

Chapter IX

Development of Renewable Energy Resources using Biological Resources

As fossil fuels deplete and environmental concerns rise, alternative energy sources must be used. Biomass, a renewable resource, is crucial to energy security and climate change mitigation. This study examines biomass-based renewable energy production, its potential, obstacles, and novel solutions. Anaerobic digestion, gasification, and pyrolysis are evaluated for efficiency and cost. Alternative feedstocks like algae, agricultural waste, and municipal solid waste are also investigated. Policy frameworks, economic incentives, and international cooperation are also important for increasing biomass-based renewable energy installations. The findings show biomass can reduce greenhouse gas emissions by 70-90% and boost global energy demand. Renewable energy reduces climate change and fossil fuel use by replenishing natural resources. Renewable energy comes from biomass-organic matter from plants, animals, and microbes (Perea-Moreno *et al.*, 2019).

Biological Resources is essential for addressing global energy requirements because of its renewable and sustainable characteristics. Biomass serves as a versatile energy source that contributes to the reduction of greenhouse gas emissions, thereby mitigating the effects of climate change. This approach improves energy security through diversification of the energy mix and reduction of dependence on fossil fuels. Biomass contributes to rural development by generating employment opportunities and repurposing waste materials, thereby decreasing landfill waste and fostering a circular economy. Bioenergy provides substantial environmental benefits by reducing greenhouse gas emissions, thereby aiding in the mitigation of climate change. Bioenergy enhances air quality by releasing lower levels of pollutants such as particulate matter, nitrogen oxides, and sulphur oxides in comparison to traditional fossil fuels. Bioenergy enhances water conservation and facilitates efficient waste management through the use of organic waste materials for energy generation. Bioenergy contributes to job creation, stimulates economic growth, and improves energy independence, thereby decreasing reliance on imported fossil

fuels. Bioenergy provides reduced energy costs and enhances national energy security, positioning it as an essential element of the global energy strategy.

The sustainability of bioenergy depends significantly on its carbon balance and associated greenhouse gas (GHG) emissions (Thornley *et al.*, 2017). The carbon balance involves multiple processes: carbon sequestration, where biomass absorbs atmospheric carbon dioxide (CO₂) during growth, and carbon storage, which retains carbon in soil, vegetation, or derived products. However, carbon emissions occur during bioenergy production and combustion. The net carbon balance is determined by the difference between carbon sequestration and emissions, influencing bioenergy's overall environmental impact. GHG emissions during bioenergy processes include CO₂, the primary emission released during biomass combustion. Additionally, methane (CH₄) is emitted during biomass decomposition, production, and transportation, while nitrous oxide arises during biomass cultivation, processing, and combustion.

Fossil fuels have a high energy density; however, their finite reserves and associated geopolitical risks present considerable challenges. These factors also lead to significant greenhouse gas emissions and subject the market to fluctuating prices, frequently affected by subsidies. Furthermore, the production processes of fossil fuels exhibit minimal water consumption. Conversely, while biofuels have a lower energy density, they are renewable and present opportunities for domestic production. These entities are linked to reduced greenhouse gas emissions and frequently enjoy advantageous pricing and tax benefits. Nevertheless, biofuels generally exhibit a moderate level of water consumption in comparison to fossil fuels. In summary, biofuels offer a more sustainable option, although there are certain trade-offs regarding energy density and water usage (Shahi *et al.*, 2021). The presence of these gases impacts the total carbon footprint, highlighting the need for refined processes to reduce emissions and affirm bioenergy's position as a sustainable, low-carbon substitute for fossil fuels.

Further, Bioenergy, biofuels, and bioproducts from biomass processing meet end-user demand (Lautala *et al.*, 2015). Biomass logistics strategies optimize supply chains for efficiency and cost. Localized supply chains reduce transportation distances and costs, while hub-and-spoke arrangements centralize gathering and distribution. Combining smaller shipments into bigger numbers improves logistics efficiency. Rail and water transport deliver biomass sustainably in large-scale, whereas multimodal transport combines road, rail, and water modes to improve flexibility and lower costs. A resilient and sustainable biomass supply chain requires the strategies.

Types of Biomass Resources

Agricultural residues, forest leftovers, wood-based biomass, industrial organic waste, municipal organic waste, Algal biomass, and aquatic plants are major biomass resources (Sánchez *et al.*, 2019). The advantages and application of biological resources (or biomass) are briefly outlined in Table 9.1

Table 9.1: Advantages and application of biological resources

S.no	Type of Biomass	Examples	Advantages	Applications
1.	Agricultural Residues and Waste	Crop residues (straw, husks, stalks), animal manure, bagasse	<ul style="list-style-type: none"> • Readily available • Reduces waste disposal • Cost-effective 	<ul style="list-style-type: none"> • Biofuels (e.g., bioethanol, biogas) • Organic fertilizers • Power generation
2.	Forestry Residues and Wood-Based Biomass	Logging residues, sawdust, wood chips, bark	<ul style="list-style-type: none"> • Sustainable if managed properly • Carbon-neutral energy source • Abundant in forested regions 	<ul style="list-style-type: none"> • Biomass pellets for heating • Bioenergy production • Wood-based biochar
3.	Industrial and Municipal Organic Waste	Food waste, sewage sludge, paper mill residues	<ul style="list-style-type: none"> • Reduces landfill waste • Prevents methane emissions • Efficient waste utilization 	<ul style="list-style-type: none"> • Biogas production (anaerobic digestion) • Biofertilizer • Composting • Soil conditioning
4.	Algal Biomass and Aquatic Plants	Microalgae, macroalgae (seaweed), water hyacinth	<ul style="list-style-type: none"> • High productivity • Carbon sequestration • Grows in non-arable land 	<ul style="list-style-type: none"> • Biofuels (biodiesel, bioethanol) • Pharmaceuticals and nutraceuticals • Wastewater treatment

Key Processes in Biological Conversion

Biological conversion processes viz., fermentation, anaerobic digestion, aerobic digestion, enzymatic hydrolysis, photosynthesis, and respiration provide notable benefits, including renewable energy production, decreased greenhouse gas emissions, waste reduction, and improved energy independence (Manikandan *et al.*, 2023). Microbes are essential for biomass degradation via multiple pathways. Yeast, bacteria, and mold convert biomass into biofuels such as ethanol and butanol by fermentation. In anaerobic digestion, microbes decompose biomass to generate biogas whereas microbes convert biomass into compost through aerobic digestion. Enzymes play a critical role in biomass conversion such as cellulase hydrolyses cellulose to yield glucose, xylanase acts on xylan to generate xylose, and ligninase facilitates the degradation of lignin into valuable aromatic compounds. The integration of microbial and enzymatic processes facilitates efficient biomass utilization for sustainable energy and material production.

Biological conversion techniques make use of microorganisms, enzymes, and biochemical processes to convert biomass into biofuels, biochemicals, and other valuable products, offering a sustainable alternative to conventional chemical conversion methods (Lee *et al.*, 2019). Anaerobic digestion is a crucial biological process that is divided into four stages: hydrolysis, which involves the breakdown of complex organic matter into simpler compounds; acidogenesis, where sugars are converted into volatile fatty acids; acetogenesis, which transforms fatty acids into acetate; and methanogenesis, the conversion of acetate into biogas, primarily consisting of CH₄ and CO₂. Fermentation processes are essential in bioethanol production, involving the conversion of sugars into ethanol by microorganisms, including yeast and bacteria. Batch fermentation, continuous fermentation, fed-batch fermentation, and simultaneous saccharification and fermentation (SSF) are methods that enhance ethanol yields for industrial applications. Biodiesel production from algae and oil-based biomass is increasingly recognized for its high productivity and sustainability. Species of algae, including *Chlamydomonas*, *Spirulina*, and *Nannochloropsis*, demonstrate significant oil content ranging from 20% to 80% and are typically grown in photobioreactors or open ponds. The techniques of oil extraction, such as solvent extraction and mechanical pressing, yield feedstock for biodiesel synthesis.

Oil-based biomass derived from vegetable oils (such as soybean and canola) and animal fats goes through transesterification, a reaction facilitated by alkalis (NaOH and KOH) or acids (H₂SO₄ and HCl) under controlled conditions to yield biodiesel. Biohydrogen production is recognized as a sustainable and environmentally friendly energy source. This process encompasses several

pathways: dark fermentation, that involves the microbial breakdown of organic matter into hydrogen and carbon dioxide; photo-fermentation, where light drives the conversion of organic matter into hydrogen; bio-photolysis, the splitting of water into hydrogen and oxygen using light energy by microorganisms; and enzymatic hydrolysis, where enzymes facilitate the breakdown of organic matter for hydrogen production. These processes demonstrate efficiency and environmental sustainability, providing an alternative to fossil fuels (Show *et al.*, 2012). Thermochemical conversion technologies enhance biological processes by converting biomass into biofuels, biochemicals, and bioproducts via thermal and chemical methods (Jha *et al.*, 2022). The collective impact of these innovations enhances renewable energy solutions, mitigates climate change, and decreases reliance on fossil fuels, thereby playing a crucial role in the attainment of global sustainability objectives.

Biochar and bio-oil are significant products obtained from biomass pyrolysis, providing sustainable options for energy production, carbon sequestration, and soil improvement (Brassard *et al.*, 2017). Biochar is a solid material rich in carbon, generated mainly through three processes: slow pyrolysis, fast pyrolysis, and hydrothermal carbonization (HTC). Slow pyrolysis involves exposing biomass to low temperatures and extended residence times, leading to elevated biochar yields. Fast pyrolysis takes place at elevated temperatures and short residence times, resulting in the production of biochar as a byproduct while optimizing liquid bio-oil yields. HTC is a method for converting wet biomass under moderate heat and pressure, resulting in biochar that is appropriate for soil amendment and carbon sequestration.

Bio-oil, a liquid fuel obtained from biomass, is primarily generated via fast pyrolysis, catalytic pyrolysis, and hydrothermal liquefaction (HTL). Fast pyrolysis utilizes elevated temperatures and brief residence times to enhance bio-oil production efficiency. Catalytic pyrolysis improves the quality and stability of bio-oil through the incorporation of catalysts that facilitate favorable chemical interactions, thereby decreasing oxygen content. Hydrothermal liquefaction effectively transforms wet biomass into bio-oil through the application of high pressure and moderate temperatures, eliminating the need for prior drying of the feedstock. Bio-oil is a viable renewable fuel source for energy production and can be upgraded into transportation fuels and chemicals. Biochar and bio-oil production technologies enhance biomass valorization, thereby supporting sustainable energy systems and environmental management.

Factors Influencing Bioenergy Conversion Efficiency

The degree of effectiveness of bioenergy conversion is determined by biomass properties, conversion technologies, and operating conditions, all of which are essential for optimizing output. The properties of biomass significantly influence conversion processes. Moisture content influences energy yield; ash content can lead to fouling in thermochemical processes; and levels of volatile matter and fixed carbon determine combustion efficiency. These parameters are essential for bioconversion. Lignin content affects biochemical conversion because of its resistance to microbial degradation, and particle size influences heat and mass transfer rates in reactors. Conversion technology is essential for improving bioenergy production. Reactor design, catalyst type, and catalyst quality significantly affect reaction efficiency and product yield. Enzyme activity in biochemical pathways regulates the rate of biomass degradation. Additionally, it is essential to optimize temperature, pressure, and residence time to enhance thermal and biochemical conversion results.

Operating conditions, including feedstock preparation and distribution, particle size, and flow rate, directly affect process efficiency. Parameters specific to the reaction, such as reaction time, pH, ionic strength, and oxygen levels, require stringent control to achieve optimal conversion rates. Microbial efficacy in bioconversion is primarily influenced by the type and diversity of microorganisms employed. A diverse microbial community enhances substrate utilization, and enzyme production capabilities are essential for the efficient breakdown of biomass components. Nutrient uptake efficiency and inhibitor tolerance are critical for microbial functionality under adverse conditions. Microorganisms must exhibit temperature tolerance to sustain activity across diverse operating ranges. Lee *et al.* (2019) divulged that the collective optimization of these factors enhances bioenergy conversion efficiency, resulting in increased yields, lower process costs, and improved sustainability in bioenergy production systems.

Methods for Enhancing Biomass Breakdown

The biomass generally breakdown using numerous pretreatment methods including physical, chemical, thermal and biological methods depicted in Fig 9.1 via flow chart (Vyas *et al.*, 2018).

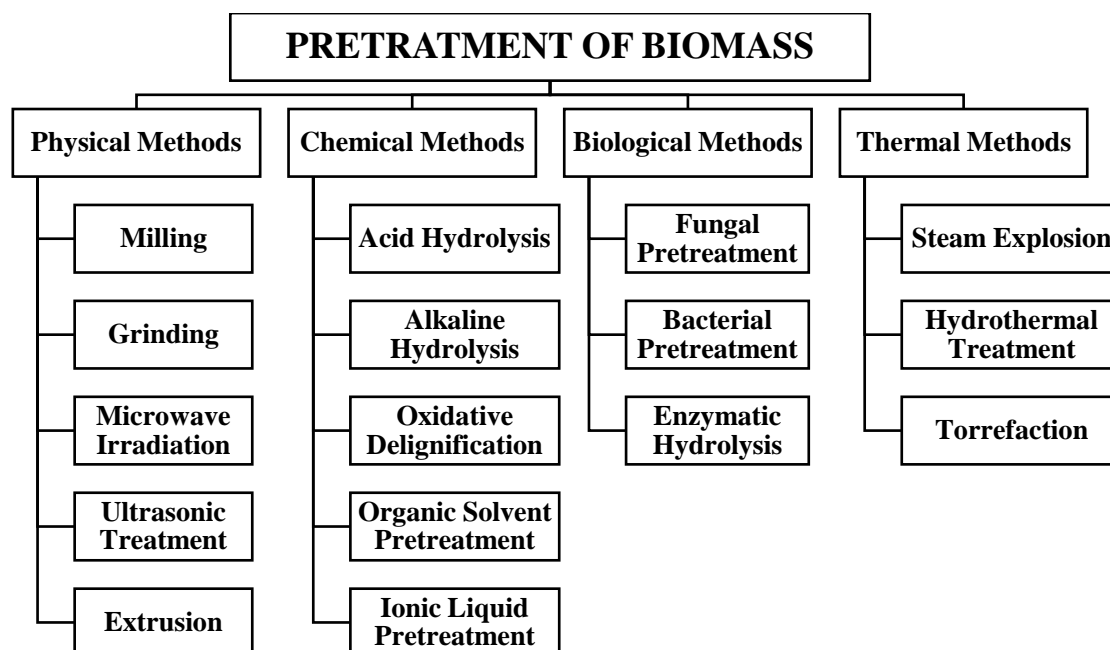


Figure 9.1: Methods for enhancing biomass breakdown

Recent Advancements in microbial and Enzymatic Technologies for Bioenergy

Recent advancements in microbial and enzymatic technologies are significantly improving the efficiency, yield, and sustainability of bioenergy production. Microbial techniques leverage biotechnological innovations to improve biofuel production methods. Methods such as genetic engineering and metabolic engineering focus on altering microbial strains and metabolic pathways to improve the yield and quality of biofuels. The engineering of innovative microbial pathways is facilitated by synthetic biology, while the development of microbial consortia promotes synergistic interactions among diverse microbial species to enhance production outcomes. Directed evolution is utilized to improve microbes for increased tolerance and efficiency in biofuel production (Yadav *et al.*, 2017). Innovations in enzymatic processes focus on boosting the catalytic efficiency of enzymes to achieve better biomass conversion. Enhancing enzyme activity, stability, and specificity is the focus of enzyme engineering, while enzyme discovery is centered on identifying novel enzymes to boost biofuel production. Techniques for enzyme immobilization significantly improve the stability and reusability of enzymes in various industrial applications. The development of enzyme cocktails combines multiple enzymes to improve biomass degradation, while computational enzyme design tailors enzymes for specific biofuel applications, thus boosting overall process efficiency and cost-effectiveness. The recent advancements greatly improve bioenergy processes, making them more sustainable and economically feasible to meet global energy needs.

Waste Management and Resource Recycling in Bioenergy Production

The management of waste and the recycling of resources are crucial for maintaining the sustainability of bioenergy production. The waste management hierarchy establishes a clear order of actions, beginning with waste reduction, then moving to reuse, recycling, energy recovery, and ultimately, as a final option, disposal. This method focusses on reducing waste production, repurposing materials as inputs or energy sources, and transforming waste into valuable commodities, while also encouraging energy recovery through techniques such as combustion and anaerobic digestion. Resource recycling presents numerous opportunities across various fields: nutrient recycling for fertilizers and soil amendments, energy recycling through heat, power, and biofuels, material recycling through composting and bioplastics, water recycling in wastewater treatment, and carbon recycling via carbon capture and utilization. These strategies strengthen the overall efficiency and sustainability of bioenergy systems, aiding in waste reduction and resource conservation.

Algae-Based Bioenergy Production

Algae-based bioenergy production involves cultivating microalgae and macroalgae for the production of various energy products such as biofuels, biogas, and bioelectricity (Chia *et al.*, 2022). Common microalgae species used for bioenergy production include *Chlamydomonas reinhardtii*, *Spirulina platensis*, and *Nannochloropsis salina*, while macroalgae like *Laminaria digitate* and *Saccharina latissimi* are also employed. Algae cultivation techniques such as Photobioreactors (PBRs), Open Pond Systems, and Integrated Systems are commonly used to grow algae biomass (Bharathiraja *et al.*, 2015). Algal biofuels, including biodiesel, bioethanol, and biogas, are produced through processes like Transesterification, Fermentation, and Anaerobic Digestion (Azeez *et al.*, 2020). In Transesterification, algal oil reacts with methanol or ethanol to produce biodiesel (i.e., FAME, fatty acid methyl esters or FAEE, fatty acid ethyl esters). Fermentation converts carbohydrates in algal biomass into bioethanol using microorganisms, while Anaerobic Digestion generates biogas from algal biomass in the absence of oxygen, with the potential to upgrade biogas to biomethane.

Algae-based bioenergy offers a variety of applications, including the production of transportation fuels, power generation, heat production, animal feed, cosmetics, pharmaceuticals, bioplastics, and biocomposites (Arora *et al.*, 2021). However, there are several limitations to algae-based bioenergy, including high production costs, substantial land and water requirements, energy input for cultivation and processing, low biomass productivity, contamination risks, and seasonal variability. Despite these challenges, algae-based bioenergy presents a

promising renewable energy source with the potential to address energy security and climate change while contributing to sustainable development.

Advanced Biomass Conversion Technologies

Advanced biomass conversion technologies involve innovative processes aimed at improving the efficiency, sustainability, and economic viability of converting biomass into various energy products, chemicals, and materials (Siwal *et al.*, 2022). Integrated biorefineries, incorporating diverse conversion technologies, are essential to these initiatives, enabling the production of biofuels, biochemicals, and bioproducts (Clauser *et al.*, 2021). Strategies that involve multiple products, such as biofuel-biochemical platforms, bioenergy-biochemical platforms, and integrated forestry and algal biorefineries, greatly enhance the value derived from biomass. Advancements in these field are significantly shaped by genetic engineering, which seeks to improve biomass yield, reduce lignin content, increase enzyme activity, and develop crops capable of enduring drought conditions (Ribeiro *et al.*, 2019). Key approaches in genetic engineering, gene stacking, synthetic biology, and genome-scale modifications (Verpoorte *et al.*, 2000) upsurge advanced biomass conversion technologies. Artificial intelligence (AI) and machine learning (ML) are transforming bioenergy by improving biomass production and conversion processes. The use of artificial intelligence in bioenergy includes predictive modelling, process optimization, fault detection, supply chain management, and life cycle assessments. Techniques such as neural networks, decision trees, and deep learning are employed to predict biofuel yields, improve conditions, and analyze biomass compositions (Zhao *et al.*, 2022).

Advancements in bioenergy are poised to revolutionize the field, propelled by cutting-edge technologies like artificial photosynthesis, microbial electrosynthesis, and bio-electrochemical systems (Reid *et al.*, 2020). Moreover, utilizing non-traditional feedstocks such as marine biomass, urban waste, agricultural residues, and microbial biomass offers promising prospects for the generation of sustainable bioenergy (Anekwe *et al.*, 2022; Ahorsu *et al.*, 2018). The aim of these technological advancements is to enhance the efficiency, scalability, and overall sustainability of biofuel production in the bioenergy sector.

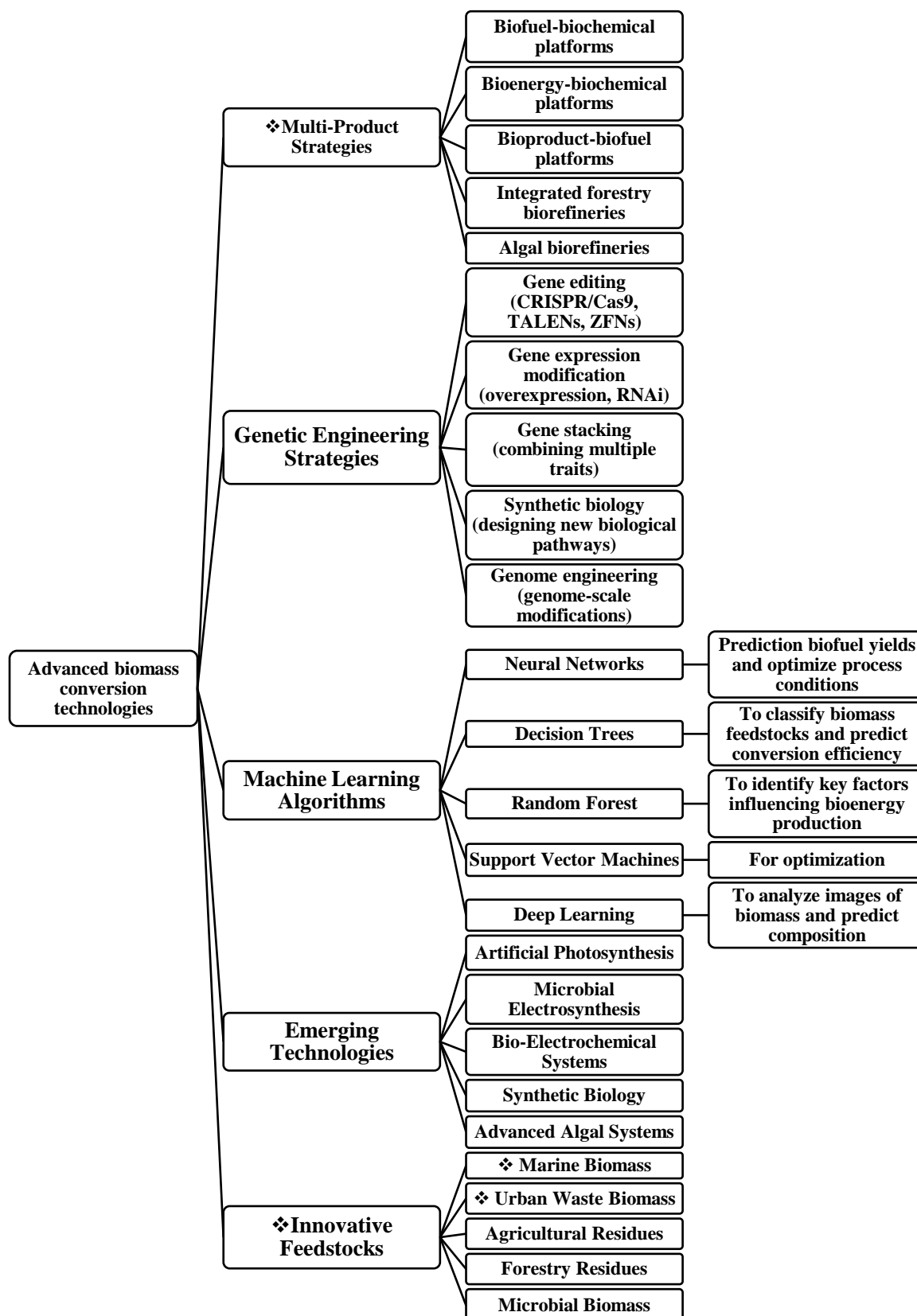


Figure 9.2: Advanced biomass conversion technologies

Conclusion

The adoption of renewable energy derived from biological resources or biomass presents a significant opportunity for achieving a low-carbon, sustainable future. With the global shift from fossil fuels, clean energy sources are essential for addressing climate change, securing energy supply, and fostering economic development. Integrating renewable energy and biomass into current energy infrastructure is essential for enhancing deployment efforts. Creating sustainable supply chains and logistics, enhancing conversion efficiency, and minimizing costs are crucial as well. Furthermore, investigating novel uses for biomass, including bio-based chemicals, can significantly amplify its potential. While there are advantages, obstacles remain to be addressed. Adopting renewable energy and biomass necessitates a collaborative effort. Collaborative efforts can lead to the reduction of climate change impacts, enhance energy security, and foster economic growth. Renewable energy and biomass play essential roles in achieving a sustainable future, and their immense potential can be unlocked through dedicated collaboration.

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