SYMPOSIUM REVIEW

Stable isotope tracers and exercise physiology: past, present and future

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Abstract Stable isotope tracers have been invaluable assets in physiological research for over 80 years. The application of substrate-specific stable isotope tracers has permitted exquisite insight into amino acid, fatty-acid and carbohydrate metabolic regulation (i.e. incorporation, flux, and oxidation, in a tissue-specific and whole-body fashion) in health, disease and response to acute and chronic exercise. Yet, despite many breakthroughs, there are limitations to 'substrate-specific' stable isotope tracers, which limit physiological insight, e.g. the need for intravenous infusions and restriction to short-term studies (hours) in controlled laboratory settings. In recent years significant interest has developed in alternative stable isotope tracer techniques that overcome these limitations, in particular deuterium oxide (D_2O or heavy water). The unique properties of this tracer mean that through oral administration, the turnover and flux through a number

Daniel Wilkinson (Assistant Professor), **Matthew Brook** (Post-Doctoral Research Associate), **Ken Smith** (Principal Research Fellow) and **Philip Atherton** (Professor) work within the MRC-ARUK Centre for Musculoskeletal Ageing Research at the University of Nottingham. Their research is involved in identification of the central mechanisms regulating metabolism in human musculoskeletal tissues, particularly those that govern the regulation of protein metabolism in response to ageing and disease. The group has extensive experience of using and developing stable isotope tracer techniques and applying them to human metabolic research. Recent developments within the group have focused on the application of novel D₂O-based stable isotope tracer techniques and how these can be integrated alongside 'omic' techniques, such as proteomics and metabolomics, to provide a better holistic understanding of the regulation of metabolism.

This review was presented at the symposium "New technologies providing insight to human physiological adaptation", which took place at the meeting of The Biomedical Basis of Elite Performance in Nottingham, UK, 6–8 March 2016.

of different substrates (muscle proteins, lipids, glucose, DNA (satellite cells)) can be monitored simultaneously and flexibly (hours/weeks/months) without the need for restrictive experimental control. This makes it uniquely suited for the study of 'real world' human exercise physiology (amongst many other applications). Moreover, using $D₂O$ permits evaluation of turnover of plasma and muscle proteins (e.g. dynamic proteomics) in addition to metabolomics (e.g. fluxomics) to seek molecular underpinnings, e.g. of exercise adaptation. Here, we provide insight into the role of stable isotope tracers, from substrate-specific to novel D_2O approaches, in facilitating our understanding of metabolism. Further novel potential applications of stable isotope tracers are also discussed in the context of integration with the snowballing field of 'omic' technologies.

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Abstract figure legend Contemporary stable isotope approaches coupled to mass spectrometry can now provide synchronous insights into the dynamics of acute and chronic metabolism (e.g. protein, nucleic acid, energy production and storage, and metabolic pathway flux) in the contexts of end-points relating to the physiological, clinical, performance and health benefits of exercise.

Abbreviations AA, amino acid; D2O, deuterium oxide; EAA, essential amino acid; FSR, fractional synthetic rate; I.V., intravenous; LC-MS/MS, liquid chromatography tandem mass spectrometry; 3-MH, 3-methylhistidine; MPB, muscle protein breakdown; MPS, muscle protein synthesis; MRI, magnetic resonance imaging; *R*a, rate of appearance; *R*d, rate of disappearance; RET, resistance exercise training.

What are stable isotope tracers and how are they applied in studies?

An isotope is a species of an element that differs in mass through the addition of one or more neutrons within the atomic nucleus; while naturally occurring they are far less abundant than their more common lighter isotopes. This difference in mass permits these isotopes to be detected, generally using the technique of mass spectrometry – a mass spectrometer separates atoms or molecules based on their mass and/or charge (after undergoing some form of ionization) as they pass through an electrical and/or magnetic field under vacuum; they are traditionally combined with chromatographic (gas chromatography or liquid chromatography) separation techniques, to permit the separation of complex mixtures of organic compounds prior to detection in the mass spectrometer. There are two forms of isotopic tracers: radio-isotope tracers (e.g. 14 C and ${}^{3}H$ (tritium)) are radioactive and therefore potentially harmful; their use is now largely restricted to animal rather than human experiments. Stable isotope tracers (e.g. ^{18}O , ^{15}N , ^{13}C and ^{2}H) in contrast, are non-radioactive, making them ideal for use in human research. Crucially, the chemistry of these elements and the compounds into which they are incorporated is essentially the same as that of the endogenous ones. As such, they can be used to 'trace' metabolic flux in pathways of interest and the fate of the tracer can be monitored (via its mass difference), providing vital information regarding rates and extent of its metabolism.

Stable isotope tracers are typically substrate specific. That is, stable isotopically labelled amino acids (AAs) provide information on amino acid and protein metabolism, labelled fatty acids will inform on fat metabolism, while glucose tracers will reflect carbohydrate metabolism and storage. Application of these tracers has been instrumental in yielding information on (1) the synthesis of polymers (i.e. proteins (Rennie *et al.* 1982; Halliday *et al.* 1988), triglycerides (Guo & Jensen, 1998) and glycogen (Romijn *et al.* 1993), (2) substrate uptake, release and intermediary metabolism across or within organs and tissues using arterial–venous balance techniques (Biolo *et al.* 1994), (3) substrate oxidation (Phillips *et al.* 1996) and energy expenditure (Goran *et al.* 1990), and (4) whole body and tissue/organ-specific fuel metabolism (Rennie & Halliday, 1984). In terms of exercise physiology, these stable isotope tracer approaches have assisted in detailing the complex metabolic responses of tissues to exercise. Some of the most important discoveries include the delineation of protein synthetic and breakdown responses to exercise, i.e. when performed in the absence of nutrition, exercise is catabolic (Biolo *et al.* 1995; Phillips *et al.* 1999; Kumar *et al.* 2009), and that the essential amino acid (EAA) constituents of food are the key nutrients supporting exercise-induced increases in muscle protein synthesis (MPS) (Pennings *et al.* 2011;

Burd *et al.* 2011). Furthermore, the use of stable isotope tracers has also been key to determining shifts in substrate utilization and fuel use during exercise, e.g. highlighting reductions in lipid oxidation at increasing exercise intensities (Friedlander *et al.* 2007), and the important role of endurance training in increasing utilization of lipids to spare muscle glycogen (Phillips *et al.* 1996). To perform traditional stable isotope tracer experiments requires sterile infusates, intravenous (I.V.) cannulation(s) and multiple (usually muscle) tissue biopsies. Moreover, constant I.V. infusions require subjects be studied in a controlled clinical or laboratory environment – restricting measures to \langle 24 h and traditionally over 2–8 h – and requiring different stable isotope tracers for each substrate to be 'measured or traced' (e.g. $[^2H_2]$ glucose for glucose metabolism, $[U^{-13}C]$ palmitate for lipid metabolism and $[1,2,{}^{13}C_2]$ leucine or $[^2H_5]$ phenylalanine for protein metabolism) (Fig. 1). The time limited and invasive nature of these studies narrows their applications; moreover acute findings may not always translate into a chronic setting, e.g. acute postexercise MPS exhibited no correlation to ensuing skeletal muscle hypertrophy following resistance exercise training (RET) (Mitchell*et al.* 2014).

However, despite these limitations, these substratespecific tracer techniques have been invaluable to our understanding of basic human metabolism and its responses to stress, nutrition, health and disease. The

Figure 1. Application of substrate-specific stable isotope tracers for measurement of metabolism

Schematic diagram summarizing the typical application of substrate-specific tracers for measuring metabolism, utilizing both precursor–product and arterial–venous (A-V) balance techniques. A single substrate-specific tracer is required to be administered for the measurement of turnover of each substrate pool of interest (e.g. glucose metabolism using [2H2]glucose, lipid metabolism using [U-13C]palmitate and protein/AA metabolism using $[1,2,13]$ C₂]leucine). These substrate-specific tracers are usually administered by I.V. infusion and as such are limited to measurement periods ≤ 24 h, but typically < 8 h. Measurement of the rate of disappearance (R_d) of the stable isotope tracer from the arterial pool provides a proxy for synthesis, while the rate of appearance (*R*a) of the tracee in the venous pools (i.e. via dilution of the tracer) provides that of breakdown. Stable isotope tracers and A-V balance calculations can therefore provide estimates of both synthesis and breakdown, as well as *de novo* synthesis of intermediary metabolites and substrate oxidation across tissues or limbs (when combined with blood flow and CO₂ measurements). Furthermore, the rate of synthesis or incorporation into tissue pools (i.e. protein, glycogen, lipids) can be measured using the precursor–product approach. By sampling the tissue or pool at two time points in relation to the precursor enrichment (e.g. AA tracers incorporated into peptides via their corresponding amino acyl-tRNA) provides a fractional synthesis rate (FSR). E_{T1}, Enrichment in product at time T1; E_{T2}, Enrichment in product at time T2; Ep, Enrichment in precursor pool.

findings from these studies continue to provide us with a wealth of knowledge and mechanistic understanding of the intricacies of metabolism, and these approaches will continue to underpin advances in human metabolic research. It is important to note that with any *in vivo* technique, there will be inherent limitations to the methods and the following sections aim to highlight new tools that will compliment these traditional tracer techniques, thereby providing greater insight.

Emerging era of non-substrate-specific stable isotope tracers

Deuterium oxide (D₂O, 'heavy water' or ${}^{2}H_{2}O$) was one of the first stable isotope tracers to be used in metabolic research, by Schoenheimer (Schoenheimer & Rittenberg, 1936) and Ussing (1937, 1938, 1941). Nonetheless, the benefits of D_2O as a stable isotope tracer only really began to be recognized in the late 20th century, with technical advances in analytical instrumentation and development of commercially available hybrid MS (i.e. gas chromatography–pyrolysis–isotope ratio mass spectrometry and liquid chromatography–tandem mass spectrometry (LC-MS/MS); Kuksis & Myher, 1995; Begley & Scrimgeour, 1996). It was soon realized that D_2O could provide an alternative approach and overcome some of the issues related to the use of traditional substratespecific stable isotope tracers (Dufner & Previs, 2003). Administered orally (Previs *et al.* 2004; Gasier *et al.* 2010, 2012; Robinson *et al.* 2011; MacDonald *et al.* 2013; Wilkinson *et al.* 2014, 2015; Decaris *et al.* 2015) as a single bolus (MacDonald *et al.* 2013; Wilkinson *et al.* 2014, 2015) or in the form of regular doses (Robinson *et al.* 2011; Brook *et al.* 2015; Decaris *et al.* 2015), D₂O rapidly equilibrates with body water $(\sim 20 \text{ min in rats}$ (Dufner *et al.* 2005); 1–2 h in humans (IAEA, 2011)). This creates a homogeneous labelled precursor pool, which slowly turns over (half-life \sim 9–11 days; MacDonald *et al.* 2013; Wilkinson *et al.* 2014), thereby overcoming the need for I.V. stable isotope tracer administration (Dufner & Previs, 2003). Deuterium from the body water is exchanged through biological reductions during *de novo* (re)synthesis onto a myriad metabolic substrates at stable C-H positions, allowing rates of flux and turnover (synthesis and breakdown) within these substrate pools to be calculated (Hellerstein, 2004). Thus, unlike substrate-specific tracer methods, D_2O provides an opportunity for measuring the turnover of multiple pools simultaneously (Fig. 2), overcoming the need for an individual stable isotope tracer for each different substrate pool. For example, deuterium is incorporated into AAs (traditionally alanine, glutamate or glutamine is monitored as they can be labelled at multiple carbon positions; Busch *et al.* 2006; Herath *et al.* 2011), allowing MPS rates to be probed from the incorporation of labelled AAs into tissue protein (Gasier *et al.* 2010). In addition through labelling of individual fatty acids, as well as glycerol via glucose, lipid turnover can be quantified (Diraison *et al.* 1997; Turner *et al.* 2003; Strawford *et al.* 2004), whilst labelling by D2O at different steps in *de novo* nucleotide synthesis can provide rates of DNA (and RNA) turnover (Busch *et al.* 2007; Voogt *et al.* 2007). Crucially, the relatively slow turnover of the body water pool permits measurement over longer periods, i.e. days, weeks or months (Robinson *et al.* 2011; Gasier *et al.* 2012; Wilkinson *et al.* 2014, 2015; Brook *et al.* 2015). This permits experiments to be extended beyond standard limits for traditional stable isotope tracer studies of \sim 24 h, thereby providing a vital mechanism for monitoring chronic, cumulative metabolic rates of greater translational relevance.

Since stable isotope tracers are intended to produce quantitative metabolic flux data, the validity of D_2O was recently compared against substrate-specific stable isotope tracers and was validated over hours, days and weeks. In a preliminary study we quantified MPS using a single oral D_2O bolus alongside the 'gold-standard' primed, continuous I.V. infusion of $[{}^{13}C_6]$ phenylalanine within the same person in both fasted and fed (20 g EAA) states over 6 h (Wilkinson *et al.* 2015). D₂O provided comparable mean fractional synthetic rate (FSR) values to those obtained using the traditional phenylalanine tracer, in both fasted and fed states, with a comparable magnitude and direction of change in FSR following feeding (Wilkinson *et al.* 2015). Whilst this shows validity of the technique in a short-term laboratory setting, a major benefit of D_2O is its potential over longer periods. To address this, we studied individuals over an 8 day period incorporating four bouts of unilateral resistance exercise; in doing so we found that MPS measured with D_2O in the non-exercised leg was equivalent to that normally reported with AA stable isotope tracer $(1.2-1.5\%$ day⁻¹ or 0.05–0.06% h^{-1}). Moreover, the exercised leg exhibited significantly greater rates of MPS in multiple muscle protein fractions over the 8 days consistent with early albeit 'undetectable' (i.e. by imaging techniques) muscle hypertrophy (Wilkinson *et al.* 2014). This further highlights the quantitative validity of the approach while exposing the capacity to gain insight into muscle protein fraction (e.g. contractile proteins/mitochondria) regulation on a long-term basis. Following on from this we conducted a 6-week RET study and showed that increased MPS over the first 3 weeks of RET matched early, plateauing muscle hypertrophy (Brook *et al.* 2015). Importantly, in contrast to findings with acute MPS (Mitchell *et al.* 2014), chronic MPS derived using D_2O correlated to long term muscle hypertrophy due to RET (Brook *et al.* 2015), suggesting D_2O can provide a predictive real life representation of exercise adaptation – a premise that was recently confirmed (Damas *et al.* 2016).

As with all tracer techniques, major questions are, what is the true precursor pool? How do we measure it? And can we define an appropriate surrogate precursor? In terms of protein synthesis, the true precursor pool is the amino acyl-tRNA; however, this pool is extremely small and labile and difficult to analyse, and therefore a surrogate that best approximates the true labelling is often used, for example, venous plasma α-ketoisocaproate for leucyl-tRNA (Watt *et al.* 1991) or intracellular phenylalanine for phenylalanyl-tRNA (Baumann *et al.* 1994). With respect to D_2O , the rapid equilibrium throughout the body water pool allows for efficient exchange onto AA intracellularly, and as long as the rate of exchange onto the AA is faster than the rate of turnover of the product (e.g. alanine; Yang *et al.* 1984), the assumption is made that the labelling of the surrogate precursor, intracellular or plasma alanine, reflects that of the D_2O body water labelling (corrected for the number of potential hydrogens labelled on the AA; Dufner & Previs, 2003; Gasier *et al.* 2010). Therefore we can use body water labelling to determine the true precursor for the alanyl-tRNA. This assumption seems to hold for the case of plasma alanine (Dufner *et al.* 2005; Belloto *et al.* 2007), and intracellular alanine (Belloto *et al.* 2007). Significant dilutions to the alanine pool (i.e. through feeding) have been shown to equilibrate rapidly (Dufner *et al.* 2005; Belloto *et al.* 2007). As with many similar tracer techniques, the assumption is made that tracer recycling is minimal, particularly where the turnover of the pool is slow, such as in skeletal muscle. In addition with the rapid exchange of deuterium onto AA, any dilution through recyclingmay be overcome by this rapid exchange. This, however, is something that needs experimental confirmation, particularly with studies performed over

Figure 2. Application of the non-substrate-specific stable isotope tracer D₂O for the measurement of **metabolic turnover**

Schematic diagram summarizing how D_2O can be used as a stable isotope tracer for measuring metabolism of multiple substrates *in vivo*. Upon oral administration (avoiding the need for invasive I.v. administration) D₂O rapidly equilibrates with the body water pool and distributes equally throughout all tissues and organs. Deuterium from the body water is subsequently incorporated into multiple biological substrates such as glucose, AAs and fatty acids, which, unlike substrate-specific stable isotope tracers, allows for the measurement of turnover of multiple substrate pools simultaneously. Due to the slow turnover of the body water pool (half-life \sim 9–11 days), D₂O can provide measurement over periods as short as a few hours in duration (a time period typical for the use of substrate-specific stable isotope tracers) up to days, weeks or even months depending on the substrate of interest (e.g. muscle protein turns over relatively slowly \sim 1–2% day⁻¹, whereas intramuscular triglycerides turnover at \sim 1–2% h⁻¹) and through maintenance of the precursor pool (D₂O in the body water pool) with regular oral dosing of D_2O , highlighting the benefit and additional value that D_2O can provide complimentary to traditional substrate-specific stable isotope tracers.

longer periods, and groups are beginning to investigate these modelling assumptions further (Previs *et al.* 2015; Zhou *et al.* 2015).

Beyond protein metabolism, others have been able to use D_2O to track synthesis rates of muscle DNA during prolonged exercise (Robinson*et al.* 2011), a techniquewith clear importance due to the controversial role of satellite cells in exercise adaptation (Gundersen, 2016). The same is theoretically true for RNA, meaning one can track the role of ribosomal biogenesis in human exercise adaptation. In addition, D_2O has been used to trace cholesterol (and other sterols), plasma lipid metabolism (Castro-Perez *et al.* 2011), and tissue triglyceride and glucose turnover (Strawford *et al.* 2004), e.g. in relation to energy substrate metabolism. Thus, D_2O offers a full complement of tools for providing detailed translational insight into the metabolic basis of the physiological adaptation to exercise in both acute and chronic settings.

Stable isotope tracer and D₂O 'omics': towards a **more mechanistic era**

Tissues consist of tens of thousands of proteins and many more metabolites that perform and regulate different functions at varying rates. Therefore measures of crudely fractionated proteins, e.g. sarcoplasmic/myofibrillar or 'static' metabolite abundances, provide limited information on individual proteins and metabolic fluxes. To gain insight into this, the recent explosion of systems biology has led to the combination of stable isotope tracers/D2O with 'omics', particularly metabolomics and proteomics. For instance, using D_2O ingestion in humans, Hellerstein *et al.* devised a method to isolate peptides using nanoLC-MS/MS and to quantify enrichment of deuterium within these peptides to calculate rates of turnover for individual proteins (Price *et al.* 2012). Unsurprisingly, despite their infancy, these methods are rapidly being utilized to provide unique information regarding tissue

Summary of how D_2O and substrate-specific stable isotope tracers can be used in conjunction with omics techniques (proteomics and metabolomics) for measuring the turnover of individual proteins and the rates of flux through individual metabolic pathways (fluxomics) *in vivo*. Proteomics: bulk tissue protein is made up of thousands of individual proteins that have varying functions and turnover rates; using AA stable isotope tracers and D₂O alongside novel nanoLC-MS/MS techniques, the rates of turnover of individual proteins can be determined by looking for incorporation of isotopic label into isolated peptides. This will provide a more holistic insight into the regulation of tissue protein to interventions such as exercise. Fluxomics: complimentary to this, using metabolomics in conjunction with stable isotope tracers or D_2O the flux of metabolites through different metabolic pathways can be measured, by monitoring the level of isotopic labelling in downstream metabolites. This will provide information on rates of flux through these metabolic pathways, an application particularly suited to exercise physiology where substrate fluxes will dynamically alter in response to different intensities, modes and durations of exercise. M0-M2 represents the mass isotopomer distribution.

proteome dynamics in response to exercise. For example, Shankaran and colleagues were able to quantify FSRs for 273 individual muscle proteins in response to 3 weeks of sprint interval training, and highlight the distinct inter-individual differences in FSR responses for each individual's proteome, suggestive that exercise responses are highly specific to each individual (Shankaran *et al.* 2016). Moreover, using these techniques the notion of a 'virtual muscle biopsy' has been described. Using D₂O-led dynamic proteomics, plasma proteins, such as the muscle-specific creatine kinase and carbonic anhydrase 3 accurately represented rates of turnover of the same proteins (or crude fractions) sampled from muscle (Shankaran *et al.* 2016). This could prove useful in situations where muscle biopsies may be contraindicated, such as in young children or frail elderly, or where they are not easily obtainable such as *during* exercise.

Alongside novel proteomics, the emerging application of stable isotope tracers in metabolomics now enables 'fluxomics' (Fig. 3), whereby flux through metabolic pathways can be dynamically monitored (Niedenführ *et al.*) 2014). A recent example of this was provided in an outbred rat model selected for high or low intrinsic or inborn aerobic capacity (Overmyer *et al.* 2015). Using a $[U¹³C₁¹⁵N]$ valine tracer, and monitoring the enrichment of 13 C labelling in downstream metabolites of valine such as C_3/C_4 carnitines and β -hydroxyisobutyrate, and the $15N$ labelling of transamination metabolites such as glutamate, it was shown that high aerobic capacity was associated with increased flux through branched chain amino acid catabolic pathways, which combined with more efficient fatty acid utilization spared muscle glycogen (Overmyer *et al.* 2015). These fluxomics techniques could become even more powerful when combined with novel tracers such as D_2O , which has the potential to provide flux data from a multitude of different pathways simultaneously (through mechanisms described above (Fig. 3). Enabling energy substrate flux to be dynamically probed in an unbiased manner will be key to exercise physiology research as it can provide dynamic metabolic data in response to interventions such as exercise and diet, e.g. to quantify the mechanisms of energy substrate contributions to exercise. Whilst these techniques are still in their infancy, the application of dynamic proteomics and metabolomics alongside traditional 'bulk' metabolic tracer studies will provide tools to develop a more integrated and holistic understanding of physiological and health adaptations to exercise. It is noteworthy that all are indeed eminently doable in humans.

Emerging non-invasive stable isotope tracer techniques: muscle protein breakdown and mass

Quantification of 3-methylhistidine (3-MH) in urine (a post-translationallymodified histidine residue that cannot be reincorporated into new peptides following breakdown) has been used as a proxy for muscle protein breakdown (MPB) for > 40 years (Bilmazes *et al.* 1978). Nonetheless, its abundance is very low, routinely being measured through 24 h urine collections, and it can be affected by dietary (meat) intake thereby influencing its accuracy (Marliss *et al.* 1979). However, via oral provision of ${}^{2}H_{3}$ -labelled 3-MH and monitoring its dilution by endogenously released 3-MH in temporal blood or urine samples, a rate of whole body myofibrillar protein breakdown can be estimated in an approach that is not significantly influenced by diet (Sheffield-Moore *et al.* 2014). Therefore, this provides a future opportunity to investigate the 'missing part of the balance equation' (most people tend to look only at MPS due to technical challenges of measuringMPB) and howMPB is modulated by exercise or nutritional interventions.

The quantification of whole body skeletal muscle mass, for example, typically requires expensive imaging technology (magnetic resonance imaging (MRI), computer tomography, dual-energy X-ray absorptiometry). However, it was recently shown that whole body muscle mass could be determined by measuring the enrichment of $[{}^{2}H_{3}]$ creatinine in the urine following provision of a small oral bolus of $[^2H_3]$ creatine; oral $[^2H_3]$ creatine equilibrates within the muscle creatine pool, is converted to creatinine at a constant rate of \sim 2% day⁻¹ and excreted in urine, where the enrichment of $[{}^{2}H_{3}]$ creatinine in the urine is representative of $[^2H_3]$ creatine enrichment in the muscle. From this, creatine pool size and skeletal muscle mass can be estimated (Stimpson *et al.* 2012, 2013; Clark *et al.* 2014). While not a new technique (Kreisberg *et al.* 1970; Picou *et al.* 1976), this has since been validated providing accurate measures of whole body skeletal muscle which correlate with MRI measures in humans (Clark *et al.* 2014) and changes in muscle mass in growing animals (Stimpson *et al.* 2013).

Conclusions: the future

Substrate-specific stable isotope tracers have provided great insight into protein, lipid and carbohydrate metabolism responses to acute/chronic exercise. Recent developments of novel stable isotope tracer techniques mean it is now possible to use a single non-substratespecific tracer, D_2O , to measure the turnover of multiple substrate pools simultaneously in 'free living' humans over hours to months, overcoming limitations associated with substrate-specific tracers. When applied in conjunction with proteomics and metabolomics, D_2O has the power to probe metabolism down to the level of the turnover of single proteins or flux through metabolic pathways. The combination of traditional substrate-specific stable isotope tracers for measurement of acute tissue-specific and whole body metabolism and D_2O for chronic 'free living' measurements of multiple substrate turnover, single protein turnover and flux, alongside other minimally invasive stable isotope tracer techniques (e.g. MPB and muscle mass), means that in the future we can provide in humans a dynamic holistic picture of exercise metabolism in the minutest detail.

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Additional information

Competing interests

The authors declare no competing interests.

Author contributions

All authors contributed to conception, writing and final editing of the manuscript. All authors have approved the final version of the manuscript and agree to be accountable for all aspects of the work. All persons designated as authors qualify for authorship, and all those who qualify for authorship are listed.

Funding

D.J.W. is a Post-doctoral Research Fellow funded through the MRC-ARUK Centre for Musculoskeletal Ageing Research. The MRC-ARUK Centre for Musculoskeletal Ageing Research was funded by grants from the Medical Research Council (grant number MR/K00414X/1) and Arthritis Research UK (grant number 19891) awarded to the Universities of Nottingham and Birmingham. The authors' work discussed in the review was funded through the Dunhill Medical Trust (grant number R264/1112), The Physiological Society and the Medical Research Council Confidence in Concept programme (grant number CIC12019).

Acknowledgements

The authors would like to acknowledge Dr Bethan Phillips for her insightful feedback following drafting of the manuscript.