

Article

A Reaction Database for Small Molecule Pharmaceutical Processes Integrated with Process Information

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Abstract: This article describes the development of a reaction database with the objective to collect data for multiphase reactions involved in small molecule pharmaceutical processes with a search engine to retrieve necessary data in investigations of reaction-separation schemes, such as the role of organic solvents in reaction performance improvement. The focus of this reaction database is to provide a data rich environment with process information available to assist during the early stage synthesis of pharmaceutical products. The database is structured in terms of reaction classification of reaction types; compounds participating in the reaction; use of organic solvents and their function; information for single step and multistep reactions; target products; reaction conditions and reaction data. Information for reactor scale-up together with information for the separation and other relevant information for each reaction and reference are also available in the database. Additionally, the retrieved information obtained from the database can be evaluated in terms of sustainability using well-known “green” metrics published in the scientific literature. The application of the database is illustrated through the synthesis of ibuprofen, for which data on different reaction pathways have been retrieved from the database and compared using “green” chemistry metrics.

Keywords: reaction database; pharmaceutical process engineering; organic solvents; “green” metrics analysis

1. Introduction

Organic chemistry has an important role to play in the development of synthetic routes for new drugs during early stage process development. To pursue synthesis at a high level, access to chemical information is needed, which can be provided by using knowledge databases, experience, literature review and/or computer-aided tools [1,2]. The retrieved data is used for similarity search, reaction data retrieval, synthesis route planning, drug discovery-development and prediction of physicochemical properties [3]. The development of methods, algorithms and tools to systematize data collection, retrieval of chemical information-data, and to assist the solution approach to many problems related to the synthesis of molecules in organic chemistry has been developed since the 1970s. The methods and tools for reaction synthesis are based on retrieving chemical information organized in chemical reaction databases where data for individual reactions and structural information for different components involved in the reaction are stored.

Computer-aided tools have been developed to solve problems related to “synthesis” and “retrosynthesis.” The focus of these tools is to generate a number of possible chemical synthesis paths for possible precursors (synthesis tree) to achieve the synthesis of a given target compound.

In retrosynthesis, the process of generating the possible pathways starts from the given target compound and, by going backwards, the reactions necessary to synthesize the target compound are identified. In addition, the reactions to produce the reactants of identified reactions are generated. The process is repeated until commercially available reactants are identified. These approaches are based on heuristics and logical rules and all of them rely on knowledge databases [4–8]. Recently, computer-aided tools that are based on algorithmic approaches have been developed, such as The Route Designer [9], which automatically extracts rules that capture the essence of the reactions in the chemical reaction database [10]. The tool ICSYNTH utilizes a graph-based approach with available data from the literature to generate the reaction rules [9]. Many other computer-aided methods and tools for reaction synthesis have already been developed with different characteristics. For example, tools to perform combinatorial searches, to screen generated alternatives based on information retrieved from knowledge databases and to perform extensive reaction assessment calculations [11–15].

Searching for reactions and retrieving the relevant information is a complex problem because it involves searching for chemical structures (complete or partial), transformation information (reaction centers), description of the reactions (reaction type, general comments) and numerical data such as experimental reaction data (including conversion, yield, selectivity, reaction conditions etc.). Reaction databases that help to organize, store and retrieve data continue to be developed (Houben-Weyl [16] and Theillheimer [17]), but more recently, the field of reaction databases has evolved further and databases (see Table 1) such as CASREACT [18], ChemReact [17] and REAXYS (previously Beilstein plus Reactions) [19] have been established, while reaction databases such as ChemInform [20] have become well-known.

1.1. General Databases

In these types of database, the information included is focused on organic reactions and synthetic methods in general. The CASREACT reaction database [18] was started in 1840 and since then more than 74.9 million reactions have been added as it is updated daily. The information is related to organic synthesis including organometallics, total synthesis of natural products and biocatalytic (biotransformation) reactions. This database can be used to provide information on different ways to produce the same product (single step or multi-step reactions), used for applications of a particular catalyst and various ways to carry out specific functional group transformations. The REAXYS reaction database [19]—based on data from Elsevier’s industry-leading chemistry databases (CrossFire Beilstein, CrossFire Gmelin and Patent Chemistry Database)—includes data for more than 40.7 million reactions, dating from 1771 to the present. It includes a large number of compounds (organic, inorganic and organometallic) and experimental reaction details (yield, solvents etc.). It is searchable for reactions, substances, formulas, and data such as physico-chemical properties data, spectra. Additionally, the REAXYS database can be used for synthesis route planning. The Current Chemical Reaction (CCR) database [21] includes over one million organic reactions together with reaction diagrams, critical conditions and bibliographic data. The Reference library of synthetic methodology (RefLib) covers reaction data from 1946 to 1992. The database contains information from different sources and the latest version has a comprehensive heterocyclic chemistry database [17].

The ChemReact reaction database [17] is a closed database that covers the period from 1974 to 1998 and includes over 3.5 million reactions. It is searchable by reaction type and provides information for the reaction transformation classified by type of reaction and relevant data (bibliographic, spectra and yield). Chemogenesis is a web-book [22], dealing with chemical reactions and chemical reactivity. It examines the rich science between the periodic table and the established disciplines of inorganic and organic chemistry. The Organic Synthesis database [23], includes more than 6000 organic reactions and is searchable by the reaction type or the structure of the compounds and it provides information for single and multi-step organic reaction together with reaction components, conditions and description. The reaction database-Chemical Synthesis [24] enables the user to find reactions related to reagents or target products and it also provides information with the necessary details of the

reagents. The Synthetic Pages reaction database [25], covers 292 reactions and provides information for the optimized reaction procedure. It is searchable by reaction type and/or the structure of the reagent or the target product. The Chemical Thesaurus reaction database [26] contains 4000 reactions classified as organic, inorganic, organometallic, transition metal and biochemical.

The WebReaction reaction database [27] covers over 400,000 reactions; it can be searched by defining the structure of the reactant and the product and it performs search based on the reaction similarity with focus on reaction center. The Science of Synthesis database (previously Houben-Weyl) [16] covers information for organic and organometallic reactions with detailed experimental procedures, methodology evaluation and discussion of the field. Finally, the SPRESI reaction database [28] contains 4.6 million reactions and it enables searching of structures, references and reactions.

The Synthetic Reaction Updated (previously Methods in Organic Synthesis) lists many organic reactions (in graphical form) and is searchable by reaction type [29].

1.2. Specialized Databases

These databases are specialized in one class of reaction type. The ChemInform reaction database [20] includes more than 2 million reactions, including organic, enzymatic and microbial reactions. The available data can be used for the application of new reagents and also for catalysts as with the preparation of natural and pharmaceutical products. Other aspects that are covered by the ChemInform database include synthetic procedures, enantio- and diastereoselective syntheses and new protection/de-protection procedures. The Biotage Pathfinder reaction database [30] is specialized in the verified methods of microwave synthesis.

The e-EROS (Encyclopedia of Reagents for Organic Synthesis) [31] focuses on the reagents and catalysts used in organic chemistry for synthesis. The FlowReact Search [32] covers a range of over 2000 flow chemistry reactions adapted from publications on pharmaceutical, fine chemical and biotech companies. The Protecting Groups reaction database [33] provides information for protection, de-protection and trans-protection methods, stability, liability, and reaction conditions, and includes up-to-date information. Recently, a reaction library focused on generic reactions (88 reactions, ~20,000 reactants) with high reliability and reasonable yield has been developed by Masek et al. [34]. The objective of this library is to provide information on synthetically feasible design ideas for de novo drug design.

Representing chemical reactions in a structured way is a complex task. The reaction information contained in a database needs to fulfil several criteria and needs to be categorized with respect to their searchable reaction information. The criteria that a reaction database should fulfill are [17]:

- (i) **Each reaction is an individual record in the database (detailed and graphical).** The reaction must be able to be retrieved from the database as a detailed record (reagents, products, stoichiometry etc.). It can also be extracted as a graphical representation where the reaction scheme is shown. In many databases, the reaction is represented in a graphical form.
- (ii) **Structural information for target product as well as substrates.**
- (iii) **Reaction centers.** The reaction center of a reaction is the collection of atoms and bonds that are changed during the reaction [3].
- (iv) **Reaction components must be searchable.** Information for the components involved in the reaction such as reagent, catalysts, solvents etc.
- (v) **Multistep reactions.** In the case of multistep reactions, all reactions (individual and whole pathway) must be searchable.
- (vi) **Reaction conditions.** Conditions such as pH, temperature, pressure etc. should be searchable by exact and a suitable range of values.
- (vii) **Reaction classification.** The type of reaction (i.e., esterification) should be searchable.
- (viii) **Post-processing of the database contents.** Export of the retrieved reaction data in other tools (i.e., MS Excel).

Many reaction databases have been developed over time—some of them have a large number of reactions available and others a smaller number, and some of the databases cover the whole range of the organic and/or inorganic reactions. There are also reaction databases that cover more specialized reactions such as solid reactions, flow reactions etc. It can also be seen that most of the databases cover the most important criteria as defined by Zass [17], such as the need for individual reaction records (criterion i, in Table 1). In Table 1, existing reaction databases are listed and have been classified based on the different presented criteria. The numbers of reactions, as well as online sources, have also been listed.

Table 1. Database review. All the databases have been summarized with respect to the number of reactions and the focus of the database.

Database	Number of Reaction	Criteria [17]	Reference
CASREACT	>74.9 million (1840–present)	i, iv, v, vi	[18]
REAXYS (previously CrossFire Beilstein)	40.7 million (1771–present)	i, ii, iv, vii	[19]
Theilheimer	>72200 (1946–1980)	i, v, vi, vii	[35]
ChemInform RX	>2 million (since 1990–present)	i, iv, vi	[20]
Current chemical reactions	1,083,758 (1840–present)	i, vi	[21]
Methods in organic synthesis	33,000 (1999–2014)	i, vii	[29]
Reference library of synthetic methodology	209,800 (1946–2001)	i	[17]
ChemReact	3.5 million reactions (1974–1998)	i, vii	[17]
Chemogenesis	-	ii, iii	[22]
Organic synthesis	>6000 (1921–present)	i, ii, v, vi, vii	[23]
Reaction Database-Chemical Synthesis	-	i, ii	[24]
Synthetic Pages	292	i, ii, vi, vii	[25]
The chemical thesaurus	4000	i, ii	[26]
WebReactions	>400,000	i, ii, iii	[27]
Biotage Pathfinder (reaction assisted with microwave technology)	>1000	i, vi, vii, viii	[30]
e-EROS Encyclopedia of Reagents for Organic Synthesis	>70,000 (4000 *)	i, ii	[31]
FlowReact Search	>2000	i (reaction in flow)	[32]
Protecting groups	-	i	[33]
Science of Synthesis (previously Houben-Weyl)	240,000 (early 1800s–present)	i, ii, iii	[16]
SPRESI	4.6 million	i, ii, iii	[28]

The main objective of this article is to assist pharmaceutical process development in the early stages of the synthesis route selection and development, by providing enhanced process understanding. To achieve this task, a data-rich environment where knowledge can be collected, stored and retrieved is a requirement. A database that covers reactions taking place in pharmaceutical processes covering information connected to the criteria listed by Zass [17] and additionally covering process information has been developed to create an environment where process knowledge is available. The connection of individual reactions to criteria like scalability, cost, expected yield, and reaction steps, ease of separation, safety and to parameters such as reaction conditions, experimental data and models, they can improve the process understanding and the decision making process during the synthesis route selection process. In addition to constraints of high product quality and process economics, a pharmaceutical process needs to fulfill the criteria for environmental issues. In particular, for pharmaceutical processes, the environmental sustainability evaluation must be performed during the early stage of process development [36] before the approval of the regulatory bodies as the re-approval of the process can be a very expensive process [37]. Constable et al. [38] has reviewed “green” metrics proposed in literature and these metrics are used to increase the awareness of generated waste sources from the reaction and to identify opportunities for further improvement. The reviewed “green” metrics are listed in Table 2, where for each metric an explanation and the equation to quantify the specific metric are given.

Table 2. List of metrics that have been proposed for “green” chemistry (reviewed by Constable et al. [38]).

Metric	Explanation	Equation
Effective Mass yield (EM)	The percentage of the mass of product over the overall mass of non-benign compounds used during the synthesis.	$EM(\%) = \frac{\text{Mass of products (kg)}}{\text{Mass of non-benign reagents (kg)}} \times 100\%$
E-factor	The mass of total waste produced for a given amount of produced product.	$E - \text{factor} = \frac{\text{Total waste (kg)}}{\text{kg product}}$
Atom Economy	How much of the reactants remain in the product.	$\text{Atom Economy}(\%) = \frac{MW P}{\sum(MW A, B, D, F, G, I)} \times 100$ Where A, B, D, F, G, I: reactants; P: product
Mass Intensity (MI)	Total mass used to produce the product.	$MI = \frac{\text{Total mass used in a process or process step (kg)}}{\text{Mass of product (kg)}}$
Carbon efficiency	Percentage of carbon of the reactants that remain in the final product.	$\text{Carbon efficiency} (\%) = \frac{\text{amount of carbon in product}}{\text{Total carbon present in reactants}} \times 100$
Reaction mass efficiency (RME)	Mass of reactants remaining in the product.	$RME (\%) = \frac{\text{mass of product(kg)}}{\text{mass of reactants (kg)}} \times 10$

This information, in combination with other knowledge databases and computer-aided synthesis design (CASD) tools developed earlier, provides an opportunity for an integrated approach to the solution of problems related to synthesis route selection and improvement, taking into account important process considerations such as the development time to establish the synthesis route, product quality, cost of manufacture that are often linked to “green” chemistry metrics and the final approval of regulatory agencies [1]. This process related information is not available in the reaction databases listed in Table 1, but is needed for plant-wide design, process-operation simulation and optimization in studies related to sustainability and the economics of processes producing active pharmaceutical ingredients [39–41].

In this article, the developed reaction database is presented with a specific focus on reactions (including multiple reactions) taking place in pharmaceutical processes within the pharmaceutical industry and connecting them with process information. The reactions in this database have been categorized according to the reaction type, the target product to be produced (when single-step or multistep reactions are considered), the reaction product and the effect of the solvent use on the reacting system. Reaction conditions (temperature, pressure etc.), reaction components (reagents, catalysts etc.), reaction data (conversion, selectivity, etc.), scaling information and finally batch or continuous processing is included in the developed database. For each reaction entry, a description of the process exists and the references are provided. A more detailed description of the database development and structure follows later in this article.

This reaction type database, more specifically, aims to:

1. Identify reactions that are used to produce different types of products (Active Pharmaceutical Ingredients (API), Intermediates).
2. Identify reactions to be utilized, for a given compound availability.
3. Investigate the function of different type of solvents in single/multiphase reactive systems.
4. Facilitate the choice of the reaction conditions.
5. Evaluate the reaction pathway in terms of yield, cost and sustainability metrics.
6. Facilitate the reactor design from available experimental data and kinetic models.

In addition, with the process information that is included in the database and has been mentioned in points 1–6 above, the database fulfills most of the criteria defined by Zass [17] (see Table 3). Table 3 provides a comparison of the available database with respect to the criteria given by Zass [17]. It can be noted that most of the available databases provide information for individual reactions (criterion i) and molecular structure information on reactants and products (criterion ii). However, the remaining criteria are covered only in some databases (see Table 3).

2. Reaction Database

The data required to populate a reaction database to satisfy the abovementioned objectives has been acquired from numerous published articles and patents. The collected knowledge from these sources has been structured in the database according to a developed ontology (knowledge representation) and stored for easy data retrieval and re-use in different likely applications. The database consists of classes, sub-classes, instances and objects. A class is a representation for a conceptual grouping of similar terms. Classes are the focus of most ontology. A class describes concepts in the domain. A class can have subclasses that represent concepts that are more specific than a super class [42]. A simplified flow-diagram, which serves as a guide for the reaction database in terms of knowledge representation system, classes and instances of data and information on the available data, and where information can be found in the article, is shown in Figure 1.

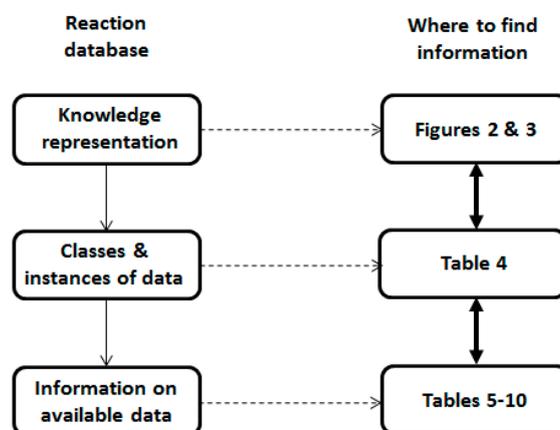


Figure 1. Simplified flow-diagram highlighting the contents of the reaction database. Figures 2 and 3 provide details of the knowledge representation system, Table 4 provides information on the classification of the data and Tables 5–10 provide information on the available data.

2.1. Knowledge Representation

For the development of the reaction database, classes have been used to represent the main knowledge categories such as the reaction type, the reaction, phases involved, how the phases are created, solvent use, solvent function, type of solvent, reaction conditions, available data and finally operation mode (listed in Table 4 and shown in Figure 2). The first knowledge class consists of different reaction types that are commonly found in pharmaceutical processes (i.e., hydrogenation). The set of these reaction types are called the instances of the class. The second class in the knowledge representation system (or data) is the reaction, which is divided in four sub-classes; the reactants, reaction products, and target product and reaction information (see Figure 3). The instances of the three first sub-classes of the second class are classified in terms of name of the compound, type of the compound and molecular structure while the fourth class summarizes information for the specific reaction. This type of information is important to identify the structural changes of the compounds during the reaction. The fourth class of data consists of instances describing the phases involved in the specific reaction. It is important to note that this class connects the reaction information with the reaction performance class, which will be described later, and it has an important role in the database since in this way, the advantages of using a multiphase or a single-phase system can be identified. The next two classes of the database consist of instances describing the solvent function, in case an organic solvent has been used in the reactive system, for example, the solvent function is “creates a second phase and removes the reaction product,” and the type and name of the used organic solvent. The last three classes of the data consist of instances describing the reaction performance under certain conditions. The reaction conditions class consists of instances, which have to do with the

reaction variables such as reaction temperature, stoichiometric amount, catalyst (type and amount), pH, pressure and the need to use acid or base. The data class consists of four sub-classes, reaction data, dynamic data, kinetic model, and scale. The instances of the reaction data sub-classes are information related to reaction time (or residence time), conversion, selectivity, reaction yield and overall process yield (usually after isolation and purification). The instances of the dynamic data are sets of experimental data that can be used to fit or to develop a kinetic model. The next sub-class describes the availability of kinetic models that can be used either directly, or after fitting to the experimental data for reaction optimization studies. The last sub-class of the data is a super class that provides important information on the scale the reaction has been performed. Finally, the last class of the data is the operation mode, instances of this class can be different operational modes such as batch reaction or flow reaction.

2.2. Database Structure

Table 4 lists the classes of the data in the first column, the second column relates the classes to the instances that an individual class contains and in the third column, the instances are listed for different classes. The structure of the database is visually shown in Figure 2.

Table 4. Main classes of the reaction type database and the instances.

Main Classes	Relation with Instances	Instances
Reaction Type, T	$T = [T_1, T_2, \dots, T_i, \dots, T_n]$	T_i : reaction type in the knowledge base (i.e., acylation etc.)
Reaction, R	$R = [R_1, R_2, \dots, R_i, \dots, R_n]$	R_i : reaction of the i th reaction type; for each reaction information about the reactants and reaction products are provided as well as information for the target product and process (for example: 1st step for production of an API)
Phases involved, P	$P = [P_1, P_2, \dots, P_i, \dots, P_n]$	P_i : phase of the i th reaction (i.e., organic-aqueous, organic-gas etc.)
How phases are created, C	$C = [C_1, C_2, \dots, C_i, \dots, C_n]$	C_i : (i.e., solvent etc.)
Solvent function, F	$F = [F_1, F_2, \dots, F_i, \dots, F_n]$	F_i : (i.e., phase creation, carrier etc.)
Solvent type, ST	$ST = [ST_1, ST_2, \dots, ST_i, \dots, ST_n]$	ST_i : (i.e., ether, alcohol etc.)
Solvent, S	$S = [S_1, S_2, \dots, S_i, \dots, S_n]$	S_i : Solvents in i th reaction
Reaction condition, RC	$RC = [RC_1, RC_2, \dots, RC_i, \dots, RC_n]$	RC_i (i.e., Temperature, composition, cat, pH etc.)
Data, D	$D = [D_1, D_2, \dots, D_i, \dots, D_n]$	D_i (reaction data: conversion, selectivity, reaction time, and dynamic data: concentration vs. time, scale information and kinetic models etc.)
Operation Mode, OP	$OP = [OP_1, OP_2, \dots, OP_i, \dots, OP_n]$	OP_i : batch, continuous, fed batch

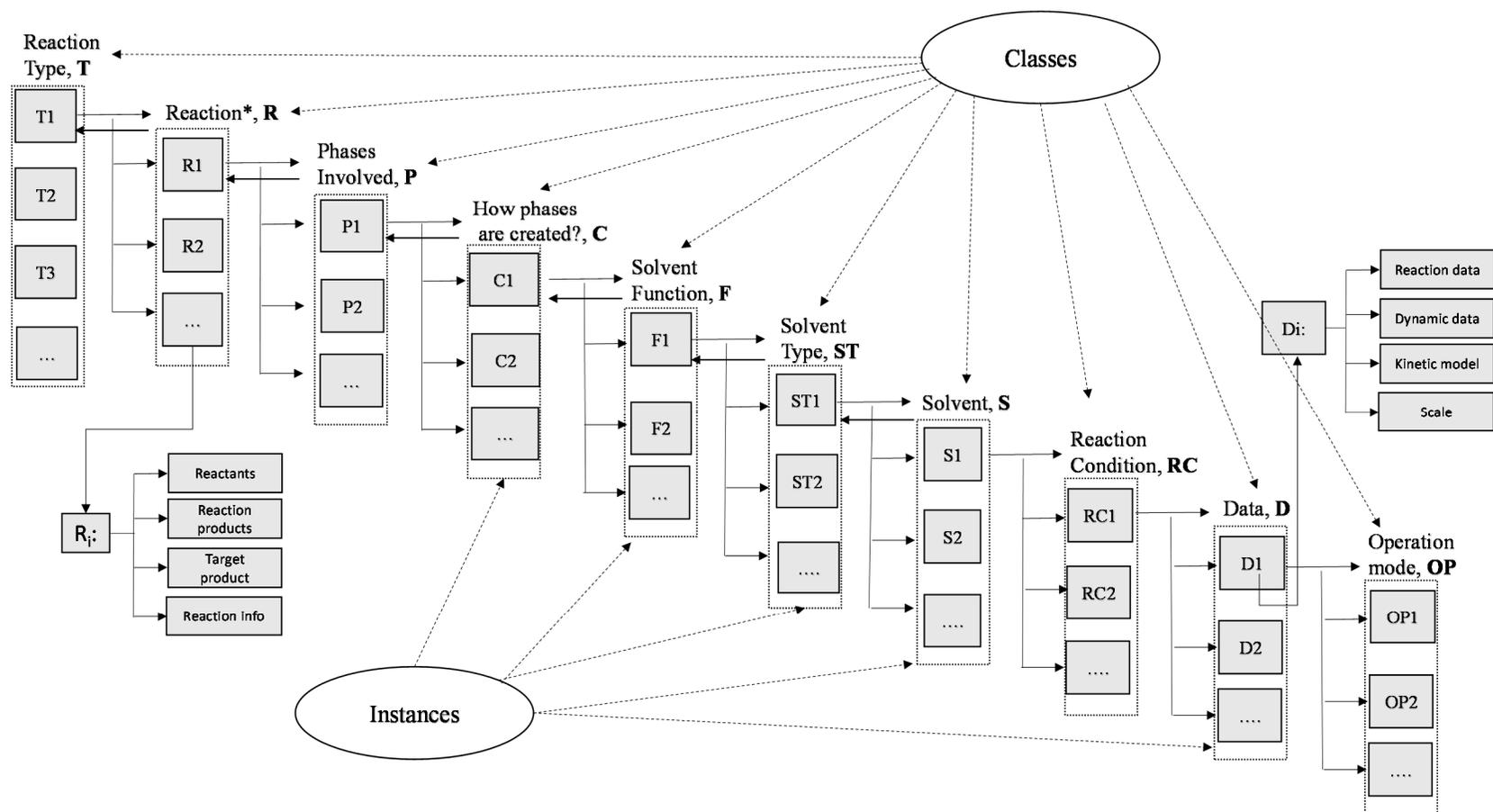


Figure 2. Knowledge representation system of the reaction database.

In Figure 3, the subclasses and the values of each instance in the “Reaction” class are illustrated. For example, each reaction has **reactants**—as well as **reaction products**—and can be used to eventually produce a **target product** (in case of multi-step reactions), each of the sub-classes take values such as the name of the compound (N), the type of the compound (T, for example, alcohol) and the molecular structure of the compound. The reaction info subclasses takes text values that can be used to give useful insights for the reaction.

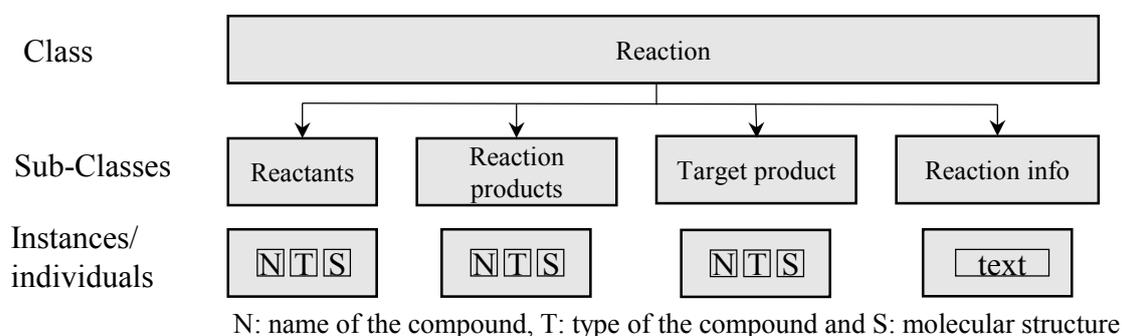


Figure 3. Sub-classes and instance/individuals for the reaction class of the database.

3. Statistics of the Reaction Database

To determine the range of applications and the capability of the reaction database, the statistics of the stored data within the database are needed. The statistics are given in terms of number of reactions, reaction types, list of APIs, reactions where the use of solvent improves the reaction performance and available kinetic models.

3.1. General Numbers

In this section, the general statistics of this database are given, for example, total number of reactions, total number of APIs, the number of the intermediates, reactions that require solvent, multiphase reactions, experimental data, type of reaction operation (batch or continuous, technology i.e., microwave technology). The general characteristics of the reaction type database are listed in Table 5.

Table 5. Summary of the information included in the database.

Category	Number
Total number of reactions	285
Types of reactions	44
Number of multiphase reactions	88
Number of reaction with solvents	226
Solvent	Dissolve, Phase creation, Substrate/catalyst carrier, compound extraction
Number of APIs (with total synthesis pathway)	21
Number of building blocks (type of compounds)	19
Number of experimental data	275 (conversion, selectivity, reaction yield, conditions), 32 (dynamic data), 11 (kinetic models)
Number of production mode data	96 (in flow), 203 (in batch)
Number of application examples	14 (chemicals), 16 (Fine chemicals), 251 (pharmaceuticals)

3.2. Reaction Types

The different reaction types included in the database are listed in Table 6, together with the number of the reactions, the catalyst need, the phases (usually) involved and the solvent function if it used.

Table 6. Reaction types included in database, phases involved and function of the used solvent.

Reaction Type	Catalyst	Phases	Solvent Function
1. Alkylation	Yes	Liquid (org.)	Dissolves reactants
		Liquid (org.)—Liquid (aq.)	Creates second phase
2. Hydrogenation	Yes	Liquid (org.)—Gas	Dissolves reactants
3. Epoxidation		Liquid (org.)—Liquid (aq.)	Creates second phase Reactant/catalyst carrier
4. Carbonylation	Yes	Liquid (org.)—Liquid (aq.)—Gas	Creates phase Carrier for catalyst
	Yes	Liquid (org.)—Gas	Dissolves reactants
5. Hydroformulation	?		Creates second phase Catalyst carrier
6. Enzymatic reduction	Yes	Liquid (org.)—Liquid (aq.)	Reactant carrier Creates second phase
7. Arylation	Yes	Liquid (org.)—Liquid (aq.)	Creates second phase
	Yes	Liquid (org.)	Dissolves reactants
8. Oxidation	Yes	Liquid (org.)—Gas	Dissolves reactants
9. Transamination	yes	Liquid (org.)—Liquid (aq.)	Creates second phase Product removal
10. Saponification	No	Liquid (org.)	Dissolves reactants
11. Amidation	Yes/No	Liquid (org.)—liquid (aq.)	Creates second phase removes product
12. Amination	Yes	Liquid (org.)	Dissolves reactants
13. Esterification	Yes	Liquid (org.)	Solvent free
		Liquid (org.)	Dissolves reactant
14. Hydrolysis	Yes	Liquid (org.)—liquid (aq.)	Creates second phase removes product
			Dissolves reactants
15. Aminolysis	yes	Liquid (org.)	Dissolves reactants
16. Condensation	No	Liquid (org.)	Dissolves reactant
17. Deprotection	No	Liquid (org.)	Dissolves reactant
18. Protection	Yes	Liquid (org.)	Dissolves reactant
19. Dehydration	Yes	Liquid (org.)—liquid (aq.)	Catalyst carrier
			Create second phase Product removal
20. Cyclization	No	Liquid (org.)—liquid (aq.)	Dissolves reactant Product separation
21. Lithiation	No	Liquid (org.)	Dissolves reactants

Note: aq.: aqueous and org.: organic.

3.3. Active Pharmaceutical Ingredients (APIs)

In Table 7, the list of the available APIs (or the final drug) in the database is given. The database includes at least one pathway for each API listed in Table 7. In some cases, more than two completely different published reaction pathways (for example, for Ibuprofen) exist, which are also listed in the database. Finally, in some cases efforts have been focused on improving a certain reaction within the reaction path that has also been included in the knowledge database.

Table 7. List of APIs and final drugs (*) in the database, of which complete reaction pathway and the reactions are provided in the database.

APIs	
1. 6-aminopenicillanic acid	12. Tramadol
2. Zuchopenthixol	13. Artemisinin
3. 6-Hydroxybuspirone	14. Saxagliptin
4. aliskiren hemifumarate	15. Atazanavir
5. Ibuprofen	16. PDE5 inhibitor *
6. Meclizine *	17. Axitinib
7. Rufinamide	18. Olanzapine *
8. Ciprofloxacin	19. Amitriptyline
9. Naproxen	20. Tamoxifen
10. OZ439 * (antimalarial drug candidate)	21. Vildagliptin
11. Efavirenz *	

3.4. Reaction with Improved Reaction Performance When Solvent Is Used

Reaction improvements in terms of reaction time, reaction volume, yield, conversion and/or selectivity and post-processing improvement in the separation and purification steps related to solvent use are considered in database development. The functions of solvent and the possible process improvements are listed below and summarized in Table 8:

- Reaction medium.
- Separation of the main product in order to shift the equilibrium reaction towards the product side in order to increase the yield and/or reduce the separation steps required.
- Separation of an inhibitory product to increase the productivity of the reaction.
- Controlled release of substrate, it might improve the process safety in case of hazardous compounds or increase selectivity towards the desired product.
- Reaction volume reduction.
- Dissolves reactants to increase the reaction rate and/or to avoid process complications when the reaction involves compounds in solid phase at the reaction conditions.

Table 8. Solvent functions in reaction and their possible improvements.

		Possible Improvements			
		Productivity	Process safety	Separation steps	Waste reduction
Solvent Functions	Reaction medium	✓	✓	-	-
	Product removal (phase creation)	✓	-	✓	✓
	Substrate carrier (phase creation)	✓	✓	-	✓
	Catalyst carrier (Phase creation)	✓	✓	✓	✓

In Table 9 below, different reactive systems where solvent has been added in order to improve the reaction performance are listed. Table 9 has been classified based on the reaction type and the main product—it also gives the reaction phases, the solvent function and the reaction improvement.

Table 9. List of reactions where the use of the solvent has a specific function that leads in direct reaction performance improvement.

Reaction Type	Main Product	Phases	Solvent Function	Improvement
Amidation [1]	PDE5 inhibitor	Liquid(org.)—Solid	Product separation (Product not soluble in solvent)	Direct product separation
Enzymatic reduction [43]	Chiral alcohols	Liquid (aq.)—Ionic liquid	Substrate carrier	Increased productivity (82–92% yield)
		Liquid (aq.)	-	Productivity (42–46% yield)
		Liquid (aq.)—Organic solvent	Substrate carrier	Productivity (0% yield)
Alkylation [44]	Alyl azides	liquid (org. DMSO)	Dissolves reactants	High productivity (94% yield) but high waste generation
		Liquid (aq.)—liquid (org. DMSO)	Dissolves reactants	High in productivity (94% yield) and lower waste generation
		Liquid (aq.)—liquid (org. Isopropyl acetate)	Dissolves reactants	High productivity (96.5% yield) and lower waste generation
		Liquid (aq.)—liquid (org. Isooctane)	Dissolves reactants	High productivity (91.4% yield) and lower waste generation
Arylation [45]	3,3-disubstituted oxindoles	Liquid (aq.)—liquid (org. THF or Toluene)	Dissolve reactants	Increased reaction rate that leads to complete conversion and high yields compared to single phase systems
Arylation [46]	Arylation of Alkynes	Liquid (aq.)—liquid (org.)	Catalysts dissolved in aq. Phase	Catalyst recovery while maintaining high yields
Hydrolysis [47]	Naproxen	Liquid (aq.)—liquid (org.; Hexane or isooctane or toluene)	Product removal (in organic phase)	Increased yield, enzyme stability increases
Hydrolysis [48]	6-amino penicillanic acid	Liquid (aq.)—liquid (org.; butyl acetate)	Product removal in the organic phase	Productivity increases (product removal shifts the equilibrium reaction towards the product)
Transamination [49]	L-2 Aminobutyric acid	Liquid (aq.)—liquid (org.)	By-product inhibits the enzyme, removal in the organic phase	Increased conversion (96%)
		Liquid (aq.)	-	Conversion (~40%)
Transamination [50]	Chiral amines	Liquid (aq.)—Resin	Product removal	Equilibrium shifts towards product side
Enzymatic Reduction [51,52]	S-4-Chloro-3-hydroxybutyric acid ethyl ester	Liquid (aq.)—liquid (org.)	Substrate controlled release	Increased reaction productivity
Carbonylation [53,54]	Ibuprofen	Gas—Liquid (org.)—Liquid (aq.)	Dissolves catalyst (aq.)	Less waste generated, same productivity, slightly lower reaction rates, reduction in the separation steps
		Gas—Liquid (org.); MEK-Liquid (aq.)	Dissolves catalyst (aq.); Dissolves reactants (org.)	Increased reaction rates
Transamination [55,56]	Sitagliptin	Liquid (aq.); DMSO used as co-solvent	DMSO dissolves amine donor	Increased productivity; enantiomeric selectivity and less waste generated

Note: aq.: aqueous and org.: organic.

3.5. Kinetic Models Available

Table 10 lists the kinetic model availability (found through literature search) and their inclusion in the reaction database kinetic model library. Some of the available kinetic models in the literature have been analyzed, validated against experimental data and, if found acceptable, then been used for reaction optimization in order to establish the design space. In other cases a model has been used by taking it directly from the reported reference, for example, the model reported by Thakar et al. [57] for the second hydrogenation step of ibuprofen synthesis has been successfully used without any modification (of the kinetic parameters) to fit the dynamic experimental data published by Cho et al. [58].

Table 10. Kinetic models availability; * indicates those that are included in the kinetic model library.

Kinetic Models	Number	Reference
Dehydration	1	[59]
Enzymatic reduction	3	[51,60]
Esterification	1	[61]
Transamination	3*	[50,62,63]
Hydrolysis	2	[64,65]
Carbonylation	2*	[66–68]
Hydrogenation	2*	[57,69]

4. Reaction Database Application

The reaction database has multiple features that can assist in the creation of a data-rich environment in the early stage pharmaceutical process-product development. The knowledge stored in the database is searchable by forward or backward search options. As is illustrated in Figure 2, data can be retrieved for the specific search and the retrieved data is used for reaction improvement studies in subsequent calculation-analysis.

4.1. Reaction Data

Process improvements are usually related to resources such as development cost and time. The process of establishing the reactions, the experimental procedure, and the reaction conditions might require significant resources during the initial reaction screening that is required to identify the reaction pathway that leads to the production of the desired type of products (i.e., chiral alcohols). However, having an information-based system that can provide information for reaction identifications, reaction conditions and experimental procedures, can rapidly reduce the required time and cost of the initial screening process. The data-rich environment can also provide solution for reaction improvements related to the mass and heat transfer improvements by the use of new technologies such as flow reactions using for example new microwave technologies.

The use of experimental data (dynamic or end-points) can assist the improvement of the reaction system as the effect of reaction variable changes can be understood and quantified. Moreover, experimental data can be used to develop or to fit kinetic models that capture the behavior of the system under different conditions. These kinetic models can be used for validation studies, optimization studies to identify improved reaction conditions, evaluate different operation scenario and/or different reactor designs and networks.

4.2. Organic Solvents

Another class of process improvement is related to the solvent role during the synthesis step. There are cases where solvent use might enhance the reaction performance. Solvents might have different roles such as creating a second phase to remove an inhibitory product and shift the reaction equilibrium towards the product side, or simply it can create the second phase to remove the product in order to facilitate the following separation procedure. The solvent can also be used as a carrier for the controlled release of the substrate in the reaction mixture, which can minimize the amount

of by-products produced when the concentration of substrate is high. The solvent can also have a role as the medium of the reaction and broaden the reaction conditions in order to improve reaction performance or satisfy other process concerns such as process safety. For example, if a reaction takes place at very low temperatures ($< -25\text{ }^{\circ}\text{C}$), the solvent should be liquid at this condition and have the ability to dissolve the reactants, products and catalyst [70].

4.3. Search Options

The search options of the database in terms of both the retrieved data and the use of that data for a defined process are given below.

1. Search for reaction types

Different reaction types can be searched in the reaction database, the retrieved results provide information for the reaction (reactants, product and target product), the solvent role and how it improves the reaction, reaction conditions (i.e., temperature range, acid/base, different catalyst) and quantitative data (i.e., conversion, concentration vs. time), and finally applicability information such as scale or batch/continuous mode. The results can be used as similarity check, to identify reaction conditions, solvents and possibilities for improvement (i.e., equipment, production mode, technology) for quick reaction optimization.

2. Search for main products (such as APIs or intermediates or type of products like chiral alcohols)

Searching for main products or type of products, reactions that are used to synthesize this type of compound can be retrieved. The results are used to identify different ways for synthesis and to evaluate them in terms of reaction performance, cost, scalability and sustainability.

3. Search for reactants

The results obtained by searching reactants are used to identify ways for further utilizing them in case they have used or produced a product during a reaction.

4. Multiphase reactions

Multiphase and single reactions where the solvent use has improved the reaction performance can be searched, the retrieved results are used to identify the role of the multiphase system, for example, solvent creates a second phase to remove inhibitory by-product and to quantify the improvement in reaction performance, for example, increased conversion.

To summarize, the information retrieved from the reaction database can be used to:

- a. Identify reaction pathways, reaction types, reactants, catalysts, solvents and base/acid.
- b. Optimization reaction conditions.
- c. Investigate the solvent role in process improvement.
- d. Optimize the process development identified reactions in terms of cost, yield and time.
- e. Improve the overall process performance in terms of separation process, overall yield, sustainability, safety, scalability, controllability and utilized mass.
- f. Improve reactor design and evaluate different reactor designs.
- g. Establish operation procedure for the reactors.
- h. Assist in plant-wide design, simulation, and techno-economic optimization.
- i. Enhance process understanding.

5. Application Example: Ibuprofen Synthesis and Evaluation

5.1. Problem Definition

To illustrate the applicability of the database, the synthesis of ibuprofen is selected as an example. The objectives of this example are:

1. To retrieve data relevant to the reaction pathway of Ibuprofen.
2. Collect data related to individual reactions.
3. Evaluate the alternatives based on green metrics.

Database Search: "Main Product = 'Ibuprofen'".

5.1.1. Database Results

The main product sub-class is found in the "Reaction" class and from there information before (reactants, reaction types) and information forward (solvents, reaction conditions, data etc.) are retrieved. The database information as retrieved from the database is shown in Figure 4, which contains three screenshots for the purpose of illustration. Screenshot-1 connects the main product (ibuprofen) to the reaction type data; screenshot-2 connects the main product to the specific reaction information (temperature, pressure, solvent use, etc.); screenshot-3 connects the main product to modelling details (for example, kinetic model). The information is also given in the text as follows:

- a. Summary of the findings (reaction pathways, reaction types, operation mode, available data and reference).
- b. For each reaction pathway, each reaction is analyzed in terms of:
 - i. Reactant, products, by-products, acids/base, solvents, catalysts.
 - ii. Then the reaction conditions for each reaction is presented.
 - iii. Finally, the reaction data is presented.

The retrieved information is used for the evaluation of different pathways to produce ibuprofen using the green chemistry metrics.

The database search gives three different reaction pathways. Pathway 1 consists of three reactive steps. It has been proposed by Elango et al. [71] and consists of three batch reaction steps—a Friedel craft acylation, a hydrogenation and finally, a carbonylation step. The first reactive step has been improved by Lindley et al. [72] using a continuous counter flow reaction-separation system which enables the recovery and recycle of the solvent and the unreacted reactants. The second reactive step is a hydrogenation step that takes place in a fed-batch reactor and the final step is a carbonylation step that also takes place in a fed-batch reactor. Pathway 2 consists of 3 reactive steps as well—a Friedel crafts acylation, an 1,2-aryl migration step and a saponification step—all the reactions are taking place in a continuous flow reactor and this reaction pathway that has been proposed by Snead et al. [73]. Finally, the third reaction pathway consists of the same three reactive steps, as the second pathway, although the intermediates and reactants are different Bogdan et al. [74]. Table 11 gives a summary of the reaction pathways retrieved from the database.

Table 11. Summary of the data retrieved from the database.

Pathway	Reaction Steps	Database Entries	Operation	Reference
1	1.1 Friedel Crafts acylation	67 and 74	Batch (67), continuous (74)	Elango et al. [71] Lindley et al. [72]
	1.2 Hydrogenation	68–71 and 92	Batch	Elango et al. [71]
	1.3 Carbonylation	9–13	Batch	Elango et al. [71]
2	3.1 Friedel Crafts	45	Continuous	Snead et al. [73]
	3.2 1–2 aryl migration	46	Continuous	Snead et al. [73]
	3.3 Saponification	44	Continuous	Snead et al. [73]
3	2.1 Friedel-Crafts	73	Continuous	Bogdan et al. [74]
	2.2 1–2,aryl migration	72	Continuous	Bogdan et al. [74]
	2.3 Saponification	44	Continuous	Bogdan et al. [74]

Screenshot of database search, Screenshot-1 (main product versus reaction type data)

N	Reaction Type	Reactant 1	Reactant 2	Reactant 3	Reactant 4	Product 1	Product 2	Product 3	Product 4	Phases Involved	How phases are created?	Solvent Classification	
1	9	Carbonylation	C12H18O (1-(4-isobutylphenyl) ethanol)	CO	-	-	C13H18O2 (ibuprofen)	-	-	-	L (org) - L (aq) - G	water	water
2	10	Carbonylation	C12H18O (1-(4-isobutylphenyl) ethanol)	CO	-	-	C13H18O2 (ibuprofen)	-	-	-	L (org) - G	Organic Solvent	Ketone
3	13	Carbonylation	C12H18O (1-(4-isobutylphenyl) ethanol)	CO	-	-	C13H18O2 (ibuprofen)	-	-	-	L-L	water	water
4	70	Hydrogenation	C12H18O (4-isobutyl acetophenone)	H2 (Hydrogen)	-	-	C12H18O2 (isobutyl phenyl ethanol)	-	-	-	L(org)-Gas	Solvent+H2	Alcohol
5	42	Friedel Crafts acylation	Isobutylbenzene (C10H14)	Propionic acid (C3H6O2)	-	-	4-isobutylpropiofenone (C13H18O2)	-	-	-	Liquid	no solvent	-
6	44	Saponification	C14H20O2 (Methyl 2 - (4 - isobutylphenyl) acetate)	KOH (potassium hydroxide)	-	-	ibuprofen (C13H18O2)	CH3KO ...	-	-	Liquid	Organic Solvent	Alcohol
7	45	Friedel Crafts acylation	Isobutylbenzene (C10H14)	propionyl chloride (C3H5ClO)	-	-	4-isobutylpropiofenone (C13H18O2)	HCl	-	-	L(org)-L(aq)	water	water
8	46	1,2-aryl migration	C13H18O (4-isobutylpropiofenone)	C4H10O3 (trimethyl orthoformate)	-	-	C14H18O2 (Methyl 2 - (4 - isobutylphenyl) acetate)	C3H8O2 ...	-	-	Liquid	Organic Solvent	Formide/alcohol
9	47	Saponification	C14H21O2 (Methyl 2 - (4 - isobutylphenyl) acetate)	C2H6OS (2-mercaptoethanol)	NaOH	-	C13H18O2 Na (ibuprofen sodium salt)	CH3OH ...	-	-	Liquid	Solvent Mixture	Acohol/water
10	67	Friedel Crafts acylation	(C10H14) isobutylbenzene	C4H6O3(acetyl anhydride)	-	-	C12H18O (4-isobutyl acetophenone)	C2H4O2 ...	-	-	L(org)-L(aq)	HF	HF
11	68	Hydrogenation	C12H16O (4-isobutyl acetophenone)	H2 (Hydrogen)	-	-	C12H18O (isobutyl phenyl ethanol)	-	-	-	L(org)-G	Solvent+H2	Alcohol
12	69	Hydrogenation	C12H16O (4-isobutyl acetophenone)	H2 (Hydrogen)	-	-	C12H18O (isobutyl phenyl ethanol)	-	-	-	L(org)-Gas	H2	-
13	71	Hydrogenation	C12H16O (4-isobutyl acetophenone)	H2 (Hydrogen)	-	-	C12H18O (isobutyl phenyl ethanol)	-	-	-	L(org)-G	Solvent+H2	Alcohol
14	72	1,2-aryl migration	C13H18O (4'-isobutylpropiofenone)	C4H10O3 (trimethyl orthoformate)	-	-	C14H20O2 (Methyl 2 - (4 - isobutylphenyl) acetate)	C3H8O2 ...	-	-	L(org)	solvent	Alcohol
15	73	Friedel Crafts acylation	(C10H14) isobutylbenzene	Propionic acid (C3H6O2)	-	-	C13H18O (4'-isobutylpropiofenone)	H2O	-	-	L (org)	-	-
16	74	Friedel Crafts acylation	(C10H14) isobutylbenzene	mixture of acetylating agent...	C2H3FO (acetyl fluoride)	-	C12H18O (4-isobutyl acetophenone)	H2O	HF	-	L(org)-L(aq)	HF	HF

Screenshot-2: Continuation of the screenshot-1 (main product versus specific reaction data)

Main Product	Reaction info	Solvent Function	Solvent	Temperature	Pressure	Stoichiometry	Base	Acid	pH	Catalyst	Residence time	Conversion (%)	Selectivity	Yield	Process Yield	
1	Ibuprofen	Ibuprofen Synthesis (Step 3)	Creates second phase, catalyst soluble in water ...	water	330K	54 bar	NULL	CHECK	CHECK	CHECK	Pd catalyst	check	20%	90%	15%	n.i.
2	Ibuprofen	Ibuprofen Synthesis (Step 3)	Dissolve Reactants/Catalyst	MEK	140c	2000psig	-	-	-	-	0.08 mol% Pd catalyst	2hr	99%	95.5%	94.1%	n.i.
3	Ibuprofen	Ibuprofen Synthesis (Step 3)	Creates second phase, catalyst soluble in water ...	water	130c	2400 psig	-	75 mol% HCl	-	-	0.007 mol% PdCl2, ligand: 0.08 mol% PPh3	155min	99%	96.6%	95.6%	-
4	Ibuprofen	Ibuprofen Synthesis (Step 3)	Dissolves reactants	MeOH/H2O (4:1 v/v)	55c	-	1.20	-	-	-	3min	-	-	70%	51%	-
5	Ibuprofen	Synthesis of Ibuprofen (Step 1)	Dissolves reactants	water	70c	250psi	1.1:17:1.11	1 M HCl	4.5	-	1.25 min	99%	100	99%	>90%	-
6	Ibuprofen	Synthesis of Ibuprofen (Step 2)	Dissolves reactants, promoter	DMF/n-propanol	70c	250psi	1.8	-	-	-	2.5 min	-	-	90%	-	-
7	Ibuprofen	Synthesis of Ibuprofen (Step 3)	Dissolves reactants	MeOH/Water (1:3 v/v)	90c	250psi	-	-	-	-	3min	-	-	92%	-	-
8	Ibuprofen	Synthesis of Ibuprofen (Step 1)	creates second phase, extract the product	HF	80c	Pressure to prevent HF to volatilize	1.2	-	50 eq. HF	acidic	3 hr	85%	81%	-	-	-
9	Ibuprofen	Synthesis of Ibuprofen (Step 2)	Dissolves reactants	Methanol	30c	6.9 atm	1	-	-	-	5 wt% palladium/carbon catalyst	1 hr	99.5%	96.6%	-	-
10	Ibuprofen	Synthesis of Ibuprofen (Step 2)	-	Methanol	60c	17 atm	1	-	-	-	Activated Ni sponge	1.5 hr	99.8%	-	-	-
11	Ibuprofen	Synthesis of Ibuprofen (Step 2)	Dissolves reactants	Methanol	60c	8.16 atm	1	-	-	-	Pd/CaCO3	18 hr	85%	100%	-	-
12	Ibuprofen	Synthesis of Ibuprofen (Step 2)	Dissolves reactants	Methanol	60c	8.16 atm	1	-	-	-	Pd/C with triethyl amine	1hr	97%	100%	-	-
13	Ibuprofen	Synthesis of Ibuprofen (Step 2)	Dissolves reactants	Methanol	50c	-	1.4	-	5 eq. TiOH (8% acid)	-	1 eq. isobutene diacetate	2 min	98%	-	96%	-
14	Ibuprofen	Synthesis of Ibuprofen (Step 1)	-	-	150c	1 atm	1.1	NULL	5 eq. TiOH	-	TiOH	10 min	92%	-	74%	-
15	Ibuprofen	Synthesis of Ibuprofen (Step 1)	creates second phase, extract the product	HF	60-70c	40-60 psig (prevent solvents to boil)	1.2 (v/v)	-	-	-	HF	3hr	25.6%	100%	25.6%	-
16	Ibuprofen	Synthesis of Ibuprofen (Step 2)	dissolves reactants	Ethanol	70c	20bar	1	-	-	-	0.5-3.0 wt% Na-3wt% (of substrate) Pd/C	2.9hr	>90%	96.4%	96.9%	-

Screenshot-3: Continuation of the screenshot-2 (main product versus kinetic model availability)

Experimental data	Kinetic model	Mode	Comments	References	Application
c vs. time	kinetic model available	Batch	-	Chaudhari et al. 2004	Pharma
Initial and end points	no	Batch	-	Elango et al. 1987	Pharma
Initial and end points	no	Batch	-	Elango et al. 1987	Pharma
Steady state data for different conditions	-	Flow	-	Bogdan et al.2009	Pharma
Steady state data for different conditions	-	Flow	by products are removed in the aqueous phase whi...	Sneal et al. 2015	Pharma
-	-	Flow	acetone was added in - line to quench residual di...	Sneal et al. 2015	Pharma
Steady state data for different conditions	-	Flow	-	Sneal et al. 2015	Pharma
Initial and end points	no	batch	-	Elango et al. 1991	Pharma
Initial and end points	no	batch	-	Elango et al. 1991	Pharma
Initial and end points	no	batch	-	Ryan et al. 1990	Pharma
-	-	batch	-	Seaki et al. 1990	Pharma
-	-	batch	-	Seaki et al. 1990	Pharma
Steady state data for different conditions	-	flow	-	Bogdan et al. 2009	Pharma
Steady state data for different conditions	-	flow	-	Bogdan et al. 2009	Pharma
steady state data	no	continuous	-	Lindley et al. 1991	Pharma
c vs. time	Already developed model is used	batch	-	Cho et al. 2013	Pharma

Figure 4. Reaction database search results for “Main Product = Ibuprofen”.

The details for reaction pathways 1 and 3 are given in the supplementary material (see Sections A.1 and A.2 for pathways 1 and 3 respectively) while the retrieved data for reaction pathway 2 are given and analyzed in the text below.

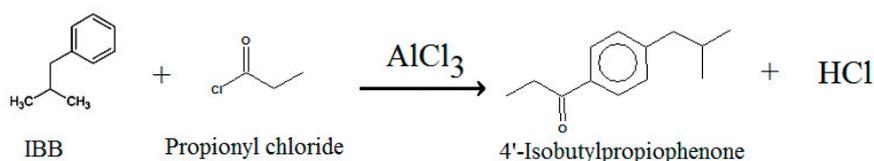
5.1.2. Pathway 2: Ibuprofen Synthesis

The individual reaction details for the reaction pathway proposed by Snead et al. [73] are presented in Table 12, where the reaction is given in terms of reactants and reaction product for each step and the overall reaction pathway is illustrated in Figure 5. The stoichiometric amounts of the reactants, the solvents, the catalyst, acid/base and by-products are also given in Table 12 for the three reaction steps involved in this pathway.

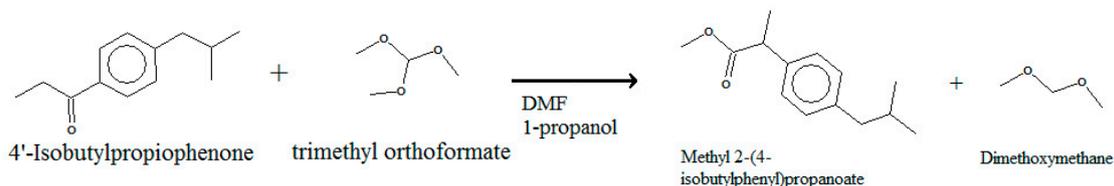
Table 12. Retrieved reaction information from the database.

Reaction Information	Reaction Step 1	Reaction Step 2	Reaction Step 3
	Friedel Crafts (Flow)	Aryl Migration (Flow)	Saponification (Flow)
Reaction	Isobutylbenzene + propionyl chloride → 4-isobutylpropiophenone + HCl	C ₁₃ H ₁₈ O (4-isobutylpropiophenone) + C ₄ H ₁₀ O ₃ (trimethyl orthoformate) → C ₁₄ H ₁₈ O ₂ (Methyl 2-(4-isobutylphenyl) propanoate) + C ₃ H ₈ O ₂ (Dimethoxymethane)	C ₁₄ H ₂₁ O ₂ (Methyl 2-(4-isobutylphenyl) propanoate) + C ₂ H ₆ OS (2-mercaptoethanol) + NaOH → C ₁₃ H ₁₈ O ₂ Na (ibuprofen sodium salt) + CH ₃ OH (MeOH)
Composition (Reactant A: Reactant B, in moles eq.)	1:1.17	1:8	1:8
Solvent	Water	DMF/1-propanol	MeOH/H ₂ O
Catalyst	AlCl ₃	ICI	-
Acid/Base	HCl	-	-
By Products	-	-	-

Reaction 1. Friedel Crafts acylation



Reaction 2. Aryl Migration



Reaction 3. Saponification

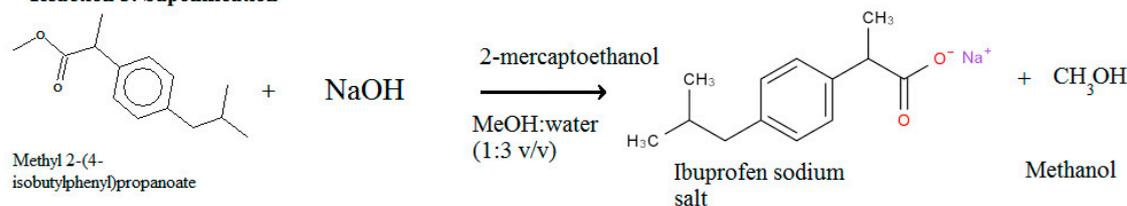


Figure 5. Reaction pathway proposed by Snead et al. for the continuous flow synthesis of ibuprofen.

The reaction conditions in terms of temperature, pressure, residence time, catalyst amount and solvent amount are listed in Table 13 for all the reaction steps.

Table 13. Reaction Conditions for the three reactive steps.

Reaction Conditions	Reaction Step 1	Reaction Step 2	Reaction Step 3
	Friedel Crafts (Flow)	Aryl Migration (Flow)	Saponification (Flow)
Temperature	87 °C	90 °C	90 °C
Pressure	17 atm	14 atm	14 atm
Residence time	1.25 min	1min	1 min
Catalyst amount	1.11 eq. AlCl ₃	3 eq. ICl	-
Solvent amount	-	0.25 eq. DMF/0.71 eq. n-propanol	MeOH/H ₂ O (1:3 v/v)

The retrieved experimental data are given in Table 14 in terms of conversion, selectivity, overall reaction yield, experimental data and model availability.

Table 14. Available experimental data as retrieved from the database.

Type of Data	Reaction Step 1	Reaction Step 2	Reaction Step 3
	Friedel Crafts (Flow)	Aryl Migration (Flow)	Saponification (Flow)
Conversion	99%	90%	89%*(yield)
Selectivity (main product; by-product)	-	-	-
Reaction Yield	-	-	-
Experimental	Steady state data for different residence times	Steady state data for different residence times	Steady state data for different residence times
Model	No	No	No

5.1.3. Reaction Pathways Evaluation through the “Green” Metrics

A simple evaluation based on green metrics [38] has been performed and the results are illustrated in Figure 6. For this analysis, pathway 1 (BHC pathway) with and without recycling of HF and IBB, pathway 3 proposed by Bogdan et al. [74], and pathway 2 proposed by Snead et al. [73] have been considered. The effective mass yield, which is a ratio of the produced product (in mass, kg) over the total amount of non-benign reactant, has been evaluated first. As shown in Figure 6, step 1 of the BHC synthesis requires larger amounts of non-benign reactants compared to pathways 2 and 3, whereas reaction steps 2 and 3 require much less non-benign reactants. Another metric that has been evaluated is the mass intensity (MI), which shows the total required mass for the reaction per kg of product. In Figure 6b, it can be seen that the first reaction steps of pathways 2 and 3 require fewer reactants than the amount required for the BHC pathway without considering the recycling. However, when recycle is considered, the MI metric has lower values for BHC pathway than the other two pathways where recycle is not possible. In addition, pathway 2 proposes much fewer reactants than are required by pathway 3.

The E-factor metric, which shows the generated waste per kg of product, has been evaluated for all the four cases (shown in Figure 6c). The first step of the BHC pathway has been found to be the main contributor in the E-factor metric—even if step 1 produces a small amount of waste during the reaction, the large value of E-factor is caused by the large stoichiometric amounts of needed solvent and reactant. When the solvent and the reactant are recycled back into the reactor, the E-factor reduces dramatically and the small value of the E-factor is now caused by the small amount of waste and non-recovered solvent and reactant (~1%) [72]. The other two pathways (2 and 3) have relatively high E-factor values, which means that larger amounts of waste are generated through the synthesis steps.

The generated waste for pathway 2 has been found to be slightly lower compared to the reaction in pathway 3. Finally, the atom efficiency has been evaluated for the all pathways and is illustrated in Figure 6d. It can be seen that the atom efficiency for the BHC pathway is very high and therefore, most of the reactant atoms remain in the final product whereas the atom efficiencies are much lower for the two new pathways which means that pathways 2 and 3 might generate more waste than the batch process. Note that the interpretation and the analysis of each “green” metric should be performed individually for each reaction pathway as they represent different aspects of the process (for example, waste generation and total mass used per kg of product). Therefore, an overall conclusion about the “green extent” of the reaction pathways using weighted individual metrics cannot easily be made.

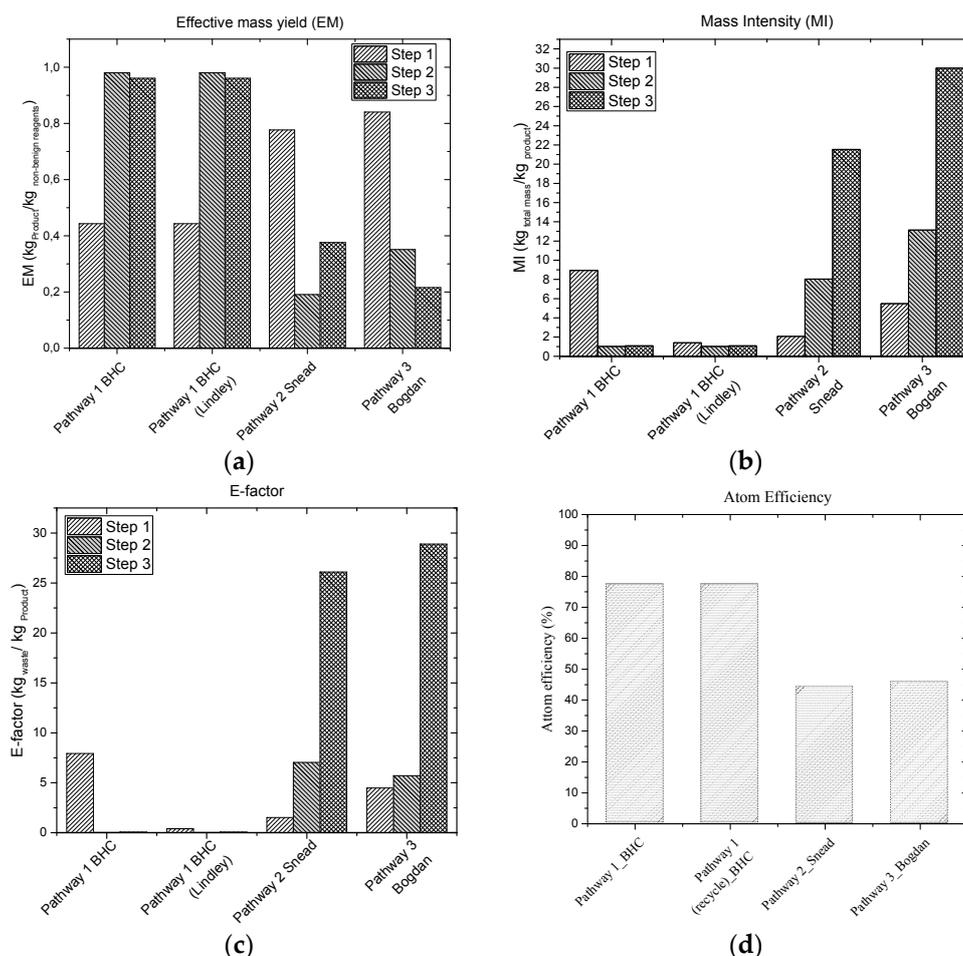


Figure 6. “Green” metrics evaluation for the reaction pathways found in the reaction database: (a) effective mass yield (EM) metric, (b) mass intensity (MI) metric, (c) E-Factor metric and (d) atom efficiency metric.

6. Conclusions

In this article, a reaction database has been developed to assist pharmaceutical process development during the early stages of the synthesis route selection and process-product development by providing enhanced process understanding. A data-rich environment is proposed for this task, where knowledge can be collected, stored and retrieved. The focus of this database is on the pharmaceutical processes and multiphase reactions taking place within them. The reactions in this database have been represented in terms of reaction type, target product to be produced (when single-step or multistep reactions are considered), reaction product and the effect of the solvent use in the reacting system. Information that is contained in the database includes: reaction conditions

(temperature, pressure etc.), reaction components (reagents, catalysts etc.), reaction data (conversion, selectivity, dynamic data set, and kinetic models), scaling information and finally batch or continuous processing. For each reaction entry, a description of the process together with literature references are provided.

Reaction data collection is a crucial and very challenging task together with the development of an appropriate knowledge representation system. Also, verification of the consistency of the data is necessary but tests for consistency of data are not yet available, except for some phase equilibrium data.

The application of the database has been highlighted by retrieving data for the synthesis of ibuprofen and using the retrieved data to evaluate the identified reaction pathways using “green” metrics. This reaction database can be used to provide important information during the development of pharmaceutical processes at the early stages of process design. The reaction database covers chemical and biochemical reactions and the future aim is to extend it in terms of reactions and pathways to cover a wider range of reaction systems-products. Many multiphase reactions or single-phase reactions have been improved through the use of solvents available in the database. The solvents are either organic solvents or ionic solvents and in some cases, the extra phase is created by resin, especially for biochemical processes.

Supplementary Materials: Reaction data and reaction pathways for ibuprofen synthesis. The following are available online at www.mdpi.com/2227-9717/5/4/58/s1.

Author Contributions: This research has been carried out in collaboration with all authors. Papadakis and Anantpinijwatna collected reaction data. Papadakis designed the database, performed the analysis and drafted the manuscript, which is based on his PhD-thesis. John M. Woodley and Rafiqul Gani supervised the research work and revised the manuscript.

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