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Quality by design to define critical process parameters for mesenchymal stem cell expansion

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Abstract

Stem cell-based therapeutic products could be the key to treat the deadliest current pathologies, ranging from neuro-degenerative to respiratory diseases. However, in order to bring these innovative therapeutics to a commercialization stage, reproducible manufacturing of high quality cell products is required. Although advances in cell culture techniques have led to more robust production processes and dramatically accelerated the development of early-phase clinical studies, challenges remain before regulatory approval, particularly to define and implement science-based quality standards (essential pre-requisites for national health agencies). In this regard, using new methodologies, such as Quality By Design (QBD), to build the production process around drug quality, could significantly reduce the chance of product rejection. This review-based work aims to perform a QBD approach to Mesenchymal Stem Cell (MSC) manufacturing in standard two-dimensional flasks, using published studies which have determined the impact of individual process parameters on defined Critical Quality Attributes (CQA). Along with this bibliographic analysis, parameter criticality was determined during the two main manufacturing stages (cell extraction and cell amplification) along with an overall classification in view of identifying the Critical Process Parameters (CPP). The analysis was performed in view of an improved standardization between research teams, and should contribute to reduce the gap towards compliant Good Manufacturing Practice (cGMP) manufacturing.

Keywords: Quality by design, Mesenchymal stem cells, Critical process parameters

1 Introduction

Advanced Therapy Medicinal Products (ATMP's) are a class of bio-pharmaceuticals comprised of in-2 novative therapeutics such as gene therapies, tissue engineered products or cell therapies. Notably, the 3 development of genetically engineered T-cells (CAR-T) and stem cell products have triggered a recent wave of applications. For example, over twice as many clinical trials using Mesenchymal Stem Cells (MSC) were 5 registered by the US National Library of Medicine between 2011 and 2015. These cutting-edge products 6 were shown to address a wide range of indications such as bone/cartilage, heart, neuro-degenerative, immune / autoimmune diseases Trounson and McDonald [2015]. More recently, MSC-based products have been shown to be efficient in cases of acute respiratory distress syndrome (ARDS) for example for the treatment of COVID-19 patients Metcalfe [2020], Moll et al. [2020]. However, the distribution of these products by 10 phase was shown not to evolve, indicating the products were not moving out of the clinical pipeline (only 11 7% of clinical trials passed onto phase 3) Trounson and McDonald [2015], Trounson et al. [2011]. A rapid 12 search of the NIH database (https://clinicaltrials.gov/) for MSC-based clinical trials in 2020 seems 13 to indicate a similar distribution, possibly due to incomplete quality standards during early development 14 phases. For example, 73% of interviewed companies producing ATMP's have faced manufacturing and qual-15 ity assurance issues which may be related to inconsistencies between the laboratory and scale-up phase or 16 issues with quality standard definitions Ten Ham et al. [2018]. Although great progress has been made since 17 2011 to understand and develop MSC therapies, several lead trials have either undergone early termination 18 or failed to meet the requirements for phase progression Parekkadan and Milwid [2010]. Thus, it seems that 19 important bottlenecks still remain to produce high quality MSC's and pass onto commercial development of 20 these therapies. In this regard, using new tools and methodologies, such as the Quality By Design (QBD) 21 approach, may be an essential foundation to help products achieve commercialization. 22

²³ 1. Defining a quality-based approach for cGMP manufacturing

24 1.1. The Quality By Design approach

QBD is a scientific and risk-based approach to product development which is currently flourishing in the 25 pharmaceutical industry Rathore and Winkle [2009]. Using this methodology brings the definition of quality 26 standards early in the process development stages. In this mindset, the QBD method begins by defining the 27 desired product characteristics from a patient and clinical perspective : the Quality Target Product Profile 28 (QTPP) (Figure 1). These requirements are then used to define Critical Quality Attributes (CQA's) which 29 will be necessary and sufficient to guarantee product efficacy and safety. Each CQA should be routinely 30 tested (with rapid, sensitive and reliable procedures Gad [2008]) and stability should be maintained within 31 a defined range Yu et al. [2014]. Once the quality attributes are defined, it is important to understand how 32 the production process will impact these quality attributes. In this regard, the Critical Process Parameters 33 (CPP's) will be determined as well as their defined ranges. Working within these ranges (*i.e.* the design 34 space) should ensure consistent product quality regardless of the set of parameters used. During routine 35 manufacturing, Ongoing Process Verification (OPV) should then be put in place according to a defined control strategy of these CPP's in order to easily detect shifts or abnormalities which may impact the 37 quality of the final drug product. 38

³⁹ 1.2. Identifying Critical Process Parameters

In order to define and compare the criticality of process parameters, an approach inspired by the Risk 40 Priority Number (RPN) was proposed. The method has typically been used for Failure Mode and Effect 41 Analysis (FMEA) Xiao et al. [2011], Sellappan N [2013], Certa et al. [2017], Khandagade et al. [2013], Harms 42 et al. [2008], Seely and Haury [2005] in order to prioritize potential failures based on their Severity (S), 43 Occurrence (O) and ease of Detection (D). For this, scores between 1 and 10 are defined according to a 44 predefined scale suggested by the IEC 60812 for each factor (S, O and D) and are multiplied to obtain the 45 RPN number. Issues with the highest RPN value are therefore the most critical and should be addressed 46 47 first.

Using this basis, an "impact score" was determined to evaluate the expected impact of each process 48 parameter on each CQA. A similar strategy has been proposed by the CMC Biotech working group using 49 a five-level scale to evaluate the impact of CQA's in a monoclonal antibody production process case study 50 Group [2009]. Although the attribution of a given impact score was based on available literature and 51 scientific knowledge, it remains, by nature, a subjective quantification. In this study, the scale proposed 52 was reduced to three risk levels for an easier and less subjective assessment (Table 1). Admittedly, three-53 level hierarchies are common in literature for criticality evaluations Mitchell [2014]. When no literature was 54 available, an impact score of 1.1 was set to account for uncertainty, considering a low parameter impact if 55 little literature exists. Based on RPN calculations in FMEA's, a RPN number for each QTPP attribute was 56 calculated by the product of its factors. However, since not all QTPP attributes were defined by the same 57 number of parameters, a correction factor was applied on all RPN calculations for a better comparability 58 between results. Lastly, an overall RPN calculation was defined, calculated through the average of the RPN 59 calculations of all QTPP attributes in order to define the most critical parameters for the overall quality of 60 cells and to present an overview of the production process as a whole. 61

⁶² 2. Using Quality By Design for Mesenchymal Stem Cell Manufacturing

63 2.1. Defining the Quality Target Product Profile (QTPP)

In order to understand their therapeutic potential, two categories of cell-based medicinal products using 64 MSC's will be described, on the basis of existing reviews Sharma et al. [2014], Lipsitz et al. [2016] and similar 65 QBD examples Rathore [2009] (Table 2). To begin with, MSC's exhibit tropism for sites of tissue damage 66 Spaeth et al. [2008] and generate local regenerative environments (secretion of anti-inflammatory factors 67 Eggenhofer and Hoogduijn [2012], stimulation of local cell-mediated repair processes Caplan and Correa 68 [2011]). In addition, MSC's have interesting immunomodulatory properties by activating and/or modulating 69 the maturation of various immune cells including T-Lymphocytes Di Nicola et al. [2002], B lymphocytes 70 Corcione et al. [2006], Natural Killer (NK) cells Spaggiari et al. [2006] and dendritic cells Zangi et al. [2009]. 71 However, evidence suggests that these properties may intrinsically depend on the micro environment in which 72 the cells are grafted Han et al. [2019]. For example, excess cytokine production (growth factors, chemokines 73 etc.) or an uncontrolled immunosuppressive effect can stimulate tumor growth Amariglio et al. [2009] or 74 favour an inflammatory response Li et al. [2012]. As a result, sufficient purity and quality of these products 75 will be required for their successful development. In addition, their properties should be preserved as well 76 as their capacity to adapt *in-vivo* to avoid adverse effects. 77

On the other hand, MSC's are able to differentiate into different tissues of mesodermal lineages such 78 as bone, cartilage, tendon, muscle or fat cells Caplan and Correa [2011]. It has also been suggested that 79 MSC's can differentiate into ectodermal lineage cells such as neurons or epithelium cells, but also endodermal 80 lineage cells such as hepatocytes Han et al. [2019]. As a result, cells can be used for ex-vivo tissue engineering 81 using adapted scaffolds such as extracellular matrix scaffolds Agmon and Christman [2016], or on polymeric 82 scaffolds Caplan [2007]. In this case, the specific and controllable differentiation potential needs to be 83 maintained. The differentiation may also be of interest *in-vivo*, although MSC differentiation in the acute 84 phase of injury is unlikely and regeneration is most-likely mediated by their trophic function or cell-cell 85 contact rather than differentiation. 86

87 2.2. Defining Critical Quality Attributes (CQA's)

Building upon previous quality-based approaches for MSC manufacturing Martin et al. [2017], the attributes which affect the QTPP defined in Table 2 are proposed as well as suggested acceptance criteria for these parameters, mandatory per FDA's Code of Federal Regulations (21-CFR) (Table 3). The acceptance criteria proposed are based on literature data but should, without any doubt, be adapted to individual applications.

93 2.2.1. Dosage Strength

A generalized optimal dose without adverse side-effects is not expected since likely depends on disease, route of administration, frequency and other parameters Sharma et al. [2014]. It is therefore likely that the number of cells required at the end of the expansion process will vary and, ideally, the process should keep flexibility in this regard. The dosage strength will depend, from a process perspective, on cell quantity and cell viability throughout the process.

⁹⁹ **Cell Quantity (Qua.)** Final cell quantity can be directly obtained by viable cell counting of the detached ¹⁰⁰ cells after expansion. During the expansion process, this parameter is intrinsically linked to the different step ¹⁰¹ yields (from initial cell extraction to final detachment phase) as well as the final concentration. Although ¹⁰² it would be interesting to perform the cell culture process in concentrated conditions to reduce equipment ¹⁰³ volume, it should be kept in mind that an increased concentration may cause the aggregation of cells or an ¹⁰⁴ increased viscosity which may impact the lot-to-lot homogeneity of the final product or cause needle clogging ¹⁰⁵ during patient administration Amer et al. [2017].

Cell Viability (Via.) Viability can easily be determined after cell detachment using exclusion staining
 such as trypan blue or flow cytometry techniques. In order to achieve robust and cost-effective large-scale
 manufacturing, it is important to maintain a high level of viability, typically greater than 90 % all throughout
 the process. In certain exceptional cases, a lower limit of 70 % can be acceptable for the finished product
 Gad [2008].

111 2.2.2. Therapeutic Potency

Potency is the specific ability of a product to effect a given result when administered according to defined posology. This characteristic is influenced by 3 target attributes: identity, differentiation capacity and *in-vivo* effect for which testing should comply with 21CFR section 600.3 recommendations.

Identity (Id.) The cells produced during and after expansion must have maintained the characteristics of 115 MSC's, at the risk of expanding the wrong cell type. In 2006, the International Society for Cellular Therapy 116 (ISCT) proposed a list of cell markers which can identify MSC's Dominici et al. [2006] and which continues to 117 be used. It should be noted that there are debates concerning the robustness of ISCT cell markers for MSC 118 characterization Martin et al. [2017] and that additional RNA's or proteins could be used to complete the 119 criteria proposed Billing et al. [2016], Mindaye et al. [2013]. In this mindset, the review of the 20 most-used 120 production markers in 66 MSC-based product submissions to the FDA calls for caution regarding the need 121 for further characterization, especially for non-bone marrow derived MSC's Mendicino et al. [2014]. It is likely that the definition proposed is neither exhaustive nor universal. 123

In-vitro differentiation capacity (Dif.) MSC differentiation capacity was separated from identity mark-124 ers for clarity in the analysis. Although some quantitative descriptions have been proposed for MSC differen-125 tiation Vishnubalaji et al. [2012], they globally remain rare. Most articles qualitatively evaluate the capacity 126 of a sample to undergo differentiation and the proportion of cells which have the tri-lineage differentiation 127 capacity is, in most cases unknown. However, since routine testing of clonal populations would require long 128 analysis and delay product release, this CQA has been evaluated in a qualitative manner (ie, sub-populations) 129 of the final cell culture sample must be able to differentiate into the three lineages and variations between 130 conditions may be visually defined). 131

Expected in-vivo effect (Viv.) The last quality attribute impacting potency is the capacity of the cells to exert their appropriate *in-vivo* effect. Functionality assays are typically measured through *in-vitro* co¹³⁴ cultures with T-cells, for example, but tests should ultimately depend on the target therapy Gad [2008].

¹³⁵ Although this attribute is rarely measured, information was included when possible.

136 2.2.3. Product quality

¹³⁷ In order to keep a homogeneous nomenclature between sections, the term drug quality will be used accord-¹³⁸ ing to its use in ICH Q8 guidelines (*i.e.* characteristics required to avoid adverse effects after administration ¹³⁹ such as sterility, purity and stability of the product).

Genetic stability (Gen.) Many studies have shown an increased senescent state after an *ex-vivo* culture of 140 MSC's, for which replication is limited by the Hayflick limit and telomere length Hayflick [1964]. Generally, 141 senescent cells display a characteristic large, flattened morphology and are characterized by an irreversible G1 142 growth arrest involving the repression of genes that drive cell cycle progression and the up-regulation of cell 143 inhibitors like p53/p21 (primarily due to telomere dysfunction and DNA damage) and p16/RB (oncogenes, 144 chromatin disruption and various stresses Sethe et al. [2006]). Senescent cells secrete factors that are pro-145 inflammatory Kletsas et al. [2004], stimulate tissue aging and tumorigenesis Krtolica and Campisi [2003], 146 Han et al. [2019]. Although data suggests a higher genetic stability of MSC's compared to other cell sources 147 such as Embryonic Stem Cells (ESC) or induced Pluripotent Stem Cells (iPSC) Kim and Park [2017], more 148 routine and thorough genetic phenotyping would be required to further understand these possibly critical 149 effects. It is still unclear, however, how such data would be interpreted, and what level of genetic abnormality 150 would be required to disqualify a cell line for clinical use Vazin and Freed [2010]. For simplification, these 151 problematics have been regrouped into a qualitative attribute called genetic stability. 152

Cell Purity (Pur.) The last quality attribute concerns the absence of contamination during the process. 153 Ideally, sterility testing should be performed after each critical manipulation step during cell culture in 154 order to detect fungal, bacterial or mycoplasma contamination of the cells. The presence of contaminations 155 compromises the safety of therapeutic products. Furthermore, the final cell product should be free of other 156 cell contaminants which could have adverse effects in-vivo. For example, the presence of 25-50% of non-MSC 157 cells within the cell population causes a dose-dependant diminution of differentiation potential *in-vivo* and 158 *in-vitro* Caplan [2007]. Although this amount of contamination may seem high, and purity is expected to 159 be higher than 75% at the end of cell culture, it should be kept in mind that, after clinical applications, the 160 injected MSC's will be diluted with host connective tissue, at a factor which is difficult to predict. 161

162 2.3. Defining Critical Process Parameters (CPP's)

Maintaining high quality standards within a production facility requires a rigorous understanding of the interaction between process parameters and the impact of their potential deviation on product quality (*i.e.* defined CQA's). In the case of MSC culture, the most common manufacturing technique is composed of two main stages, each with a set of co-dependent parameters.

167 2.3.1. Cell Extraction

To begin with, MSC's are extracted from a suitable donor and an appropriate tissue source. Although the 168 majority of clinical trials have used cells isolated from Bone Marrow aspirations (BM), extraction protocols 169 remain invasive and painful. Alternative tissue sources include discarded Umbilical Cords (UC) Margossian 170 et al. [2012] or lipoaspirate-derived Adipose Tissue (AT) Aust et al. [2004] which offer an easily accessible, 171 low cost and pain-free source of MSC's. Independently of tissue source, the extracted cell population has 172 typically been composed of only a small proportion of MSC's (less than 0.05% in the case of BM Guo et al. 173 [2006]). As a result, cells need to be carefully selected to obtain a homogeneous initial population of MSC's 174 Han et al. [2019], Tong et al. [2011], Sharma et al. [2014], Oedayrajsingh-Varma et al. [2006], Guo et al. 175 [2006], Gentry et al. [2007]. The question of which tissue source or extraction method might be optimal 176 for any given clinical situation is, however, not yet clearly understood due to important quality variations 177 reported in literature Han et al. [2019], Sharma et al. [2014], De Ugarte et al. [2003], Vishnubalaji et al. 178 [2012], Yang et al. [2014], Planat-Benard V. et al. [2004]. Lastly, the extraction phase typically ends with a 179 cryopreservation step for logistic purposes (expansion of the cells is rarely performed at the site of extraction) 180 Ikebe and Suzuki [2014]. Studies generally tend to show that cryopreservation has little impact on CQA's 181 and that traditional cryopreservation techniques can be considered robust for pre-clinical trials Steigman 182 et al. [2008]. 183

Overall, the most noteworthy characteristic, at this stage, is the considerable donor-to-donor and intrapopulation heterogeneity Christ et al. [2017], Phinney [2012], Vangsness et al. [2015] which is particularly critical for allogenic therapies since each donor brings a "one to many" associated risk in case of un-detected infection or functional abnormality Group [2014]. In this regard, donor age seems to be the most important factor Baker et al. [2015], for example through a decreased quantity of cells extracted was generally lower in older patients Yang et al. [2014] possibly due to a reduced plastic attachment Kretlow et al. [2008] or to a lower initial titer of MSC's Caplan [2007] (see Table 4). Evidence also suggested that expression levels

of MSC markers may vary upon age Stolzing et al. [2008] as well as an altered differentiation potential 191 ('adipogenic switch' described in most studies Sethe et al. [2006], Meunier et al. [1971]). In addition, age 192 seemed to reduce cell growth Baxter et al. [2004], increase doubling times Yang et al. [2014], Choudhery 193 et al. [2014], reduce replicative lifespan Zaim et al. [2012], Baxter et al. [2004] and increase genetic instability 194 Baxter et al. [2004], Stolzing et al. [2008]. Since donor age is the only parameter which scored a RPN value 195 greater than 9 (see Figure 2), it can be considered as the only CPP at this stage. However, the combination of 196 parameters as a whole, for example patient illness such as diabetes Pierdomenico [2011] or obesity Tencerova 197 et al. [2019], make it difficult to predict, at a large scale, how many cells can initially be extracted for each 198 donor and whether the quality and purity of these cells will meet the requirements for clinical applications. 199

200 2.3.2. Cell Amplification

After the initial extraction phase, cells undergo an amplification phase using mono-layer flasks (tissue 201 flasks) of different sizes Ikebe and Suzuki [2014] in order to expand the initial cells to a reproducible target 202 concentration for administration. This method of expansion is well documented in literature Chen et al. 203 [2013] but labour intensive due to the required manual passaging of cells between different containers. Fur-204 thermore, the risk of contamination increases with the number of container systems and the required number 205 of passages. This risk can be reduced by limiting the number of containers (through cell stack systems for 206 example Fekete et al. [2012]), using fully automated processes Thomas et al. [2007] or developing fully closed 207 production systems Hanley et al. [2014], Zanini et al. [2020], although these options are not yet fully ex-208 plored in clinical facilities. Furthermore, in most clinical trials, cells were expanded using defined basal cell 209 culture media, composed of all the elements required for cell growth such as an energy source (glucose often 210 supplemented with L-glutamine), essential amino-acids and specific ions (calcium, magnesium, potassium, 211 sodium etc.) Ikebe and Suzuki [2014]. In addition, these chemically defined media were, in most studies, 212 completed with 5 to 20% bovine serum or xeno-free alternatives such as Human Platelet Lysate (HPL) Gad 213 [2008], which provides complementary factors such as hormones, substrate-attachment molecules or binding 214 proteins Caterson et al. [2002], Schallmoser et al. [2007]. Notably, the choice of supplementation type and 215 concentration has been shown to impact bone formation capacity Kuznetsov et al. [2000] and immunomod-216 ulatory effects Abdelrazik et al. [2011], Bernardo [2010], Nasef et al. [2007]. In parallel, seeding density has 217 been at the center of various studies Ikebe and Suzuki [2014] but results remain controversial, leading to low 218 overall RPN scores. The only parameters which scored RPN ratings over 9 (and may therefore be considered 219 as critical) seem to be the amount of population doublings that cells undergo and the oxygen concentration 220 used during cell culture (see Figure 2). 221

Cell culture duration can typically be calculated using either the number of passages (usually performed 222 using enzymatic detachment such as trypsination) or the number of population doublings (PD) that the 223 cells undergo. The population doublings, rather than the amount of passages, should be considered when 224 comparing studies due to high variability between research teams in seeding densities and confluence before 225 harvest. This renders the comparison between cells at a same passage difficult Wagner et al. [2010]. In this 226 regard, the number of population doublings will determine the maximum amount of cells that can be obtained 227 through cell culture since proliferation typically remains within the Hayflick limit of around 20-60 population 228 doublings Wagner et al. [2009], Rombouts and Ploemacher [2003], Schallmoser et al. [2010], Charbord et al. 229 [2011], Bonab et al. [2006], Noer et al. [2007], Kim et al. [2009]. The most described reason for senescence 230 during cell culture is a reduced telomere length throughout culture (50 - 100 bp/PD) Sethe et al. [2006], 231 Bonab et al. [2006], Baxter et al. [2004] associated with very low levels of telomerase activity indicating 232 cells are not "repairing" the shortened telomeres Kim et al. [2009]. It can be noted that the shift towards 233 senescence may be gradual over time (possibly though the progressive regulation of genes Schallmoser et al. 234 [2010], Wagner et al. [2009, 2008] and early signs of senescence (for example through change in morphology 235 or an increased doubling time) have been observed as early as a few days after culture Banfi et al. [2000], 236 Larson et al. [2008]. In addition, increase of population doublings has also been associated with a loss of 237 multipotency Kim et al. [2009], Wagner et al. [2010] as early as 18-20 population doublings Banfi et al. [2000] 238 as well as reduced immunosuppressive capacities Nasef et al. [2007] or an increased tumorgenicity Kim et al. 239 [2009].240

MSC's are naturally present in tissues for which dO_2 concentrations can vary between 1 and 7 % of 241 O₂ saturation depending on the host tissue and tissue vasuclarization Chow et al. [2001], Fehrer et al. 242 [2007]. The most common belief is that *ex-vivo* expansion should be performed in conditions close to the 243 physiological environment from which the cells were extracted, since the amount of oxygen available for cells 244 will have an impact on cell metabolism. For example, an increased growth has been observed in hypoxic 245 conditions (1% v/v O_2 in the head-space) Hung et al. [2012] as well as an increased lifespan (3% v/v O_2 in 246 the head-space) Estrada et al. [2012], Fehrer et al. [2007] compared to normoxic conditions. Some authors 247 propose that cells have a higher susceptibility to cell death at elevated O_2 concentrations for which viability 248 is reduced Fehrer et al. [2007]. In addition, the differentiation potential seems to be impacted Hung et al. 249

[2012], Zhou et al. [2005], Fehrer et al. [2007] as well as the cell secretome Fehrer et al. [2007] and genetic 250 aberrations Estrada et al. [2012], Li and Marbán [2010]. These studies tend to show the quality of cells 251 produced in normoxic conditions may not meet the requirements for clinical use and this parameter should 252 be continuously monitored. Furthermore, it should be kept in mind that, in the case of culture in T-flasks, 253 the oxygen concentration available for the cells is difficult to predict as depends on medium height, density 254 of cells, oxygen consumption, and the incubator characteristics and the concentration is also influenced by 255 the multiple re-perfusion of room air oxygen concentrations during medium changes, passaging or other 256 manipulations Csete [2005]. 257

Furthermore, it can be noted that there are vast controversies in the published data when evaluating the impact of these parameters independently. The review of existing data seems to suggest that there are important interactions between parameters (for example oxygen concentration and nutrient requirements, or cell age and the impact of population doublings) which are still difficult to predict or analyze, but may have a critical impact on the quality of the MSC products.

263 2.3.3. Overview of the cell culture process

Overall process parameter criticality during MSC cell culture was evaluated to identify the most critical 264 parameters throughout the process (see Figure 3). The data suggests that the most critical parameters (as 265 a whole, and assuming an identical weight for all of the CQA's) are cell source, donor age, supplementation 266 type, oxygen concentration and the amount of population doublings that the cells undergo during this phase. 267 These parameters all exceed the global average RPN limit of 4. In order to meet requirements for quality 268 specifications, these parameters should typically be controlled during the expansion phase, have science-269 based specifications, and their impact should clearly be defined. It is noteworthy, however, that it is difficult 270 to predict how various independent parameters interact during MSC production processes, in particular with 271 regard to deviation accumulations. As a result, using additional tools such as Design Of Experiments (DOE) 272 to detect and understand these interactions may be required to further define the design space of quality 273 based MSC manufacturing. 274

275 **3. Future Challenges**

Although great progress has been made to understand and develop cell expansion in two dimensional 276 flasks, these manufacturing processes are not economically viable to supply the predicted requirements for 277 clinical research of cell therapies and tissue engineering products Rowley [2018]. For larger scale manu-278 facturing, new automated technologies Thomas et al. [2007] with greater yields per lot and which reduce 279 equipment occupation space within production facilities, will be required Merten [2015]. In this regard, 280 trends are shifting towards 3D cultures using scalable bioreactors Godara et al. [2008], Hoch and Leach 281 [2014] which are already extensively used in the pharmaceutical industry and are generally well known (on-282 line monitoring, maintenance procedures, cleaning validation, etc.). In order to do so, the adherent MSCs 283 are no longer cultured in planar conditions but using new scaffolds such as microcarriers, hollow fibre or 284 packed bed systems. In addition, the possibility of a fully closed system significantly reduces contamination 285 risks, equipment volume, and will ultimately reduce costs of GMP production Zanini et al. [2020]. We should 286 however note that data concerning MSC cell culture in bioreactors still remains scarce and fine-tuning of pro-287 cess parameters to increase quality and yield is still in early stages of research. Only one clinical trial using 288 bioreactor-based expansion of MSCs seems to have been published (NCT00919958 Prather et al. [2009], key 289 words "Mesenchymal Stem Cell" and "Bioreactor" in https://clinicaltrials.gov/). Understanding the 290 physical and biological mechanisms as well as their kinetic evolution during the different cell culture stages 291 will help unlock current bottlenecks towards quality driven protocols. Using similar QBD methodologies, 292 online monitoring data, and modelization techniques (reviewed in Wyrobnik et al. [2020]) during early-phase 203 process development could be the key to a successful scale-up process and approved commercialization by 294 health authorities. 295

296 References

²⁹⁷ H. Abdelrazik, G. M. Spaggiari, L. Chiossone, and L. Moretta. Mesenchymal stem cells expanded in human ²⁹⁸ platelet lysate display a decreased inhibitory capacity on T- and NK-cell proliferation and function. *Eur*

 $_{299}$ J Immunol, 41:3281-3290, 2011.

G. Agmon and K. L. Christman. Controlling stem cell behavior with decellularized extracellular matrix scaffolds. *Curr Opin Solid St M*, 20:193–201, 2016.

- ³⁰² N. Amariglio, A. Hirshberg, B. W. Scheithauer, Y. Cohen, R. Loewenthal, L. Trakhtenbrot, N. Paz, M. Koren-
- Michowitz, D. Waldman, L. Leider-Trejo, A. Toren, S. Constantini, and G. Rechavi. Donor-derived brain tumor following neural stem cell transplantation in an ataxia telangiectasia patient. *PLoS Med*, 6:0221–
- ³⁰⁵ 0231, 2009.
- M. H. Amer, F. R. A. J. Rose, K. M. Shakesheff, M. Modo, and L. J. White. Translational considerations in injectable cell-based therapeutics for neurological applications: concepts, progress and challenges. *Regen Med*, 2:13, 2017.
- L. Aust, B. Devlin, S. J. Foster, Y. D. C. Halvorsen, K. Hicok, T. du Laney, A. Sen, G. D. Willingmyre, and
 J. M. Gimble. Yield of human adipose-derived adult stem cells from liposuction aspirates. *Cytotherapy*,
 6:7–14, 2004.
- N. Baker, L. B. Boyette, and R. S. Tuan. Characterization of bone marrow-derived mesenchymal stem cells in aging. *Bone*, 70:37–47, 2015.
- A. Banfi, A. Muraglia, B. Dozin, M. Mastrogiacomo, R. Cancedda, and R. Quarto. Proliferation kinetics
 and differentiation potential of ex vivo expanded human bone marrow stromal cells: implications for their
 use in cell therapy. *Exp Hematol*, 28:707–715, 2000.
- M. A. Baxter, R. F. Wynn, S. N. Jowitt, J. E. Wraith, L. J. Fairbairn, and I. Bellantuono. Study of telomere length reveals rapid aging of human marrow stromal cells following in vitro expansion. *Stem Cells*, 22: 675–682, 2004.
- D. Belotti, G. Gaipa, B. Bassetti, B. Cabiati, G. Spaltro, E. Biagi, M. Parma, A. Biondi, L. Cavallotti,
 E. Gambini, and G. Pompilio. Full GMP-compliant validation of bone marrow-derived human CD133+
 cells as advanced therapy medicinal product for refractory ischemic cardiomyopathy. *BioMed Res Int*,
 2015:10, 2015.
- M. E. Bernardo. *Human mesenchymal stromal cells: biological characterization and clinical application*. PhD thesis, Leiden University, 2010.
- K. Bieback, S. Kern, H. Klüter, and H. Eichler. Critical parameters for the isolation of mesenchymal stem
 cells from umbilical cord blood. Stem Cells, 22:625–634, 2004.
- A. M. Billing, H. Ben Hamidane, S. S. Dib, R. J. Cotton, A. M. Bhagwat, P. Kumar, S. Hayat, N. A.
 Yousri, N. Goswami, K. Suhre, A. Rafii, and J. Graumann. Comprehensive transcriptomic and proteomic
 characterization of human mesenchymal stem cells reveals source specific cellular markers. *Sci Rep*, 6:
 1–15, 2016.
- M. M. Bonab, K. Alimoghaddam, F. Talebian, S. H. Ghaffari, A. Ghavamzadeh, and B. Nikbin. Aging of mesenchymal stem cell in vitro. *BMC Cell Biol*, 7:14, 2006.
- S. Bork, S. Pfister, H. Witt, P. Horn, B. Korn, A. D. Ho, and W. Wagner. DNA methylation pattern changes
 upon long-term culture and aging of human mesenchymal stromal cells. *Aging Cell*, 9:54–63, 2010.
- F. Bruna, D. Contador, P. Conget, B. Erranz, C. L. Sossa, and M. L. Arango-Rodríguez. Regenerative potential of mesenchymal stromal cells: age-related changes. *Stem Cells Int*, 2016:15, 2016.
- A. I. Caplan. Adult mesenchymal stem cells for tissue engineering versus regenerative medicine. J Cell
 Physiol, 213:341–347, 2007.
- A. I. Caplan and D. Correa. The MSC: an injury drugstore. Cell Stem Cell, 9:11–15, 2011.
- E. J. Caterson, L. J. Nesti, K. G. Danielson, and R. S. Tuan. Human marrow-derived mesenchymal progenitor
 Mol Biotechnol, 20:245–256, 2002.
- A. Certa, M. Enea, G. M. Galante, and C. M. La Fata. ELECTRE TRI-based approach to the failure modes
 classification on the basis of risk parameters: an alternative to the risk priority number. *Comput Ind Eng*,
 108:100-110, 2017.
- P. Charbord, E. Livne, G. Gross, T. Häupl, N. M. Neves, P. Marie, P. Bianco, and C. Jorgensen. Human
 bone marrow mesenchymal stem cells: a systematic reappraisal via the genostem experience. *Stem Cell Rev*, 7:32–42, 2011.

- A. K.-L. Chen, S. Reuveny, and S. K. W. Oh. Application of human mesenchymal and pluripotent stem
 cell microcarrier cultures in cellular therapy: achievements and future direction. *Biotechnol Adv*, 31:
 1032–1046, 2013.
- M. S. Choudhery, M. Badowski, A. Muise, J. Pierce, and D. T. Harris. Donor age negatively impacts adipose
 tissue-derived mesenchymal stem cell expansion and differentiation. J Transl Med, 12:8, 2014.
- D. C. Chow, L. A. Wenning, W. M. Miller, and E. T. Papoutsakis. Modeling pO2 distributions in the bone marrow hematopoietic compartment. II. modified kroghian models. *Biophys J*, 81:685–696, 2001.
- B. Christ, M. Franquesa, M. Najimi, L. J. W. van der Laan, and M. H. Dahlke. Cellular and molecular
 mechanisms of mesenchymal stem cell actions. *Stem Cells Int*, 2017:1–2, 2017.
- D. C. Colter, R. Class, C. M. DiGirolamo, and D. J. Prockop. Rapid expansion of recycling stem cells in cultures of plastic-adherent cells from human bone marrow. *Cell Biol*, 97:3213–3218, 2000.
- P. A. Conget and J. J. Minguell. Phenotypical and functional properties of human bone marrow mesenchymal
 progenitor cells. J Cell Physiol, 181:67–73, 1999.
- A. Corcione, F. Benvenuto, E. Ferretti, D. Giunti, V. Cappiello, F. Cazzanti, M. Risso, F. Gualandi, G. L.
 Mancardi, V. Pistoia, and A. Uccelli. Human mesenchymal stem cells modulate B-cell functions. *Blood*, 107:367–372, 2006.
- M. Csete. Oxygen in the cultivation of stem cells. Ann NY Acad Sci, 1049:1–8, 2005.
- D. A. De Ugarte, K. Morizono, A. Elbarbary, Z. Alfonso, P. A. Zuk, M. Zhu, J. L. Dragoo, P. Ashjian,
 B. Thomas, P. Benhaim, I. Chen, J. Fraser, and M. H. Hedrick. Comparison of multi-lineage cells from
 human adipose tissue and bone marrow. *Cells Tissues Organs*, 174:101–109, 2003.
- M. Di Nicola, C. Carlo-Stella, M. Magni, M. Milanesi, P. D. Longoni, P. Matteucci, S. Grisanti, and A. M. Gianni. Human bone marrow stromal cells suppress T-lymphocyte proliferation induced by cellular or nonspecific mitogenic stimuli. *Blood*, 99:3838–3843, 2002.
- H. Dimitriou, E. Linardakis, G. Martimianaki, E. Stiakaki, C. H. Perdikogianni, P. Charbord, and
 M. Kalmanti. Properties and potential of bone marrow mesenchymal stromal cells from children with
 hematologic diseases. *Cytotherapy*, 10:125–133, 2008.
- M. Dominici, K. Le Blanc, I. Mueller, I. Slaper-Cortenbach, F. Marini, D. Krause, R. Deans, A. Keating, D. Prockop, and E. Horwitz. Minimal criteria for defining multipotent mesenchymal stromal cells. the international society for cellular therapy position statement. *Cytotherapy*, 8:315–317, 2006.
- C. Doucet, I. Ernou, Y. Zhang, J.-R. Llense, L. Begot, X. Holy, and J.-J. Lataillade. Platelet lysates promote
 mesenchymal stem cell expansion: a safety substitute for animal serum in cell-based therapy applications.
 J Cellular Physiol, 205:228–236, 2005.
- M. R. Dressler, D. L. Butler, and G. P. Boivin. Effects of age on the repair ability of mesenchymal stem cells in rabbit tendon. *J Orthopaed Res*, 23:287–293, 2005.
- E. Eggenhofer and M. J. Hoogduijn. Mesenchymal stem cell-educated macrophages. *Transplant Res*, 1:12, 2012.
- J. C. Estrada, C. Albo, A. Benguría, A. Dopazo, P. López-Romero, L. Carrera-Quintanar, E. Roche, E. P. Clemente, J. A. Enríquez, A. Bernad, and E. Samper. Culture of human mesenchymal stem cells at low oxygen tension improves growth and genetic stability by activating glycolysis. *Cell Death Differ*, 19:
- зав 743-755, 2012.
- C. Fehrer, R. Brunauer, G. Laschober, H. Unterluggauer, S. Reitinger, F. Kloss, C. Gülly, R. Gaßner, and
 G. Lepperdinger. Reduced oxygen tension attenuates differentiation capacity of human mesenchymal stem
 cells and prolongs their lifespan. Aging Cell, 6:745–757, 2007.
- N. Fekete, M. T. Rojewski, D. Fürst, L. Kreja, A. Ignatius, J. Dausend, and H. Schrezenmeier. GMPcompliant isolation and large-scale expansion of bone marrow-derived MSC. *PLoS One*, 7:e43255, 2012.
- T. Fink, L. Abildtrup, K. Fogd, B. M. Abdallah, M. Kassem, P. Ebbesen, and V. Zachar. Induction of
 adipocyte-like phenotype in human mesenchymal stem cells by hypoxia. *Stem Cells*, 22:1346–1355, 2004.

- M. François, I. B. Copland, S. Yuan, R. Romieu-Mourez, E. K. Waller, and J. Galipeau. Cryopreserved mes-
- enchymal stromal cells display impaired immunosuppressive properties as a result of heat-shock response
- and impaired interferon- γ licensing. Cytotherapy, 14:147–152, 2012.
- S. C. Gad. *Pharmaceutical manufacturing handbook*. Wiley-Interscience, John Wiley and Sons, Inc., Hoboken,
 New Jersey, 2008.
- T. Gentry, S. Foster, L. Winstead, E. Deibert, M. Fiordalisi, and A. Balber. Simultaneous isolation of
 human BM hematopoietic, endothelial and mesenchymal progenitor cells by flow sorting based on aldehyde
 dehydrogenase activity: implications for cell therapy. *Cytotherapy*, 9:259–274, 2007.
- P. Godara, C. D. McFarland, and R. E. Nordon. Design of bioreactors for mesenchymal stem cell tissue
 engineering. J Chem Tech Biotechnol, 83:408–420, 2008.
- S. Golpanian, J. El-Khorazaty, A. Mendizabal, D. L. DiFede, V. Suncion, V. Karantalis, J. E. Fishman,
 E. Ghersin, W. Balkan, and J. M. Hare. Effect of aging on human mesenchymal stem cell therapy in ischemic cardiomyopathy patients. J Am Coll Cardiol, 65:125–132, 2015.
- S. Gronthos. Molecular and cellular characterisation of highly purified stromal stem cells derived from human
 bone marrow. J Cell Sci, 116:1827–1835, 2003.
- C. B. W. Group. A Mab: a case study in bioprocess development version 2.1. CMC Biotech Working Group,
 2009:278, 2009.
- C. W. Group. Donation of starting material for cell-based advanced therapies: a SaBTO review. Advisory
 Committee on the Safety of Blood, Tissues and Organs, 2014:141, 2014.
- 415 K.-T. Guo, R. SchÄfer, A. Paul, A. Gerber, G. Ziemer, and H. P. Wendel. A new technique for the isolation
- and surface immobilization of mesenchymal stem cells from whole bone marrow using high-specific DNA
 aptamers. Stem Cells, 24:2220–2231, 2006.
- Y. Han, X. Li, Y. Zhang, Y. Han, F. Chang, and J. Ding. Mesenchymal stem cells for regenerative medicine.
 Cells, 8:32, 2019.
- P. J. Hanley, Z. Mei, A. G. Durett, M. d. G. Cabreira-Harrison, M. Klis, W. Li, Y. Zhao, B. Yang, K. Parsha,
 O. Mir, F. Vahidy, D. Bloom, R. B. Rice, P. Hematti, S. I. Savitz, and A. P. Gee. Efficient manufacturing
 of therapeutic mesenchymal stromal cells using the quantum cell expansion system. *Cytotherapy*, 16:
 1048–1058, 2014.
- ⁴²⁴ J. Harms, X. Wang, T. Kim, X. Yang, and A. S. Rathore. Defining process design space for biotech products: ⁴²⁵ case study of pichia pastoris fermentation. *Biotechnol Progr*, 24:655–662, 2008.
- 426 L. Hayflick. The limited in vitro lifetime of human diploid cell strains. Exp Cell Res, 37:614–636, 1964.
- A. I. Hoch and J. K. Leach. Concise review: optimizing expansion of bone marrow mesenchymal stem/stromal cells for clinical applications. *Stem Cell Transl Med*, 3:643–652, 2014.
- S.-P. Hung, J. H. Ho, Y.-R. V. Shih, T. Lo, and O. K. Lee. Hypoxia promotes proliferation and osteogenic differentiation potentials of human mesenchymal stem cells. J Orthopaed Res, 30:260–266, 2012.
- C. Ikebe and K. Suzuki. Mesenchymal stem cells for regenerative therapy: optimization of cell preparation
 protocols. *BioMed Res Int*, 2014:11, 2014.
- S. Kern, H. Eichler, J. Stoeve, H. Klüter, and K. Bieback. Comparative analysis of mesenchymal stem cells
 from bone marrow, umbilical cord blood, or adipose tissue. *Stem Cells*, 24, 2006.
- A. Khandagade, V. Kale, and R. Sinha. Critical quality risk analysis of process parameters of fluid bed
 coating technology. Int J Ind Eng Techn, 3:10, 2013.
- H. J. Kim and J.-S. Park. Usage of human mesenchymal stem cells in cell-based therapy: advantages and
 disadvantages. Dev Reprod, (1):1–10, 2017.
- J. Kim, J. W. Kang, J. H. Park, Y. Choi, K. S. Choi, K. D. Park, D. H. Baek, S. K. Seong, H.-K. Min, and
 H. S. Kim. Biological characterization of long-term cultured human mesenchymal stem cells. *Arch Pharm Res*, 32:117–126, 2009.
- D. Kletsas, H. Pratsinis, G. Mariatos, P. Zacharatos, and V. G. Gorgoulis. The proinflammatory phenotype of senescent cells: the p53-mediated ICAM-1 expression. *Ann NY Acad Sci*, 1019:330–332, 2004.

- C. M. Kong, H. D. Lin, A. Biswas, A. Bongso, and C.-Y. Fong. Manufacturing of human wharton's jelly
 stem cells for clinical use: selection of serum is important. *Cytotherapy*, 21:483–495, 2019.
- N. Kotobuki, M. Hirose, Y. Takakura, and H. Ohgushi. Cultured autologous human cells for hard tissue
 regeneration: preparation and characterization of mesenchymal stem cells from bone marrow. Artif Organs,
 28:33–39, 2004.
- J. D. Kretlow, Y.-Q. Jin, W. Liu, W. Zhang, T.-H. Hong, G. Zhou, L. S. Baggett, A. G. Mikos, and Y. Cao.
 Donor age and cell passage affects differentiation potential of murine bone marrow-derived stem cells.
 BMC Cell Biol, 9:60, 2008.
- A. Krtolica and J. Campisi. Integrating epithelial cancer, aging stroma and cellular senescence. Adv Gerontol,
 11:109–116, 2003.
- S. A. Kuznetsov, M. H. Mankani, and P. G. Robey. Effect of serum on human bone marrow stromal cells:
 ex vivo expansion and in vivo bone formation. *Transplantation*, 70:1780–1787, 2000.
- C. Lange, F. Cakiroglu, A.-N. Spiess, H. Cappallo-Obermann, J. Dierlamm, and A. R. Zander. Accelerated
 and safe expansion of human mesenchymal stromal cells in animal serum-free medium for transplantation
 and regenerative medicine. J Cell Physiol, 213:18–26, 2007.
- B. L. Larson, J. Ylöstalo, and D. J. Prockop. Human multipotent stromal cells undergo sharp transition
 from division to development in culture. *Stem Cells*, 26:193–201, 2008.
- D. P. Lennon, S. E. Haynesworth, D. M. Arm, M. A. Baber, and A. I. Caplan. Dilution of human mesenchymal
 stem cells with dermal fibroblasts and the effects on in vitro and in vivo osteochondrogenesis. *Dev Dynam*,
 219:50–62, 2000.
- T.-S. Li and E. Marbán. Physiological levels of reactive oxygen species are required to maintain genomic stability in stem cells. *Stem Cells*, 28:1178–1185, 2010.
- W. Li, G. Ren, Y. Huang, J. Su, Y. Han, J. Li, X. Chen, K. Cao, Q. Chen, P. Shou, L. Zhang, Z.-R. Yuan,
 A. I. Roberts, S. Shi, A. D. Le, and Y. Shi. Mesenchymal stem cells: a double-edged sword in regulating
 immune responses. *Cell Death Differ*, 19:1505–1513, 2012.
- Y. Y. Lipsitz, N. E. Timmins, and P. W. Zandstra. Quality cell therapy manufacturing by design. Nat
 Biotechnol, 34:393–400, 2016.
- T. Margossian, L. Reppel, N. Makdissy, J.-F. Stoltz, D. Bensoussan, and C. Huselstein. Mesenchymal stem
 cells derived from wharton's jelly: comparative phenotype analysis between tissue and in vitro expansion.
 Bio-Med Mater Eng, 22:243–254, 2012.
- C. Martin, É. Olmos, M.-L. Collignon, N. De Isla, F. Blanchard, I. Chevalot, A. Marc, and E. Guedon.
 Revisiting MSC expansion from critical quality attributes to critical culture process parameters. *Process Biochem*, 59:231–243, 2017.
- M. Mendicino, A. M. Bailey, K. Wonnacott, R. K. Puri, and S. R. Bauer. MSC-based product characterization
 for clinical trials: an FDA perspective. *Cell Stem Cell*, 14:141–145, 2014.
- 479 O.-W. Merten. Advances in cell culture: anchorage dependence. Philos T R Soc B, 370(1661):20140040, 480 2015.
- S. M. Metcalfe. Mesenchymal stem cells and management of COVID-19 pneumonia. Med Drug Disc, 5:3,
 2020.
- P. Meunier, J. Aaron, C. Edouard, and G. Vignon. Osteoporosis and the replacement of cell populations
 of the marrow by adipose tissue. a quantitative study of 84 iliac bone biopsies. *Clin Orthop Relat R*, 80:
 147–154, 1971.
- S. T. Mindaye, M. Ra, J. L. Lo Surdo, S. R. Bauer, and M. A. Alterman. Global proteomic signature of
 undifferentiated human bone marrow stromal cells: Evidence for donor-to-donor proteome heterogeneity.
 Stem Cell Res, 11:793-805, 2013.
- ⁴⁸⁹ M. Mitchell. Determining criticality—process parameters and quality attributes part II; design of experiments ⁴⁹⁰ and data-driven criticality. *BioPharm International*, 2014:9, 2014.

- G. Moll, N. Drzeniek, J. Kamhieh-Milz, S. Geissler, H.-D. Volk, and P. Reinke. MSC therapies for COVID importance of patient coagulopathy, thromboprophylaxis, cell product quality and mode of delivery
 for treatment safety and efficacy. *Front in Immunol*, 11:1091, 2020.
- A. Nasef, N. Mathieu, A. Chapel, J. Frick, S. Fran??ois, C. Mazurier, A. Boutarfa, S. Bouchet, N.-C.
 Gorin, D. Thierry, and L. Fouillard. Immunosuppressive effects of mesenchymal stem cells: involvement
 of HLA-G. *Transplantation*, 84:231–237, 2007.
- A. J. Nauta and W. E. Fibbe. Immunomodulatory properties of mesenchymal stromal cells. *Blood*, 110:
 3499–3506, 2007.
- A. Noer, A. C. Boquest, and P. Collas. Dynamics of adipogenic promoter DNA methylation during clonal
 culture of human adipose stem cells to senescence. *BMC Cell Biol*, 8:18, 2007.
- M. J. Oedayrajsingh-Varma, S. M. van Ham, M. Knippenberg, M. N. Helder, J. Klein-Nulend, T. E. Schouten,
 M. J. P. F. Ritt, and F. J. van Milligen. Adipose tissue-derived mesenchymal stem cell yield and growth
 characteristics are affected by the tissue-harvesting procedure. *Cytotherapy*, 8:166–177, 2006.
- B. Parekkadan and J. M. Milwid. Mesenchymal stem cells as therapeutics. Annu Rev Biomed Eng, 12:
 87–117, 2010.
- 506 M. F. Pera, B. Reubinoff, and A. Trounson. Human embryonic stem cells. J Cell Sci, 113:5–10, 2000.
- D. G. Phinney. Functional heterogeneity of mesenchymal stem cells: implications for cell therapy. J Cell Biochem, 113:2806-2812, 2012.
- D. G. Phinney, G. Kopen, W. Righter, S. Webster, N. Tremain, and D. J. Prockop. Donor variation in the
 growth properties and osteogenic potential of human marrow stromal cells. *J Cell Biochem*, 75:424–436,
 1999.
- L. Pierdomenico. Diabetes mellitus during pregnancy interferes with the biological characteristics of wharton's jelly mesenchymal stem cells. Open Tissue Eng Regen Med J, 4:103–111, 2011.
- Planat-Benard V., Menard C., André M., Puceat M., Perez A., Garcia-Verdugo J.-M., Pénicaud L., and
 Casteilla L. Spontaneous cardiomyocyte differentiation from adipose tissue stroma cells. *Circ Res*, 94:
 223–229, 2004.
- I. Pountos, D. Corscadden, P. Emery, and P. V. Giannoudis. Mesenchymal stem cell tissue engineering:
 techniques for isolation, expansion and application. *Injury*, 38:S23–S33, 2007.
- W. R. Prather, A. Toren, M. Meiron, R. Ofir, C. Tschope, and E. M. Horwitz. The role of placental-derived
 adherent stromal cell (PLX-PAD) in the treatment of critical limb ischemia. *Cytotherapy*, 11(4):427–434,
 2009.
- A. S. Rathore. Roadmap for implementation of quality by design (QbD) for biotechnology products. Trends
 Biotechnol, 27:546-553, 2009.
- A. S. Rathore and H. Winkle. Quality by design for biopharmaceuticals. Nat Biotechnol, 27:9, 2009.
- Rauscher Frederick M., Goldschmidt-Clermont Pascal J., Davis Bryce H., Wang Tao, Gregg David, Ra maswami Priya, Pippen Anne M., Annex Brian H., Dong Chunming, and Taylor Doris A. Aging, progen itor cell exhaustion, and atherosclerosis. *Circulation*, 108:457–463, 2003.
- ⁵²⁸ W. J. C. Rombouts and R. E. Ploemacher. Primary murine MSC show highly efficient homing to the bone ⁵²⁹ marrow but lose homing ability following culture. *Leukemia*, 17:160–170, 2003.
- J. A. Rowley. Peak MSC—are we there yet? Front Med, 5:14, 2018.
- K. Schallmoser, C. Bartmann, E. Rohde, A. Reinisch, K. Kashofer, E. Stadelmeyer, C. Drexler, G. Lanzer,
 W. Linkesch, and D. Strunk. Human platelet lysate can replace fetal bovine serum for clinical-scale
 expansion of functional mesenchymal stromal cells. *Transfusion*, 47:1436–1446, 2007.
- K. Schallmoser, C. Bartmann, E. Rohde, S. Bork, C. Guelly, A. C. Obenauf, A. Reinisch, P. Horn, A. D. Ho,
 D. Strunk, and W. Wagner. Replicative senescence-associated gene expression changes in mesenchymal
- stromal cells are similar under different culture conditions. *Haematologica*, 95:867–874, 2010.

- R. Seely and J. Haury. Applications of failure modes and effects analysis to biotechnology manufacturing
 processes. In *Process validation in manufacturing of biopharmaceuticals*, chapter 2. Addison-Wesley, Boca
 Raton, FL, 2005.
- I. Sekiya, B. L. Larson, J. R. Smith, R. Pochampally, J.-G. Cui, and D. J. Prockop. Expansion of human adult stem cells from bone marrow stroma: conditions that maximize the yields of early progenitors and evaluate their quality. *Stem Cells*, 20:530–541, 2002.
- P. K. Sellappan N. Modified prioritization methodology for risk priority number in failure mode and effects
 analysis. Int J Appl Sci Tech, 3:11, 2013.
- 545 S. Sethe, A. Scutt, and A. Stolzing. Aging of mesenchymal stem cells. Ageing Res Rev, 5:91–116, 2006.
- R. R. Sharma, K. Pollock, A. Hubel, and D. McKenna. Mesenchymal stem or stromal cells: a review of
 clinical applications and manufacturing practices. *Transfusion*, 54:1418–1437, 2014.
- S. Shi, S. Gronthos, S. Chen, A. Reddi, C. M. Counter, P. G. Robey, and C.-Y. Wang. Bone formation by
 human postnatal bone marrow stromal stem cells is enhanced by telomerase expression. *Nat Biotechnol*,
 20:587–591, 2002.
- P. J. Simmons and B. Torok-Storb. Identification of stromal cell precursors in human bone marrow by a novel monoclonal antibody, STRO-1. *Blood*, 78:55–62, 1991.
- P. A. Sotiropoulou, S. A. Perez, A. D. Gritzapis, C. N. Baxevanis, and M. Papamichail. Interactions between
 human mesenchymal stem cells and natural killer cells. *Stem Cells*, 24:74–85, 2006a.
- P. A. Sotiropoulou, S. A. Perez, M. Salagianni, C. N. Baxevanis, and M. Papamichail. Characterization of
 the optimal culture conditions for clinical scale production of human mesenchymal stem cells. *Stem Cells*,
 24:462–471, 2006b.
- E. Spaeth, A. Klopp, J. Dembinski, M. Andreeff, and F. Marini. Inflammation and tumor microenvironments:
 defining the migratory itinerary of mesenchymal stem cells. *Gene Ther*, 15:730–738, 2008.
- G. M. Spaggiari, A. Capobianco, S. Becchetti, M. C. Mingari, and L. Moretta. Mesenchymal stem cell natural killer cell interactions: evidence that activated NK cells are capable of killing MSCs, whereas
 MSCs can inhibit IL-2-induced NK-cell proliferation. *Blood*, 107:1484–1490, 2006.
- S. A. Steigman, M. Armant, L. Bayer, G. S. Kao, L. Silberstein, J. Ritz, and D. O. Fauza. Preclinical
 regulatory validation of a 3-stage amniotic mesenchymal stem cell manufacturing protocol. *J Pediat Surg*,
 43:1164–1169, 2008.
- K. Stenderup, J. Justesen, E. F. Eriksen, S. I. S. Rattan, and M. Kassem. Number and proliferative capacity
 of osteogenic stem cells are maintained during aging and in patients with osteoporosis. *J Bone Miner Res*,
 16:1120–1129, 2001.
- A. Stolzing, E. Jones, D. McGonagle, and A. Scutt. Age-related changes in human bone marrow-derived
 mesenchymal stem cells: consequences for cell therapies. *Mech Ageing Dev*, 129:163–173, 2008.
- R. M. T. Ten Ham, J. Hoekman, A. M. Hövels, A. W. Broekmans, H. G. M. Leufkens, and O. H. Klungel.
 Challenges in Advanced Therapy Medicinal Product Development: A Survey among Companies in Europe.
 Mol Ther, 11:121–130, 2018.
- M. Tencerova, M. Frost, F. Figeac, T. K. Nielsen, D. Ali, J.-J. L. Lauterlein, T. L. Andersen, A. K. Haakonsson, A. Rauch, J. S. Madsen, C. Ejersted, K. Højlund, and M. Kassem. Obesity-associated hypermetabolism and accelerated senescence of bone marrow stromal stem cells suggest a potential mechanism for
 bone fragility. *Cell Rep*, 27(7):2050–2062, 2019.
- R. J. Thomas, A. Chandra, Y. Liu, P. C. Hourd, P. P. Conway, and D. J. Williams. Manufacture of a human
 mesenchymal stem cell population using an automated cell culture platform. *Cytotechnology*, 55:31–39,
 2007.
- C. K. Tong, S. Vellasamy, B. Chong Tan, M. Abdullah, S. Vidyadaran, H. Fong Seow, and R. Ramasamy.
 Generation of mesenchymal stem cell from human umbilical cord tissue using a combination enzymatic
 and mechanical disassociation method. *Cell Biol Int*, 35:221–226, 2011.
- A. Trounson and C. McDonald. Stem cell therapies in clinical trials: progress and challenges. *Cell Stem Cell*, 17:11–22, 2015.

- A. Trounson, R. G. Thakar, G. Lomax, and D. Gibbons. Clinical trials for stem cell therapies. BMC Med, 586 9:52, 2011. 587
- C. T. Vangsness, H. Sternberg, and L. Harris. Umbilical cord tissue offers the greatest number of harvestable 588 mesenchymal stem cells for research and clinical application: a literature review of different harvest sites. 589 Arthroscopy, 31:1836–1843, 2015.
- T. Vazin and W. J. Freed. Human embryonic stem cells: derivation, culture, and differentiation: a review. 591 Restor Neurol Neuros, 28:589-603, 2010. 592

590

- R. Vishnubalaji, M. Al-Nbaheen, B. Kadalmani, A. Aldahmash, and T. Ramesh. Comparative investigation 593 of the differentiation capability of bone-marrow- and adipose-derived mesenchymal stem cells by qualitative 594 and quantitative analysis. Cell and Tissue Res, 347:419–427, 2012. 595
- W. Wagner, P. Horn, M. Castoldi, A. Diehlmann, S. Bork, R. Saffrich, V. Benes, J. Blake, S. Pfister, 596 V. Eckstein, and A. D. Ho. Replicative senescence of mesenchymal stem cells: a continuous and organized 597 process. PLoS One, 3:2213, 2008. 598
- W. Wagner, S. Bork, P. Horn, D. Krunic, T. Walenda, A. Diehlmann, V. Benes, J. Blake, F.-X. Huber, 599 V. Eckstein, P. Boukamp, and A. D. Ho. Aging and replicative senescence have related effects on human 600 stem and progenitor cells. PLoS One, 4:5846, 2009. 601
- W. Wagner, S. Bork, G. Lepperdinger, S. Joussen, N. Ma, D. Strunk, and C. Koch. How to track cellular 602 aging of mesenchymal stromal cells? Aging, 2:224–230, 2010. 603
- C. Wan, Q. He, M. McCaigue, D. Marsh, and G. Li. Nonadherent cell population of human marrow culture 604 is a complementary source of mesenchymal stem cells (MSCs). J Orthopaed Res, 24:21–28, 2006. 605
- H.-S. Wang, S.-C. Hung, S.-T. Peng, C.-C. Huang, H.-M. Wei, Y.-J. Guo, Y.-S. Fu, M.-C. Lai, and C.-606 C. Chen. Mesenchymal stem cells in the wharton's jelly of the human umbilical cord. Stem Cells, 22: 607 1330-1337, 2004. 608
- T. A. Wyrobnik, A. Ducci, and M. Micheletti. Advances in human mesenchymal stromal cell-based therapies 609 - Towards an integrated biological and engineering approach. Stem Cell Res, 47:101888, 2020. 610
- N. Xiao, H.-Z. Huang, Y. Li, L. He, and T. Jin. Multiple failure modes analysis and weighted risk priority 611 number evaluation in FMEA. Eng Fail Anal, 18:1162–1170, 2011. 612
- H. J. Yang, K.-J. Kim, M. K. Kim, S. J. Lee, Y. H. Ryu, B. F. Seo, D.-Y. Oh, S.-T. Ahn, H. Y. Lee, and 613 J. W. Rhie. The stem cell potential and multipotency of human adipose tissue-derived stem cells vary by 614 cell donor and are different from those of other types of stem cells. Cells Tissues Organs, 199:373–383, 615 2014.616
- L. X. Yu, G. Amidon, M. A. Khan, S. W. Hoag, J. Polli, G. K. Raju, and J. Woodcock. Understanding 617 pharmaceutical quality by design. AAPS J, 16:771–783, 2014. 618
- M. Zaim, S. Karaman, G. Cetin, and S. Isik. Donor age and long-term culture affect differentiation and 619 proliferation of human bone marrow mesenchymal stem cells. Ann Hematol, 91:1175–1186, 2012. 620
- L. Zangi, R. Margalit, S. Reich-Zeliger, E. Bachar-Lustig, A. Beilhack, R. Negrin, and Y. Reisner. Direct 621 imaging of immune rejection and memory induction by allogeneic mesenchymal stromal cells. Stem Cells, 622 27:2865-2874, 2009. 623
- C. Zanini, F. Severina, G. Lando, C. Fanizza, E. Cesana, D. Desidera, and M. Bonifacio. Good design 624 practices for an integrated containment and production system for advanced therapies. Biotechnol Bioeng, 625 117:2319-2330, 2020. 626
- S. Zhou, S. Lechpammer, J. S. Greenberger, and J. Glowacki. Hypoxia inhibition of adipocytogenesis in 627 human bone marrow stromal cells requires transforming growth factor- β /Smad3 signaling. J Biol Chem. 628 280:22688-22696, 2005. 629
- P. A. Zuk, M. Zhu, H. Mizuno, J. Huang, J. W. Futrell, A. J. Katz, P. Benhaim, H. P. Lorenz, and M. H. 630 Hedrick. Multilineage cclls from human adipose tissue: implications for cell-based therapies. Tissue Eng, 631 7:211-228, 2001. 632
- P. A. Zuk, M. Zhu, P. Ashjian, D. A. D. Ugarte, J. I. Huang, H. Mizuno, Z. C. Alfonso, J. K. Fraser, 633 P. Benhaim, and M. H. Hedrick. Human adipose tissue is a source of multipotent stem cells. Mol Biol 634 Cell, 13:17, 2002. 635

636 Author contributions statement

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638 Competing interests

⁶³⁹ The authors declare no competing interests.

640 Figures & Tables



Figure 1: Overview of the Quality By Design process for Mesenchymal Stem Cell manufacturing. Drug product characteristics are described in the quality target product profile according to patient requirements in order to identify critical quality attributes which will be sufficient to guarantee product safety and efficacy. The identification of critical process parameters and their impact on the defined CQA's leads to the definition of the design space within which manufacturing processes can be performed without altering product quality. The definition of a control strategy and ongoing process verifications are then required to monitor the process and detect potential deviations during the process.



Figure 2: Impact of cell extraction and amplification parameters on the Quality Target Product Profile attributes. All parameters in the inner zone have a Risk Priority Number rating below 4 (possible impact on two Critical quality Attributes). All parameters outside the exterior zone have Risk Priority Number ratings above 9 (proven impact on two Critical Quality Attributes).



Figure 3: Impact of process parameters throughout MSC manufacturing. All parameters in the inner zone have a global Risk Priority Number rating below 4 (low criticality). All parameters outside the exterior zone have Risk Priority Number ratings above 9 (high criticality).

Impact	Criteria	Score
Low	No discernable effect on CQA, homogeneous results published in literature	1
Low	No results published in literature	1.1
Medium	Unknown effect on CQA due to heterogeneous results published in literature	2
High	Known effect on CQA, homogeneous results published in literature	3

 Table 1: Impact score used for Risk Priority Number calculations.

 Table 2: Generic Quality Target Product Profile for Mesenchymal Stem Cell therapy.

ICH Q8 recommendation	Undifferentiated cell transplantation	In-vitro differentiation	
Intended use in clinical setting (e.g., route of administration, dosage form, delivery systems)	Allogenic or autologous MSC transplant at the site of injury	Transplantation of differentiated autologous tissues	
Dosage strength(s)	$1\text{-}2\times10^6$ cells/patient kg	N.A. (as necessary for tissue constructs)	
Container closure system	Frozen product for injection	Reconstructed in vitro tissue	
Therapeutic potency and attributes affecting pharmacokinetic characteristics	Immunomodulatory properties through secreted biomolecules and/or cell-cell contact after MSC homing mechanisms	Specific and controlled differentiation; functional <i>in vivo</i> accepted tissue graft	
Drug product quality criteria (e.g., sterility, purity, stability and drug release)	Fully sterile ; absence of external contaminations ; Frozen stability ; high viability after thawing	Sterility ; $In \ vivo \ stability$; low tissue immunogenicity	

QTTP	CQA	In-process parameter	Acceptance criteria	Ref.
Dosage Strength	Final Cell Quantity (Qua.)	Individual step yield	(>85 %)	
		Expansion rate	As high as possible	
		Concentration	As high as possible without aggregation or significantly increasing viscosity	Amer et al. [2017]
	Viability (Via.)	Cell viability	>90 %	Lipsitz et al. [2016], Steigman et al. [2008], Gad [2008], Belotti et al. [2015]
Therapeutic Potency	MSC Identity (Id.) Adherence to plastic Yes		Yes	Dominici et al. [2006]
		Specific positive antigen expression $\ge 95\%$	CD105+, CD73+, CD90+	
		Specific negative antigen expression \leqslant 2%	CD45-, CD34-, CD14- or CD11b-, CD79 α - or CD19-, HLA-DR-	
	Multipotent Differentiation (Dif.)	Osteoblast, Adipocyte and Chondroblast	Yes (in-vitro)	Dominici et al. [2006]
	In Vivo Effect (Viv.)	To be defined for each application	Not Applicable.	Nauta and Fibbe [2007]
		Ex: Inhibition of T-Cell growth in co-cultures		Gad [2008]
Product Quality	Genetic stability (Gen.)	Karyotype	23 Pairs of Chromosomes	
		Human Telomerase Reverse Transcriptase activity (hTERT) / Telomere length	High expression of hTERT	Shi et al. [2002]
		<i>in-vivo</i> tumour formation (in mice)	Absent	Gad [2008]
		Morphology	small, spindle-form	Sethe et al. [2006]
	Purity (Pur.)	Sterility testing for each lot	\leqslant 10 CFU/mL for test organisms	Steigman et al. [2008], Gad [2008]
		Mycoplasma assay for each lot	No detectable Mycoplasma (by PCR)	
		Endotoxin assay for each lot	\leqslant 5.0 EU/mL (Limulus amebocyte lysate LAL)	Gad [2008]
		Cell purity	$\geqslant 70~\%$	Belotti et al. [2015], Lennon et al. [2000]

 Table 3: The definition of Critical Quality Attributes for Mesenchymal Stem Cell therapy based on the defined Quality Target Product Profile.

Table 4: Process parameters during cell extraction and cell expansion and their impact on Critical Quality Attributes. For each parameter, an impact score between 1 and 3 was attributed based on literature and according to Table 1.

		Strength			Potency		Quali	ty
Parameter	Range	Qua.	Via.	Id.	Dif.	Viv.	Gen.	Pur.
Cell Source	BM, UC, AD	3 Kern et al. [2006], De Ugarte et al. [2003]	1 Vishnubalaji et al. [2012]	1 Wang et al. [2004], Kern et al. [2006], Aust et al. [2004], Zaim et al. [2012], Vishnubalaji et al. [2012]	3 Kern et al. [2006], De Ugarte et al. [2003], Zuk et al. [2002], Yang et al. [2014], Bieback et al. [2004], Vishnubalaji et al. [2012]	1.1	2 De Ugarte et al. [2003], Kern et al. [2006]	2 Gronthos [2003], Zuk et al. [2001]
Age	< 10 to > 70	3 Kretlow et al. [2008], Phinney et al. [1999], Dimitriou et al. [2008], Choudhery et al. [2014], Stolzing et al. [2008], Baker et al. [2015], Sethe et al. [2006]	2 Stolzing et al. [2008], Choudhery et al. [2014]	2 Stolzing et al. [2008], Kretlow et al. [2008], Dimitriou et al. [2008], Dimitriou et al. [2008], Baker et al. [2015]	3 Kretlow et al. [2008], Yang et al. [2014], Baxter et al. [2004], Stolzing et al. [2008], Baker et al. [2015], Wagner et al. [2009]	2 Rauscher Frederick M. et al. [2003], Dressler et al. [2005], Bruna et al. [2016] Golpanian et al. [2015]	3 Baxter et al. [2004], Stolzing et al. [2008], Stenderup et al. [2001]	1.1
BMI	< 25, 25-30, > 30	2 Yang et al. [2014], Aust et al. [2004]	1.1	1 Yang et al. [2014]	2 Yang et al. [2014]	1.1	1.1	1.1
Gender	Man, Woman	1 Yang et al. [2014] Phinney et al. [1999]	1.1	1 Yang et al. [2014]	1 Yang et al. [2014]	1.1	1.1	1.1
Extraction	Various protocols	3 Wan et al. [2006], Caterson et al. [2002], Sotiropoulou et al. [2006b], Phinney et al. [1999], Oedayrajsingh-Varma et al. [2006]	1 Wan et al. [2006]	1.1	1 Wan et al. [2006], Caterson et al. [2002]	2 Wan et al. [2006]	1.1	3 Pountos et al. [2007]
Purification	Antigen, MACS, FACS	1.1	1.1	1 Gentry et al. [2007]	1 Simmons and Torok-Storb [1991], Gentry et al. [2007]	1.1	1 Gronthos [2003]	3 Simmons and Torok-Storb [1991], Gronthos [2003], Guo et al. [2006], Gentry et al. [2007]
Cryopreser- vation	Yes, No	1 Kotobuki et al. [2004], Stolzing et al. [2008]	1 Steigman et al. [2008], Kotobuki et al. [2004], François et al. [2012]	1 Kotobuki et al. [2004]	1 Kotobuki et al. [2004]	1.1	1 François et al. [2012]	1.1
Growth medium	Various	3 Sotiropoulou et al. [2006a], Sotiropoulou et al. [2006b]	1 Pera et al. [2000]	1 Sotiropoulou et al. [2006a]	2 Sotiropoulou et al. [2006a], Pera et al. [2000]	3 Sotiropoulou et al. [2006a], Sotiropoulou et al. [2006b]	1.1	1.1
Supplemen- tation type	FBS, HPL (etc.)	3 Kuznetsov et al. [2000], Zuk et al. [2001], Nasef et al. [2007], Bernardo [2010], Lange et al. [2007], Schallmoser et al. [2007], Kong et al. [2019]	2 Kong et al. [2019]	1 Doucet et al. [2005], Bernardo [2010], Lange et al. [2007], Schallmoser et al. [2007], Kong et al. [2019]	2 Caterson et al. [2002], Zuk et al. [2001], Dimitriou et al. [2008], Doucet et al. [2005], Bernardo [2010], Lange et al. [2007], Schallmoser et al. [2007]	3 Kuznetsov et al. [2000], Nasef et al. [2007], Doucet et al. [2005], Bernardo [2010], Abdelrazik et al. [2011], Schallmoser et al. [2007]	1 Bernardo [2010], Lange et al. [2007], Kong et al. [2019]	1 Bernardo [2010]
Plating density	$10^{-1} - 10^5$ MSC's /cm ²	3 Ikebe and Suzuki [2014], Colter et al. [2000], Sekiya et al. [2002]	1.1	1 Sotiropoulou et al. [2006b]	2 Sekiya et al. [2002], Sotiropoulou et al. [2006b]	1 Sotiropoulou et al. [2006b]	1.1	1 Colter et al. [2000]
Adhesion surface	Varied	3 Sotiropoulou et al. [2006b]	1.1	1 Sotiropoulou et al. [2006b]	1 Sotiropoulou et al. [2006b]	1 Sotiropoulou et al. [2006b]	1.1	1.1
Oxygen	2-21% O_2	3 Hung et al. [2012], Estrada et al. [2012], Fehrer et al. [2007]	3 Fehrer et al. [2007]	1.1	3 Hung et al. [2012], Fehrer et al. [2007], Fink et al. [2004], Zhou et al. [2005], Csete [2005]	3 Hung et al. [2012], Fehrer et al. [2007]	3 Hung et al. [2012], Estrada et al. [2012], Fehrer et al. [2007], Li and Marbán [2010]	1.1
Passages	1 - 15	1 Zuk et al. [2001]	1.1	1 Schallmoser et al. [2010]	1 Zuk et al. [2001], Conget and Minguell [1999]	1.1	1 Zuk et al. [2001], Conget and Minguell [1999], Schallmoser et al. [2010]	1.1
Population doublings	up to 50 PD	3	1.1	1 Nasef et al. [2007], Bonab et al. [2006], Kim et al. [2009], Bork et al. [2010]	3 Colter et al. [2000], Sekiya et al. [2002], Bonab et al. [2006], Banfi et al. [2000], Bork et al. [2010]	3 Nasef et al. [2007], Kim et al. [2009], Banfi et al. [2000]	3 Bonab et al. [2006], Baxter et al. [2004], Larson et al. [2008], Wagner et al. [2009], Bork et al. [2010]	1.1