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Grand research challenges for sustainable industrial biotechnology

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Abstract

Future manufacturing will focus on new, improved products, and new, improved production methods. Recent biotechnological and scientific advances, such as CRISPR-Cas and various omics technologies, pave the way to exciting novel biotechnological research, development, and commercialization of new sustainable products. Rigorous mathematical descriptions of microbial cells and consortia thereof will enable deeper biological understanding and lead to powerful *in silico* cellular models. Biological engineering, i.e. model-based design together with synthetic biology, will accelerate the construction of robust and high-performing microorganisms. Using these organisms, and ambitions towards zero-concepts with respect to emissions and excess resources in bioprocess engineering, industrial biotechnology is expected to become highly integrated into sustainable generations of technology systems.

Drivers for renewable industrial biotechnology

Humankind desires new, improved products, and new, improved methods for manufacturing. For production of fuels, chemicals, and materials, replacing fossil feedstocks by renewable resources is crucial to meet United Nations sustainable development goals (<u>www.un.org</u>), such as reducing pollution and reaching agreed climate change targets. Expectations are that biotechnology will play a major role in this, considering that developments in renewable bio-based industrial production have a history of about 50 years with continuously increasing performance on economic,

environmental and social targets, and still major progress to come. Microbial conversion of renewable resources is an inherently compelling and advantageous concept because cell factories are designed for high conversion selectivity and adaptability, and require only a modest infrastructure (Box 1).

Novel research and development in the industrial biotechnology field is enabled due to various scientific and engineering advances. Here we discuss the most promising technologies and approaches from our point of view.

Sustainable production of organic compounds requires a renewable carbon source, and in addition a renewable energy source if the carbon source does not contain sufficient energy. Several generations of biotechnical processes can be distinguished, as summarized in Table 1. The advantages and disadvantages of the early generations are generally known.

Generation	Status	Advantages	Disadvantages	Ref.
1. Sugar/starch fermentation (also triglycerides/glycerol)	About 1000 biorefineries worldwide produce 1G bioethanol	State-of-the-art	Competition with food/feed	
2. Lignocellulosic hydrolysate fermentation (also other waste)	Less than 10 biorefineries worldwide produce 2G bioethanol; other products might follow	Valorization of non- food, waste biomass	Biomass pretreatment and hydrolysis, lignin utilization	[67]
2a. Syngas fermentation	First commercial plant started for ethanol from fossil syngas; not yet from bio-syngas, i.e. gasified biomass	Valorizing gases from steel and cement industry; full use of lignocellulosic biomass, incl. lignin; flexible feedstock (ranging from CO to H ₂ plus CO ₂)	Biomass gasification; Gas/liquid mass transfer	[21, 68] [69]
3. Using microalgae or phototrophic bacteria	Many pilots and demos; commercial for feed production	CO ₂ utilization	2D factories and transport issues upon scale-up	[70]
3a. Macroalgae (off- shore)	Focus on food; Research on other application areas.	CO ₂ utilization	Conversion specificity; Logistics	
4. E-driven fermentation	Conceptual designs	Renewable electricity and CO ₂ and/or waste	Electricity-cell interface	[1]

Table 1. Overview of processes for using renewable resources in industrial biotechnology.

With the rapid and precise microbial strain construction methods and improved modelling of cell behavior in process systems, we can now start working on **fourth generation processes** (see

Glossary). These focus on a combination of renewable carbon inputs with renewable electric power, in particular solar or wind, as electron source [1]. It is envisaged that such power will become the dominant form of energy, especially in urban areas, so geographically distributed biomass can be used more efficiently in a cascading approach providing food, feed and the necessary carbon source for chemicals, while less will be used for energy. Coupling of separate carbon and energy sources can be accomplished either directly or indirectly, as explained below.

The direct route is **electro-fermentation** [2], in which the microorganism employs an electrode as electron source or sink. This can change the thermodynamic feasibility of redox reactions, and in the future, especially when using engineered microorganisms, might allow anaerobic production of a wide range of chemicals. Carbon yield losses and operational costs associated with aerobic production [3] might be avoided. Even products containing elements not sufficiently present in biomass might become accessible via biotechnology, without using fossil sources (Box 2).

The carbon for electro-fermentation might be originating from biomass, or more commonly from CO_2 (then called "microbial electrosynthesis"). A relatively high energy input is required for converting CO_2 into useful products and for obtaining relevant dissolved CO_2 concentrations, however. Development of suitable microorganisms and scalable equipment for electro-fermentation and microbial electrosynthesis are formidable challenges. Direct transfer of electrons to biofilms on electrodes is limited by surface-to-volume restrictions in large-scale applications. This may be ameliorated by using soluble redox mediators [4], or "cable bacteria" that are still poorly understood [5].

Indirect routes for electron uptake involve methods such as converting electric power electrochemically into H_2 from water via electrolysis, or creating CO (or a more suitable electron carrier) from reduction of CO_2 , and using that carrier to support fermentation. Such alternatives may be more practical strategies for achieving high electron transfer rates and density. Hybrids of the generations mentioned in Table 1 are also feasible, and challenging, for example using electrophilic microorganisms taking electrons directly from photovoltaic cells [1]. In the end, flexible manufacturing concepts, using a portfolio of different renewable feedstocks and renewable energies, could well be the winning solution to bring a large suite of additional bio-products to commercialization.

Replacing fossil-based chemicals by bio-based counterparts is attractive in many cases [3] but leads to biological and processing challenges that are treated in later sections. Many novel chemicals can be produced as well [6]. Sometimes a desired metabolic pathway is available [7], but in other cases novel enzymes are required [8]. The lengthy and expensive efforts to develop bio-based chemicals should be justified by the expected revenues in combination with high innovation prominence to prevent putative competitors to enter the field. In case of commodities, lab processes with close to theoretically optimum yields need to be transferred successfully to large volumes for industrial scale production. In case of high value fine chemicals, often very complex intracellular conversions need to be debottlenecked to access products of outstanding functionality that can meet severe quality constraints. Once the cost of the development efforts and manufacturing can be reduced, the number of commercially justifiable targets will become much larger, and thus the bio-based approach will have much greater positive impact on the planet. While most of the efforts entail and most of this article describes *de novo* creation of carbon-based products from virgin carbon sources, novel waste recycling and inorganic applications are worth mentioning briefly as well.

To minimize plastics accumulation in nature, there is currently much interest in biodegradable polymers [9]. An even more sustainable approach is the re-use and recycling of plastics, but this leads to quality degradation and poor competitiveness with *de novo* synthesized material, and thus the vast majority of plastic waste is incinerated, landfilled, or released into the environment [10]. Chemical recycling, which entails (partial) depolymerization, purification, and repolymerization, is gaining traction [11], but also suffers from low added value. The identification of plastic-degrading

microorganisms [12] and enzymes [13] now provides an opportunity for the biotechnological conversion of (mixed) plastic waste into value-added products [14, 15]. In combination with microbial and enzymatic processes for the renewable production of suitable plastic monomers, this would enable the closing of multi-million tonne carbon cycles.

Several inorganic products are also worth mentioning. Silicates with useful properties as nanostructured materials may be obtained from diatoms [16]. Industrial production and application of these materials is challenging, however. Genome editing of diatoms [17], might lead to tailoring the silicate structures in the future. Nanoparticles of metals and metal oxides, such as silver [18] and magnetite [19] can also be produced using microbial approaches.

Challenges in bioprocess engineering

Begin with the end in mind

Bioprocess engineering is the key competence to bring biotech innovations to the factories, to take markets positions and capture opportunities for societal benefits. An important success factor will be an attitude of all involved researchers to 'begin with the end in mind'. Innovative, efficient large-scale bioprocess designs should be conceived, taking into account three factors [20]:

- 1. The whole bioprocess value chain: the product specifications and downstream purification schemes should be set before defining the upstream sections. Noteworthy, biotechnologically produced drop-in chemicals may come along with by-product impurities that are new to existing chemical routes and infrastructure [21].
- 2. The time perspective: start in the future, assuming what feedstock and product-market combinations will be in place and then work backward to today, including price targets and estimated annual market volumes.
- 3. The scale of operation: the industrial operation sets the boundaries for all lab-scale research and development, and not vice versa. In this way, an ideal process is defined taking constraints from anticipated manufacturing into account. The consequence is that a microorganism should be selected or constructed that best fits the process, and not that the process should be designed based on existing organism properties.

To arrive at solutions that are environmentally, socially and economically advantaged, a full sustainability analysis should be performed, ex-ante, during the design approach [22].

Ambitions are increasing

When considering such an ideal bioprocess, aspirations (not all achievable to the same degree in parallel) should be:

- Zero carbon spills: develop resource-conversion-product combinations that minimize CO₂ and other byproduct formation. Examples include cell retention (also by using biofilms) to minimize cell growth, full product recovery, valorization of any byproduct, and metabolic engineering to optimize biosynthetic pathways.
- Zero energy spills: develop approaches that eliminate the need for energy-intensive aseptic methods and product recovery methods; consider extremophiles [23] or xenobiotic nutrients [24] for nonsterile fermentation, and aim at water-insoluble products (gaseous, oily, or solid).
- Zero water spills: minimize introduction of water with the feed streams, using hosts that tolerate high substrate and product concentrations. Apply water recycle solutions.
- Zero pH swings: minimize need for introducing pH-controlling agents; consider acidophilic/alkaliphilic production hosts for production of acids/bases.
- Zero O₂ fermentation: use anaerobic conversions, for the highest efficiency from feedstock to product [3].

- Zero N₂ fermentation: if O₂ is unavoidable, consider using pure O₂ rather than air [25] to enable intensification, while keeping dissolved O₂ at nontoxic concentrations.
- Zero process variability: minimize variability in processes across the duration of a fermentation and between fermentations, to simplify manufacturing operations; optimal process conditions are maintained over a long production period using robust, continuous processes at steady state.
- Zero development time: minimize R&D costs; the process should be developed quickly, at low costs, and scaled-up without losses or failures.

Industry does not yet meet these bioprocess ambitions (Box 3). The challenges for biological engineering directly follow from these ambitions (see next section). In addition, these ambitions inspire development of highly improved process development tools, incorporating known process systems engineering tools [26, 27] including better and standardized open-source process simulation tools and databases. Optimized industrial bioreactors should be designed to operate near the techno-economical limits of mass and energy transfer [20]. **Computational fluid dynamics** (CFD) should be integrated with cellular kinetic models (computational reaction dynamics, CRD) and agent-based modelling, for improving the design of scale-down simulators and microorganisms [28].

Challenges in biological engineering

In order to achieve the goals set for bioprocess engineering, advanced tools for strain engineering and optimization will be required. These will include genetic engineering objectives like integration of genes encoding high-activity and high-specificity enzymes needed for product biosynthesis, reprogramming of central carbon metabolism reactions [29], and also modulation of cellular flux partitioning and regulation in response to extracellular conditions. These modifications are summarized using the terms **biological engineering** and **metabolic engineering**, i.e. the best possible design of a production organism. We might coin such organisms *fermenterphiles*. Recent technical and scientific advances provide opportunities for exciting novel research and development to improve biological engineering:

- <u>Automated strain construction using novel genome editing tools</u> (e.g., **CRISPR/Cas** [30]), leading to revolutionary acceleration of genetic engineering and rapid strain development [31, 32].
- <u>Improved strain robustness</u>, both towards rapid fluctuations in the environment of large bioreactors and towards high concentrations of (toxic) products. Diverse host systems and extended genetic resources (e.g., environmental screening [33, 34] and new culture technologies [35]) will accelerate such developments.
- <u>Improved model based predictions</u> from increased understanding of microbial cells and consortia thereof [36]. This includes the application of generic correlation models (like artificial intelligence algorithms and machine learning) that can lead to fast workflows to predict improved strains.
- <u>Rapidly increasing ease and speed of identifying new genes</u> that encode new enzymes that catalyze desired or interesting reactions. This includes whole genome sequencing, annotation, documentation, and gene (function) discovery [37, 38].

CRISPR/Cas was developed about a decade ago and is currently the simplest and most versatile method for chromosomal genetic modifications [39] provided that cells possess necessary recombineering properties to repair DNA breaks in the desired manner. This technique is now available for routine application in a wide variety of organisms, enabling the rapid development of engineered organisms. Together with systems biotechnology for strain analysis [40], predictive modelling and bioprocess technology for the (downstream) process design, this will allow for rapid and more precise development of ideal, sustainable production systems fine-tuned for high

performance in large-scale bioreactors. These interdisciplinary technologies promise to drastically reduce the development time as well as reduce the required development resources. The genetic engineering tools, in conjunction with ultra-high-throughput screening [41] and computational assistance by the growing possibilities in artificial intelligence and machine learning [42], will further accelerate and standardize integrated strain and bioprocess development.

Using microbial monocultures is state-of-the-art in industrial production processes. Applications of mixed cultures are rather restricted to fields such as food production, wastewater treatment and biogas formation. However, in their native habitats most microorganisms are typically growing in consortia. As such they react to external stress conditions via concerted interactions, thereby producing highly attractive compounds of commercial interest such as nutraceuticals and pharmaceuticals (e.g. antibiotics) [43, 44]. Because of the current dominating focus on monocultures, the production potential of microbial consortia is by far not yet adequately exploited, or not even known [43, 45]. However, there are a multitude of interesting compounds still waiting to be discovered and to be used for the benefit of mankind [46].

Challenges in biological understanding

The ambition of design-based biological engineering will rely on more quantitative analysis, modeling and understanding of biological networks. Current approaches, using genomics and synthetic biology tools, are applied to redesign model organisms [47, 48]. Most successful were approaches that include laboratory evolution or exploitation of natural diversity and reverse engineering of relevant characteristics, based on genome sequences and genome-wide expression analysis [49]. Nevertheless, current approaches are far from design-based, i.e. several rounds of designs or evolution are needed to obtain a required function. In other engineering fields, like microchip fabrication, design is fully computer based (*in silico* models) [50]. One reason for the lack of model-based design is the limited knowledge of biological network regulation [51].

Natural environments of microorganisms have exerted evolutionary pressure towards optimization of their metabolism and its regulation toward reproduction/proliferation. For artificial environments like industrial bioreactors, mechanistic knowledge about such processes is limited, hampering (re)engineering of metabolic and genetic regulation towards robust production hosts [52]. It has been shown that typical bioreactor conditions not only induce frequent metabolic and transcriptional changes, but also increase maintenance energy demands [53, 54]. The regulatory program of the stringent response, natively used to strategically adapt cells to environmental changes, was shown to be switched on/off frequently and unnecessarily. Engineered cells with interrupted stringent response signaling are disconnected from environmental changes [55] thus representing a first example of particular strain design for large-scale applications. Furthermore, the example illustrates that short-term stimuli, imposed in poorly mixed bioreactor zones also impact well-mixed zones via the initiation of signaling pathways. Consequently, comprehensive simulations of large-scale microbial performance necessarily should consider not only the metabolic but also the transcriptional and post-transcriptional (regulatory) level to fully predict cellular behavior [56].

The complexity of cellular systems originates from large spatial and temporal scales as well as from yet uncharacterized interactions like allosteric and post-transcriptional regulation. A very fast metabolism, turnover in proteins as well as population heterogeneity [57] are further challenges in the modeling of cellular properties. The next key step to be taken is a model-based integration across the scales of metabolites, cells, and their environment – from the environment, to metabolic signals and genetic regulation, to unravel the regulation of growth, metabolism and gene expression [58]. With such models (thus quantitative understanding) at hand, design of optimal microbial cell factories can be performed *in silico*, comparable to current design processes in electronics, without

long cycles and high throughput of building and testing. Developing these models is highly challenging, and requires novel approaches in computation and more accurate and extensive experimental measurements. While the past decade of -omics technology delivered massive amounts of data, these are not always sufficient for quantitative and predictive approaches. **Systems Biotechnology** has to close this gap. Grand challenges in Systems Biotechnology include:

- Extension of fundamental knowledge for *in vivo* gene and protein functions to obtain more realistic genome-scale models.
- Eukaryotic metabolism (from yeast to human): Compartmentation of metabolism and regulation, interaction between cell-cycle and metabolism, transcriptional and post-transcriptional regulation of enzyme activities, feedback and feedforward loops.
- Interactions between different species in microbial eco-systems, i.e. unraveling food chains and signaling interactions (e.g., for applications in wastewater treatment, gut, human diseases, biofilms).
- Integration of cell-models with the (large-scale) bioreactor environment.
- Understanding of the population behavior based on single cell variation and heterogeneity (genetic as well as non-genetic), including the prediction of evolutionary trajectories in cultivation systems.
- Definition of the stable and robust minimum of cellular metabolic flux and control networks.

Concluding remarks

The ambition to create a fully sustainable and widely applicable industrial biotechnology depends on advances in several fields: Bioprocess engineering, biological engineering as well as fundamental biological understanding (see Figure 1 and Outstanding Questions box). Furthermore, the different fields have to be well connected and integrated, for example by using rigorous mathematical modeling at all levels. Progress in modeling is observed for different levels: (1) hydrodynamics and mixing of large scale-bioreactor in combination with (currently simple) cellular models [57], (2) stoichiometric and kinetic models of metabolism partly including transcription and translation [59], (3) whole cell modeling approaches combining metabolism, signaling and biomass synthesis [58]. An integration of these modeling advancements results in a multi-scale model that cannot be computed yet. Nevertheless, such an integration of large-scale bioreactor models (CFD) with cellular models (CRD) could be in the center of future approaches to enable a predictive, cell, environment, and process based scale-up. Filling the details of cellular models requires systems biotechnology to develop mechanistic or other types of models based on intracellular measurements under dynamic scale-down conditions, allowing for predictive simulations. Analyzing these integrated models gives insights and allows predictions of fruitful avenues of engineering of the microbial host towards the ideal process performance ambitions such as zero spills, zero failures and minimal development time.

Next to the mathematical engineering and design tools, lab-technologies support the development: Automated strain construction, screening and validation. Especially, automated strain construction has been boosted by advances in genetic engineering approaches [60] as well as reliable DNA synthesis [61] together with improved liquid handling robots [62]. Artificial intelligence (or machine learning) can assist in the process of big data analysis and interpretation [63].



Figure 1. Transformation of available substrates (renewable resources) into desired products by industrial biotechnology requires three applied levels that build upon fundamental knowledge. This is shown symbolically by a three-level bridge. Its strength and capacity are governed by the quality of individual bricks as well as their quantity and positioning.

Outstanding Questions Box

- How to establish rigorous and predictive mathematical descriptions of biological systems?
- How to use such descriptions for designing industrial production systems (i.e., integrated strain and bioprocess)?
- How to prioritize the natural resources and the bioproducts for which the bio-based production systems should be designed?
- How to perform and optimize the engineering to obtain the desired host organisms and production processes, with minimum required investment?

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Glossary

Biological Engineering: Systematic approaches to obtain the best possible organism(s) for a desired performance.

CRISPR-Cas: Method for removing and adding genes at a desired location in a cell's genome.

Computational fluid dynamics: Numerically simulating systems involving fluid flow.

Electro-fermentation: Fermentation process in which polarized electrodes are employed by microorganisms as either electron sinks or sources.

Fourth generation processes: Electricity-driven biotechnological processes.

Industrial biotechnology: Biotechnology applied to industrial processes.

Metabolic engineering: The practice of optimizing genetic and regulatory processes within cells to increase the cells' production of a certain substance.

Systems Biotechnology: Systems Biology approaches applied to industrial biotechnology, i.e. the quantitative analysis and design of microorganisms using for example quantitative physiology, metabolic flux analysis, and model based data evaluation.

Box 1: Why microbes for conversions of biomass to fuels and chemicals?

- Sustainability demands the use of the most efficient combination of renewable resources of carbon and energy.
- Microbial conversions often occur under ambient conditions with respect to temperature, pressure and pH, so relatively low energy input is required compared to conventional chemical reactions. Theoretical performance limits are dictated by stoichiometry and thermodynamics using renewable resources that pave the way to a circular economy [64].
- Microbes already make a very wide diversity of organic molecules with many beneficial properties, which can be used as drop-in replacements or improved materials.
- Microbes have been and will continue to be reprogrammed to make an even wider diversity of products, at high regio- and enantioselectivity. This avoids tedious protective group chemistry in the conventional routes, such that less conversion operations are needed between renewable resource and product [7].

Thus, multiple consecutive chemical conversion operations can often be replaced by a single, selective conversion step using engineered microorganisms.

Box 2: Nitrogen-containing organic products

Organic products containing N-atoms are currently produced using fossil-intensive NH_3 , manufactured via the Haber-Bosch process which comprises over 1% of the world's energy consumption [65]. About 10% of the NH_3 is directly converted into organic chemical products, by petrochemical processes as well as by 1st generation fermentation processes. The latter use transforms renewable carbon (carbohydrate), but still relies heavily on fossil energy via NH_3 , used as fertilizer for growing crops (accounting for about 90% of the global NH_3 outlet). However, using microorganisms that have been engineered for improved N-fixation from N_2 and harboring an appropriate product pathway, electro-fermentation might provide the necessary metabolic energy for renewable production of N-compounds without involving NH_3 .

Box 3. How close is industry to "zero-concepts"?

The Biosuccinium fermentation technology for succinic acid production can serve as leading example [66]. It uses acidophilic conditions, way below the pK_a of the acid, which minimizes addition of titrants during fermentation and product recovery, resulting in close-to-zero associated waste salt production. However, due to the high proton shuttling across the cell membrane, the fermentation still requires oxygen as electron acceptor to generate enough ATP via glucose dissimilation to CO₂. Hence, zero-oxygen conditions are not yet feasible. However, metabolic engineering has minimized the formation of organic by-products and associated carbon spills, and cell retention further allows near-zero cell growth conditions, with virtually no bleeds of spent biomass. O₂ enriched air can be used, which increases the CO₂ concentration in the process such that no additional CO₂ supply is needed. Despite pH values around 3, and the use of minimal media, still aseptic conditions are required to reduce contamination. Further, the total energy consumption remains significant due to downstream water removal, despite the relatively high succinic acid titers (>120 g/L). Summarizing, scale-up from 0.01 to >100 m³ was successful. and a significant stride was made on the zero-factors, but still more advances are needed to achieve the zero-ideal. For other high-performance fermentation processes [7], such as 1,3propanediol (still not anaerobic), farnesene (still downstream processing needed to separate the product from the broth) and gluconic acid (still significant water needs to be evaporated despite titers reported above 500 g/L), similar challenges remain to be solved.