphorylation, Mitochondria, Glucose

Introduction

Studying cellular energy metabolism can help identify the biochemical pathways that produce and consume adenosine triphosphate (ATP), and intermediate metabolites and elucidate the interconnected processes and changes in cellular signal control mechanisms. Metabolic flux changes distinctly and dynamically during early human embryonic development, human pluripotent stem cell (hPSC) differentiation, and fibroblast reprogramming, with metabolic levels varying depending on the tissue (1-6). The metabolic dynamics of these stem cells indicate that cell metabolism is important in supporting energy demands and is

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closely related to cell identity, function, gene expression, phenotype, and epigenetic factors (7-14). Particularly, controlling the glucose metabolic pathway during stem cell differentiation or reprogramming regulates or increases the efficiency of these mechanisms (15, 16).

Following cellular uptake, glucose enters the glycolysis pathway to produce ATP and pyruvate, which is converted into two acetyl-coenzyme A (acetyl-CoA) molecules that enter the mitochondria or lactate and excreted from the cell via the monocarboxylate transporter in the plasma membrane (17). The two acetyl-CoAs produced by pyruvate go through the tricarboxylic acid (TCA) cycle to provide energy products to the electron transport chain for cellular respiration within the mitochondrial matrix, with the mitochondria using oxygen to produce ATP (18). Intermediate metabolites generated during pyruvate production are used to synthesize nucleotide precursors via the pentose phosphate pathway (PPP) (19-21). Therefore, glucose metabolism is important in producing both cellular energy and the various precursors required in cellular homeostasis, thus delicately regulating the maintenance of cell properties and fate (13, 22, 23). Additionally, quantitative measurement of metabolic levels is important for evaluating cellular functions, characteristics, and cell fate.

Pluripotent stem cells (PSCs), which can differentiate into various cells and proliferate indefinitely via self-renewal, include human embryonic stem cells (hESCs) derived from fertilized eggs and human induced pluripotent stem cells (hiPSCs) generated by introducing four genes into fibroblasts (24, 25). Cell differentiation into various target cells by an appropriate induction factor *in vitro* and maintenance of the newly acquired cell characteristics require a shift in energy metabolism (26-28). PSCs and differentiated fibroblasts exhibit different energy metabolism characteristics (7). PSCs, which have less-mature mitochondria than differentiated cells, more actively produce ATP via glycolysis, which is less efficient for energy production than oxidative phosphorylation (OXPHOS, i.e., mitochondrial function) (5, 7, 13, 29, 30). This is because PSCs, which proliferate faster than fibroblasts, require active nucleotide and lipid biosynthesis, resulting in an increased flux via the PPP (7, 31).

To measure cellular metabolic characteristics and activity, the oxygen consumption rate (OCR) and extracellular acidification rate (ECAR) are measured using the Seahorse XF96 Extracellular Flux Analyzer (Seahorse Bioscience), which quantifies glycolysis and OXPHOS by inhibiting the functions of glycolytic and mitochondrial enzymes (32, 33). Oligomycin (complex V inhibitor), FCCP (trifluoromethoxy carbonylcyanide phenylhydrazone, carbonyl cy-

nide 4-(trifluoromethoxy)phenylhydrazone, ATPase inhibitor), antimycin A (complex III inhibitor), and rotenone (complex I inhibitor) measure mitochondrial respiration (32, 33). Metabolic level differences between somatic cells or within cell lines can be efficiently evaluated in this way. However, as PSCs and reprogrammed somatic cells are highly heterogeneous compared with other animal cells and form colonies, it is difficult to precisely describe their metabolic characteristics (33). Metabolic analysis using the Seahorse XF96 analyzer fails to adequately represent the characteristics of various cell types, including stem cells, and can sometimes disrupt mitochondrial respiratory function or, particularly in the case of sensitive cells, such as PSCs, induce metabolic stress and cell death when conventional mitochondrial inhibitors are used (33-35). Furthermore, optimizing inhibitor concentrations and processing times can be challenging, especially when assessing cellular metabolic rates in heterogeneous cell populations, such as those undergoing reprogramming or differentiation (33-35). Therefore, a novel analysis method is required. To address this, we developed a novel method for measuring stem cell energy metabolism using metabolic substrates, tested the method under starvation conditions, and developed novel normalization methods.

Materials and Methods

Maintenance of hPSCs and fibroblasts

To compare the metabolic differences between PSCs and somatic cells, hESCs (H1 and H9; WiCell Research Institute), hiPSCs (CMC-hiPSC-003 and CMC-hiPSC-009; National Center for Stem Cell and Regenerative Medicine) and fibroblast cell lines (BJ1 and MRC5) were used. This study was approved by the Institutional Review Board (IRB No: P01-202309-03-001). These PSCs were maintained in complete TeSR-E8 Medium (STEMCELL Technologies) as the glucose-free culture. Cells were cultured on Vitronectin XF-coated plates (STEMCELL Technologies) and dissociated by incubation with TrypLE Express (Gibco) at 37°C for 3 minutes. The fibroblast cell lines, BJ1 and MRC5, were maintained in Dulbecco's modified Eagle medium (high-glucose DMEM; Corning Life Sciences) supplemented with 10% fetal bovine serum (FBS; Corning Life Sciences) and 100× penicillin-streptomycin (Corning Life Sciences). hESCs and hiPSCs were routinely passaged every 3 days using TrypLE Express, whereas fibroblasts were passaged every 3~5 days using 0.05% trypsin-ethylenediaminetetraacetic acid. All cells were maintained in an incubator at 37°C and 5% CO₂.

Maintenance and reprogramming using a secondary reprogramming system

hiF-T fibroblasts (Davide Cacchiarelli; Broad Institute) for reprogramming were cultured in an optimized DMEM/F12 culture medium supplemented with 10% FBS. Reprogramming was performed using the KnockOut Serum Replacement media formulation (Invitrogen, Gibco) and doxycycline hyclate (D9891; Sigma-Aldrich), according to the manufacturer's instructions. hiF-T-derived hiPSCs were cultured in TeSR-E8 Medium containing Vitronectin XF.

Measurement of oxygen consumption and ECARs using the Seahorse analyzer

OCR and ECAR were measured using a Seahorse XF96 Extracellular Flux Analyzer, according to the manufacturer's instructions. Cells were plated into the wells of an XF96 cell culture microplate and incubated at 37°C in a CO₂ incubator for 24 hours to ensure attachment. The assay was initiated after cells were equilibrated for 1 hour in XF assay medium supplemented with 10 mM glucose, 5 mM sodium pyruvate, and 2 mM glutamine in a non-CO₂ incubator. Substrate-based metabolic assays were performed by injecting 10 mM glucose after starvation in XF DMEM assay media (pH 7.4; Seahorse Bioscience). For starvation, the culture medium was removed at hourly intervals for a total of 5 hours, washed once with phosphate-

buffered saline, and starvation was induced by adding XF DMEM assay media (without glucose, pyruvate, and glutamine). During the starvation process, cells were maintained at 37°C in a CO₂ incubator. The ATP rate assay involved sequential injection of 2 μM oligomycin and 0.5 μM rotenone/antimycin A.

Measurement of cellular parameters for metabolic normalization

Cell numbers and sizes were analyzed using an Automated Cell Counter (Countess II FL; Invitrogen). Protein concentration was determined using a Pierce BCA Protein Assay Kit (Thermo Fisher Scientific).

Statistical analysis

All experiments were performed in triplicate. The data are presented as the mean ± SD. Statistical significance was evaluated using Student's t-tests. $p < 0.05$ was considered statistically significant. Statistical analysis was performed using Prism 8 (GraphPad Software).

Results and Discussion

Optimization of cell numbers for metabolic assay

Seahorse XF96-derived OCR and ECAR measurement accuracy depends on probe resolution and measurement

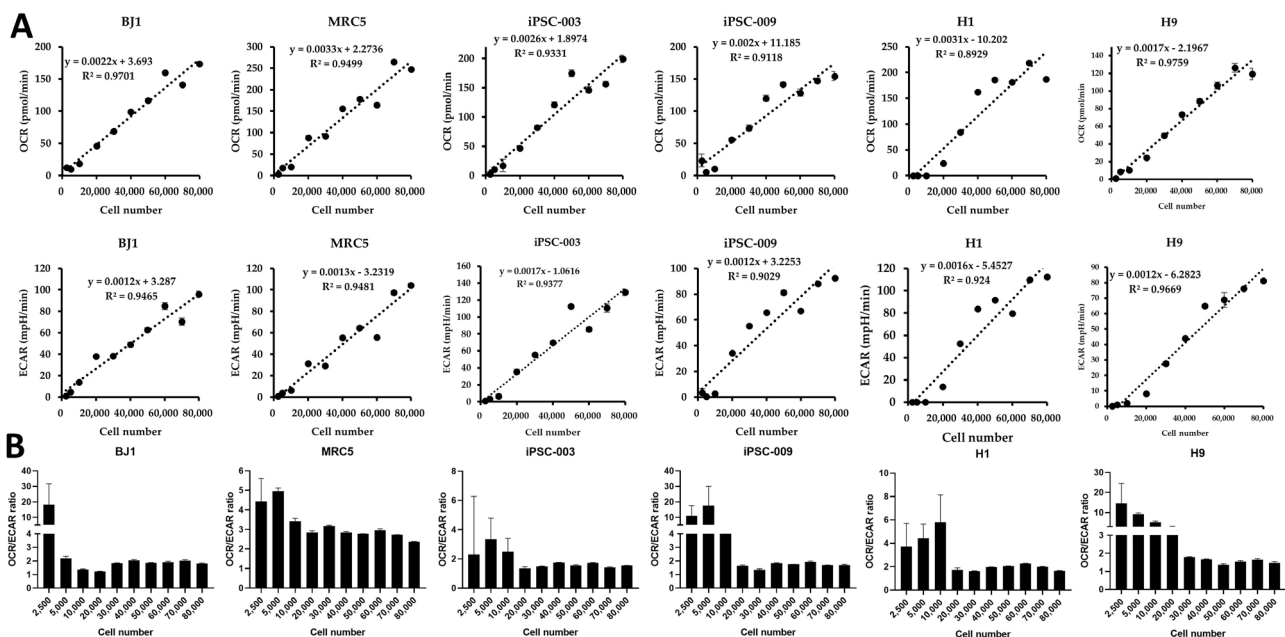


Fig. 1. Optimization of cell number is essential for the Seahorse cell metabolic assay. (A) Standard curves of oxygen consumption rate (OCR) and extracellular acidification rate (ECAR) according to cell number. (B) The appropriate number of cells is represented by a constant OCR/ECAR ratio. iPSC: induced pluripotent stem cell.

range. These measurements require an appropriate measurement range (36, 37). However, the differences between cell types in metabolic levels make it difficult to obtain accurate results, leading to a wide range of measurements. During PSC metabolic analysis, in particular, it is often necessary to compare differentiated and undifferentiated cells or to compare reprogrammed cells with each other. To address this, we used six cell lines (fibroblasts [MRC5 and BJ1], hiPSCs [iPSC-003 and iPSC-009], and hESCs [H1 and H9]) to obtain the appropriate number of PSCs and somatic fibroblast cells for precisely analyzing stem cell energy metabolism. We evaluated changes in OCR (pmol/min), ECAR (mpH/min), and the OCR/ECAR ratio according to the number of cells.

We seeded hiPSCs and hESCs at 2.5×10^3 , 5.0×10^3 , 1.0×10^4 , 2.0×10^4 , 3.0×10^4 , 4.0×10^4 , 5.0×10^4 , 6.0×10^4 , 7.0×10^4 , and 8.0×10^4 cells/well in 96-well microplates. The XF DMEM assay media (pH 7.4) was replaced after 24 hours, following washing with phosphate-buffered saline. We measured OCR and ECAR to perform linear regression analysis and analyzed the changes in the OCR/ECAR ratio (Fig. 1). In all cell types, OCR and ECAR increased with cell number ($R^2 > 0.9$) (Fig. 1A) at a constant rate, whereas the OCR/ECAR ratio remained constant only in a specific cell-number range (Fig. 1B). Fibroblasts exhibited a constant OCR/ECAR ratio at 1.0×10^4 to 8.0×10^4 cells/well, whereas hiPSCs, H1, and H9 cells showed a consistent ratio in the ranges 2.0×10^4 to 8.0×10^4 , $2.0 \times$

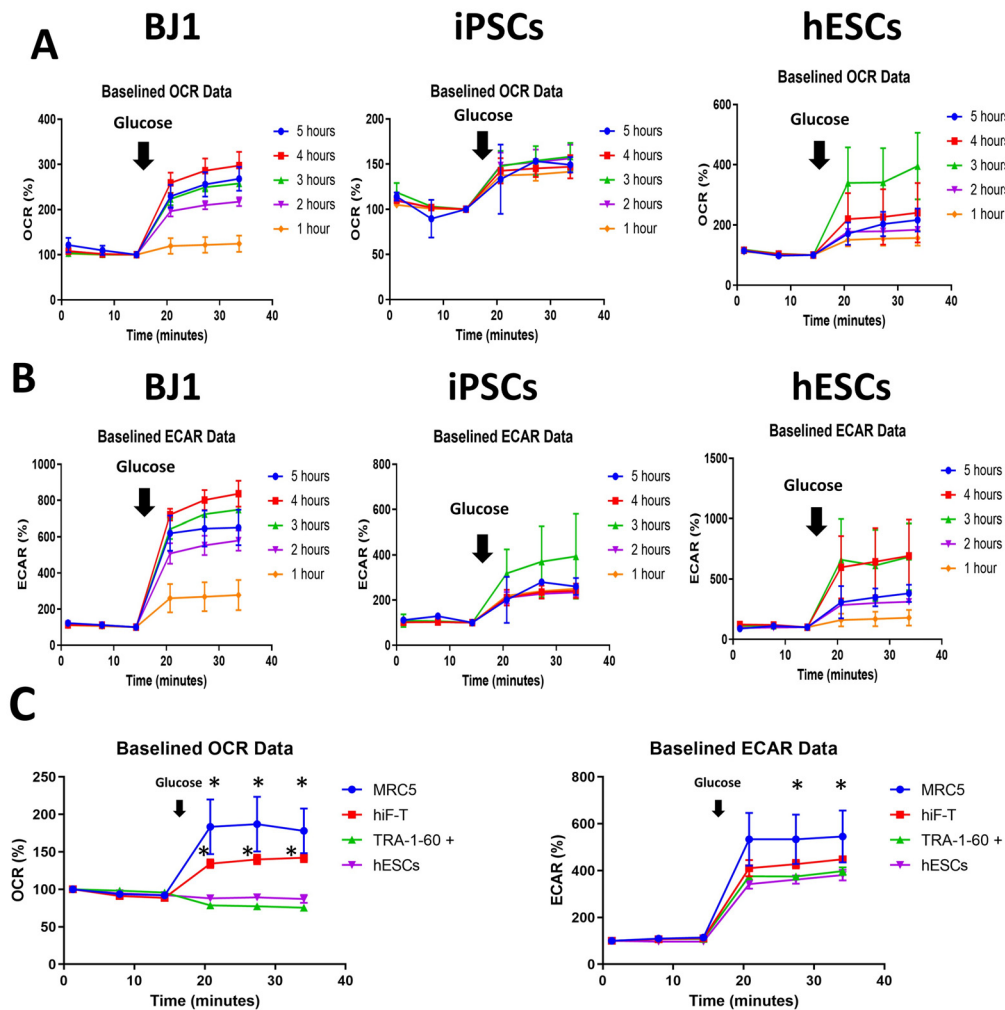


Fig. 2. Determination of the appropriate starvation period. (A) Oxygen consumption rate (OCR) response to glucose after glucose starvation. (B) Extracellular acidification rate (ECAR) response to glucose after glucose starvation. (C) Changes in OCR and ECAR responses to glucose in different cell types after glucose starvation. Student's t-test: * $p < 0.05$. iPSCs: induced pluripotent stem cells, hESCs: human embryonic stem cells.

10^4 to 8.0×10^4 , and 3.0×10^4 to 8.0×10^4 , respectively. Fibroblasts exhibited measurements at lower cell numbers than PSCs; however, PSC measurements were normal, with a consistent OCR/ECAR ratio, only when at least 2.0×10^4 cells were seeded. Regardless of cell type, we detected measurements only in the cell number range that exhibited marginal changes in ECAR and OCR. Overall, compared with fibroblasts, PSCs exhibited lower metabolic levels, and higher PSC cell numbers were required to detect changes in OCR or ECAR. These results indicate that when energy metabolism analysis is performed using different cell types, it is necessary to first consider the appropriate numbers of seeded cells and review the basal metabolic rates of the cell types. Specifically, before metabolic analysis and after monitoring changes in OCR and ECAR based on cell number, it is recommended to determine the appropriate cell number that achieves a linear increase ($R^2=0.9$) with OCR or ECAR and confirm a constant OCR/ECAR ratio. Based on these findings, for these six cell lines, we propose using 3.0×10^4 to 8.0×10^4 cells/well to enable the acquisition of consistent cellular energy metabolism values.

Substrate-based metabolic assay

Various stem cell types, including ESCs, are maintained in a heterogeneous state (38); hence, their susceptibility to mitochondrial enzyme inhibitors varies. To analyze their diverse metabolic characteristics, it is more effective to use glucose as a metabolic substrate to measure cellular metabolism rather than using mitochondrial enzyme inhibitors. Furthermore, as cells cultured in heterogeneous states are at different cell cycle stages, their energy metabolism levels differ. Therefore, glucose starvation is required to align their metabolic states before metabolic analysis. Depending on their metabolic characteristics, cells consume different amounts of glucose, varying in their glucose uptake and metabolism mechanisms and ability (39, 40). This suggests that induced starvation, followed by glucose supplementation, could provide a more natural method for evaluating the inherent metabolic ability of heterogeneous stem cell populations. Therefore, we compared the metabolic characteristics of stem and somatic cells by applying glucose starvation and supplementation.

Before this experiment, to determine the optimal starvation conditions under which each cell line responds to glucose, we took measurements every hour for 5 hours using glucose-free assay media to induce starvation, after which we added glucose to evaluate changes in metabolism. The response of fibroblasts (BJ1 cells) to glucose increased markedly with starvation time, with OCR and ECAR responding most effectively to glucose 4 hours after starva-

tion and declining after 5 hours of starvation (Fig. 2A, 2B, Supplementary Fig. S1A, S1B). However, for PSCs (hiPSCs and H1 cells), ECAR responded the most to glucose starvation at 2~3 hours of starvation, declining from 4 hours, with greater SDs between measurements from 4 hours onward (Fig. 2B, Supplementary Fig. S1B). Consequently, glucose starvation for 2~4 hours for fibroblasts and 2~3 hours for PSCs achieved appropriate responses to glucose without damaging their metabolism (Fig. 2A, 2B, Supplementary Fig. S1A, S1B).

Cells with different cell characteristics have different structural systems for glucose uptake and maintenance of cellular homeostasis. Thus, it is preferable to measure metabolism after the complete consumption of the glucose present in cells. Accordingly, we applied glucose starvation before measuring cell metabolism. By adding glucose after various periods of cell starvation and analyzing cell metabolism, glycolysis and OXPHOS can be measured by observing glucose consumption. This protocol can be applied to PSCs at both extremes of differentiation from somatic cells and to cells during differentiation or somatic cell reprogramming. Although this method does not exclude non-mitochondrial oxygen respiration and nonglycolytic acidification (i.e., due to CO_2 produced by the TCA cycle), it enables comparison of relative metabolic capacity via analysis and normalization of basal metabolic rates in different cells.

To verify the validity of this method, we examined whether we could quantitatively compare the metabolic capacity of cells during reprogramming by providing glucose following 3 hours of glucose starvation. The human secondary reprogrammed hiF-T cell line (used in the dox-inducible reprogramming system) (40) was subjected to doxycycline treatment for 20 days to induce reprogramming, generating TRA-1-60 + cells, which are pluripotency markers. MRC5 and H1 cells were used as positive controls for fibroblasts and hiPSCs, respectively. The hiF-T and TRA-1-60 + cells were seeded at 5.0×10^4 cells/well and treated with glucose after starvation for 3 hours (Fig. 2C, Supplementary Fig. S1C). Following glucose starvation and treatment, OCR and ECAR were significantly elevated in fibroblasts (MRC5 and hiF-T cells), whereas only ECAR was significantly elevated in PSCs (hiPSCs and H1 cells) (Fig. 2C, Supplementary Fig. S1C). These results indicated that undifferentiated cells not only have a low metabolic level but also depend on glycolysis. Moreover, we revealed that this method can effectively compare metabolic capacity and OXPHOS and glycolysis usage during cellular differentiation or reprogramming.

Limitations of metabolic normalization

For quantitatively comparing metabolic capacity across cell types, performing normalization via protein quantification or using the same cell number is common. However, neither approach achieves accurate normalization because, regardless of how accurately cell number is measured, errors caused by differences in cell viability and cell-counting accuracy might affect the interpretation of results. Furthermore, normalization using total protein concentration does not reflect cell viability nor protein amount per cell, which varies depending on cell type (Fig. 3A, 3B). For instance, besides cell size differences, the nucleus-to-cyto-

plasmic size ratio is high in PSCs but low in somatic cells (Fig. 3A). During reprogramming, cell protein content varies with cell size, with cell size and total protein content decreases (Fig. 3B). Thus, when comparing the metabolism of different cell types, normalization using total protein content is neither suitable nor accurate. To overcome these problems and to accurately analyze the metabolic levels of undifferentiated PSCs and fibroblasts, information on the basal metabolic rate is required, which depends on the respiratory rate and varies between cells.

We conducted an interval-based assay for each cell type to identify their unique basal metabolic rates and deter-

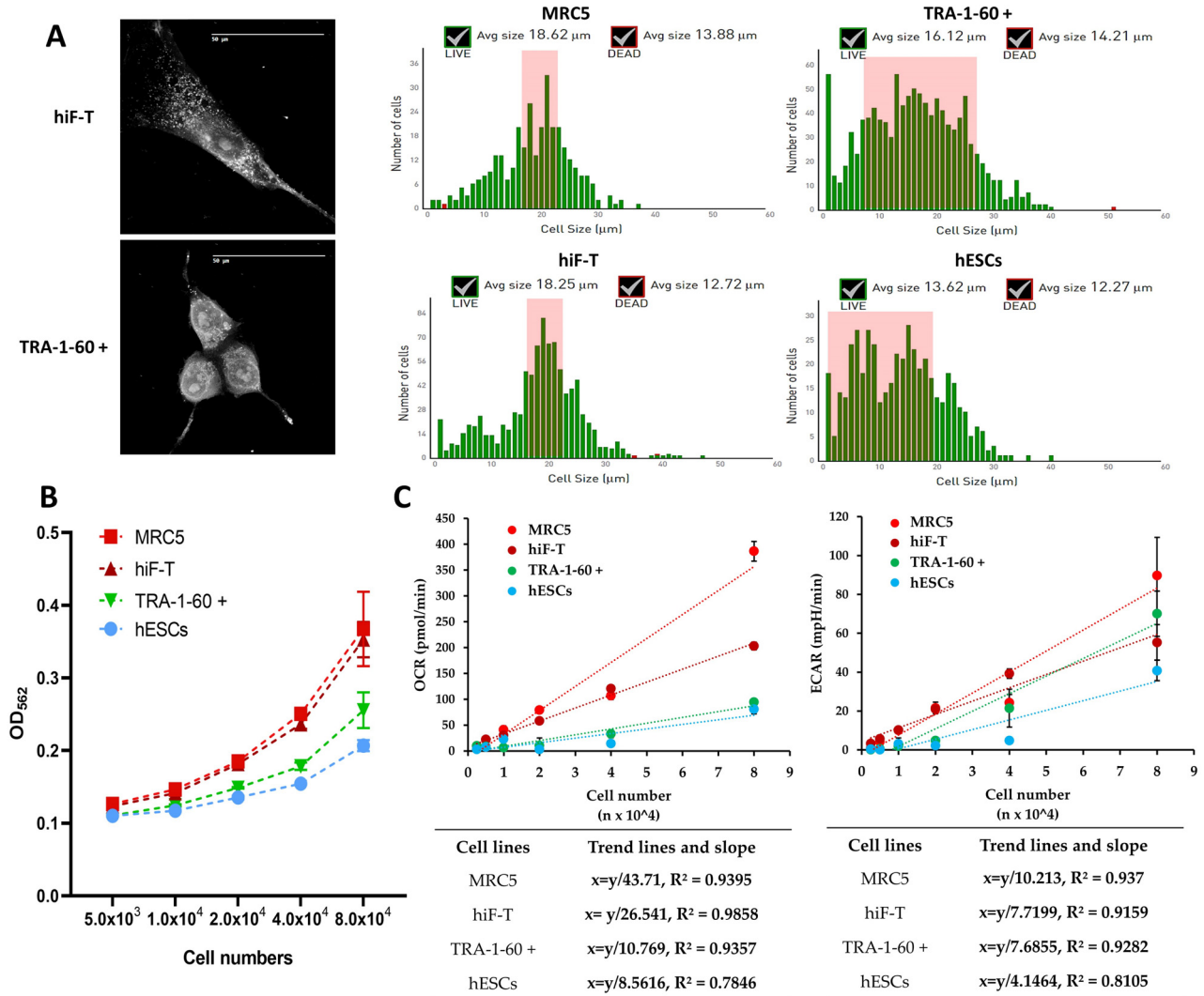


Fig. 3. Linear regression of total protein concentration and cellular metabolism according to cell number. (A) Differences in size between fibroblasts (MRC5 and hiF-T) and pluripotent stem cells (TRA-1-60 + and human embryonic stem cells [hESCs]) (hiF-T-derived TRA-1-60 + and hESCs). (B) Linear regression of protein concentration according to cell type. (C) Linear regression of oxygen consumption rate (OCR) and extracellular acidification rate (ECAR) according to cell number.

mine the cell numbers required for analysis. This assay is based on the premise that when cell number increases at a constant rate, each cell type will exhibit a unique and constant increase in metabolic level. Fibroblastic hiF-T cells, reprogrammed hiF-T cells (TRA-1-60 +), fibroblasts (MRC5), and PSCs (H1) were diluted two-fold starting from 1.0×10^8 cells and were seeded in a 96-well plate. The increase in OCR and ECAR was then analyzed using the Seahorse XF96 analyzer. We analyzed the linear correlation between cell number and respiration rate to quantify the increase in metabolism with cell number.

OCR and ECAR were more highly correlated in fibroblasts (including fibroblastic hiF-T cells) than in PSCs

(Fig. 3C). The cell types exhibited unique OCR and ECAR intervals according to their metabolic characteristics. Similar to previous findings (16), cellular metabolic levels decreased during reprogramming, whereas glucose metabolism increased. After calculating the differences in the numbers of respiring cells by substituting the OCR and ECAR values into the standard curve for each cell type, the relative differences in cell numbers were used to normalize the obtained values. As this normalization method provides a standard curve based on the change in cell number and metabolic level, it appears to be more accurate than the protein content-based method. Comparison of the basal metabolic rate via interval-based assays, followed by cell num-

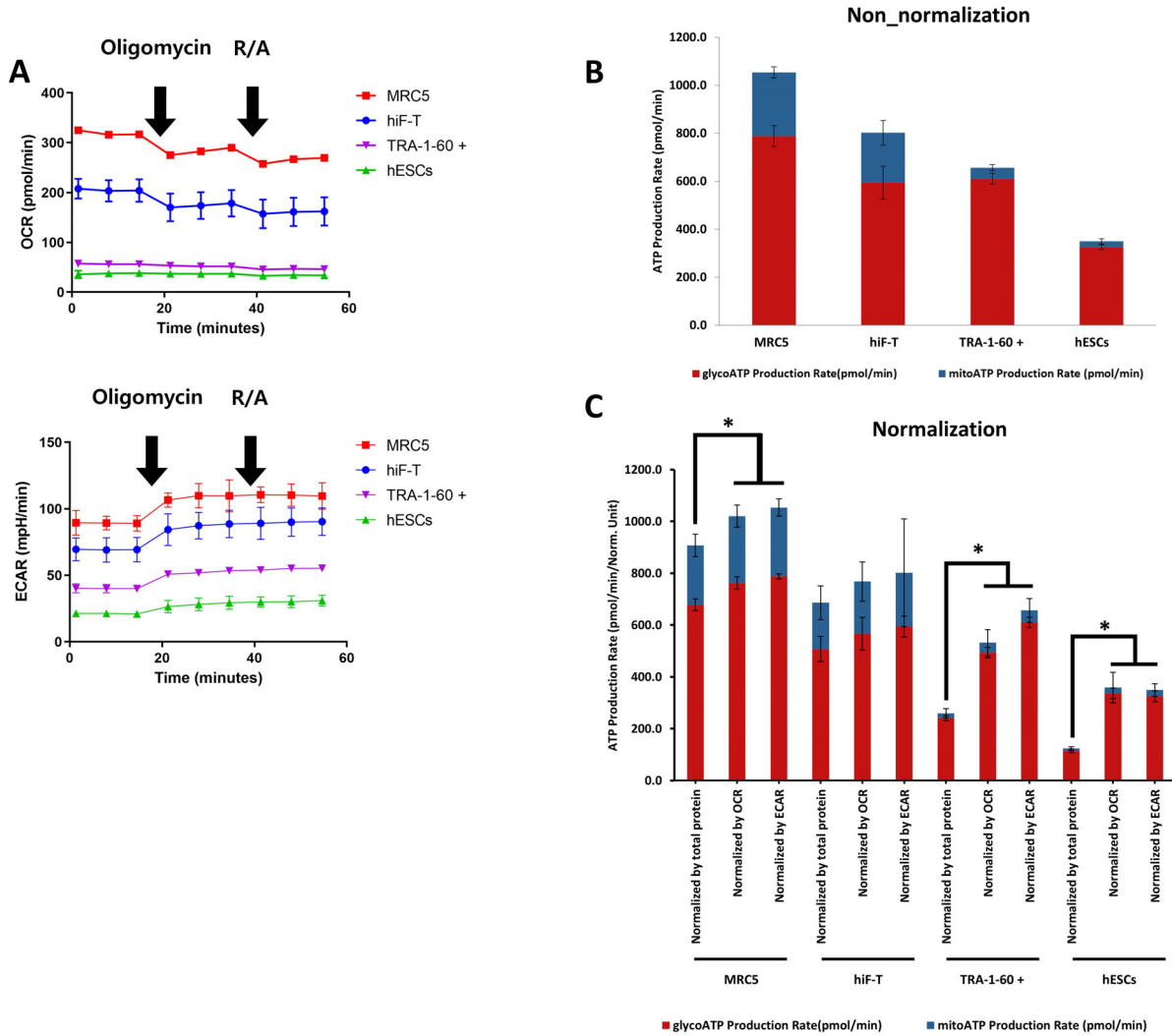


Fig. 4. Differences in the measurement of metabolic levels according to normalization method. (A) Real-time adenosine triphosphate (ATP) rate assay of somatic and pluripotent stem cells. (B) Non-normalized ATP production rate (pmol/min). (C) Normalized ATP production rate (pmol/min) by total protein, oxygen consumption rate (OCR), and extracellular acidification rate (ECAR). Student's t-test: * $p < 0.05$. R/A: rotenone & antimycin A, hESCs: human embryonic stem cells.

ber normalization using the standard curve, might be useful for comparing the basal metabolic characteristics of differentiated or reprogrammed cells.

Differences in metabolic levels according to normalization method

To confirm the validity of our normalization method, we conducted a real-time ATP rate assay and analyzed the results according to the calibration method used. The real-time ATP rate assay is the only assay that quantifies the live-cell rate of ATP production from glycolysis and mitochondria using label-free technology. We seeded the same number of MRC5, hiF-T, TRA-1-60 +, and hESCs (8.0×10^4 cells/well each) and performed a real-time ATP rate assay. OCR (Fig. 4A) and ECAR (Fig. 4B) changed more dynamically in fibroblasts than in hPSCs, indicating significantly higher ATP production in fibroblasts. After correcting these values using the total amount of protein or respiratory rate, we analyzed the differences in ATP production rates according to the normalization method used (Fig. 4C). Normalization using total protein produced a lower ATP production rate than normalization using the respiratory rate. Total protein-based normalization produced a significantly lower ATP production rate in reprogrammed cells and PSCs than in somatic cells, whereas this difference was not detected using respiratory rate-based normalization (Fig. 4C). This indicates that total protein-based normalization might over-correct the metabolic values for PSCs.

Our study presents a novel method for comparing the basal metabolic rates of fibroblasts and PSCs, focusing on quantitative analysis of glycolysis and OXPHOS using glucose without enzyme inhibitors. We successfully determined the optimal cell number for the metabolic analysis of undifferentiated stem cells, compared metabolic capacities following glucose supplementation after starvation, and verified the applicability of this approach by determining basal metabolic levels. This protocol enables efficient comparison of energy metabolism among different cell types, including undifferentiated PSCs, differentiated cells, and cells undergoing cellular reprogramming. Moreover, it addresses critical issues, such as differences in basal metabolic levels and sensitivity to normalization, providing valuable insights into cellular energetics.

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Potential Conflict of Interest

There is no potential conflict of interest to declare.

Authors' Contribution

Conceptualization: HKK, JSO, SHM, JSM, MRL. Data curation: HKK, YS, SBP, JHK, MK, BY, HC, MRL. Formal analysis: HKK, YS, MK, BY, MRL. Funding acquisition: MRL. Methodology: HKK, JSO, JSM, SHM, MRL. Project administration: JSO, SHM, MRL. Supervision: MRL. Validation: HKK, JSO, JSM, MRL. Visualization: HKK, YS, MK, BY, MRL. Writing – original draft: HKK. Writing – review and editing: HKK, MRL. All authors have read and agreed to the published version of the manuscript.

Supplementary Materials

Supplementary data including one figure can be found with this article online at <https://doi.org/10.15283/ijsc23167>

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