

CHORTLES: A Method for Representing Oligomeric and Template-Based Mixtures

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Screening mixtures of synthetic oligomers or fixed templates (e.g., rings) with varying substituents is increasingly the focus of drug discovery programs. CHORTLES is designed and implemented to facilitate representation, storage, and searching of oligomeric and template-based mixtures of any size. Building upon the CHUCKLES method of representing oligomers as both monomer-based sequences and all-atom structures, CHORTLES compactly represents a mixture without explicitly enumerating individual molecules. This method lends itself to a hierarchy relating mixtures to submixtures and individual compounds, as one finds when deconvoluting mixtures in drug lead discovery programs. In addition, we describe two methods of searching mixtures at the monomer level. We also present a simple pictorial representation for describing all components in a mixture, which becomes essential as the list of monomer names is expanded beyond common names (e.g., amino acids).

INTRODUCTION

The proliferation of libraries of natural (peptide)¹⁻⁷ and un-natural oligomers,⁸⁻¹¹ along with cyclic template libraries,¹² necessitates a new way to store and search vast compound libraries. Peptides, rapidly synthesized by standard techniques, are increasingly a part of chemical libraries. Peptoids⁸ (N-substituted glycines (NSGs)) and carbamates¹⁰ are also appropriate for generating molecular diversity. With automation of peptide and peptoid synthesis, one is able to make both pure compounds and large mixtures. Pure compounds lend themselves to straightforward screening against various receptors and enzymes. In a previous paper, we presented CHUCKLES,¹³ a method for representing peptide and peptoid sequences on both the monomer and atomic levels. Mixtures permit rapid screening of large numbers of compounds at once. Zuckermann et al.¹⁴ have shown that initial screening of complex mixtures and subsequent deconvolution and assaying of more specific compounds is a fast and powerful means of drug lead discovery.

Representation of mixtures presents a more complex problem in database storage and searching than individual molecules. A mixture can consist of a set of oligomers which differ at certain sequence positions. For example, the mixture sequence Ala[Arg;Lys;His]Thr contains three peptides: AlaArgThr, AlaLysThr, and AlaHisThr. The peptides in a mixture contain fixed positions (e.g., positions one and three) which contain a single monomer and mixture positions (e.g., position two) which contain multiple monomers.

Template-based mixtures consist of a substrate (e.g., a ring) with varied substituents at multiple attachment points. These templates may be used in mixture synthesis by competitive coupling of mixed substrates¹⁵ or by controlled deprotection and coupling at specific sites.¹⁶

Our previous work with peptide/peptoid oligomers stressed the ability to convert between sequence and atom-level

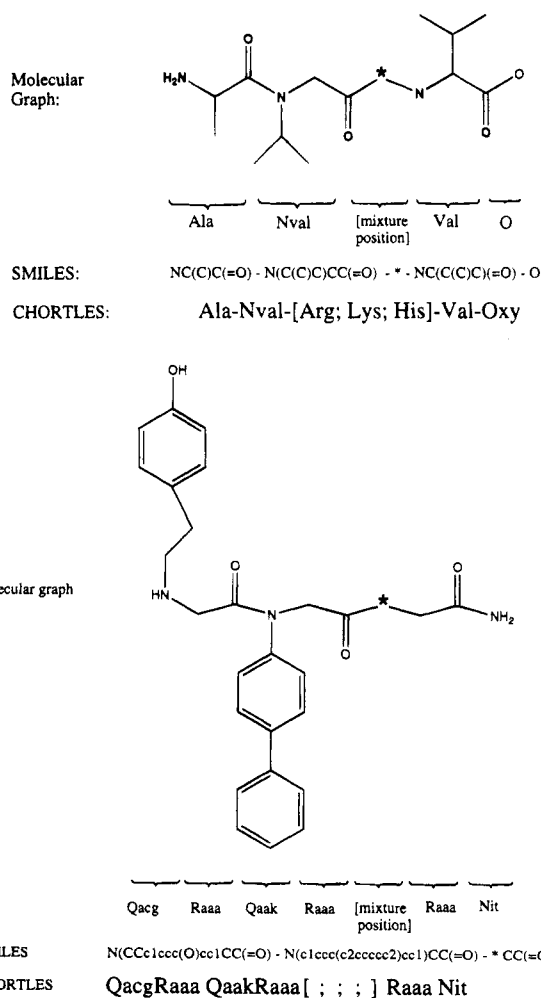


Figure 1. (a) Simple oligomeric mixture: molecular graph with "*" corresponding to mixture positions; SMILES representation of graph, and CHORTLES mixture sequence. Mixture sequence has fixed positions 1, 2, and 4, and mixture position 3 with basis set of Arg, Lys, and His. (b) The submonomer approach to peptoid synthesis lends itself to representing each traditional monomer as two submonomers, the amine (Qaaa, Qaab, Qaac, ...) and the backbone (Raaa, Raab, Raac). In position 1, Qacg represents the tyramine (side chain), and Raaa represents the peptoid backbone atoms CC(=O). In position 2, Qaak represents the biphenylamine, and Raaa represents the standard peptoid backbone. Position 3 is a mixture position with four monomers in the basis set.

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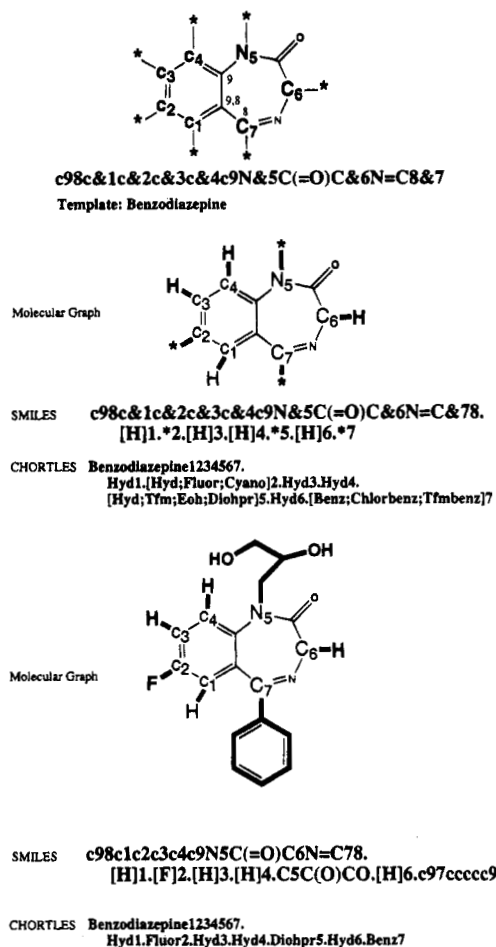


Figure 2. (a) Benzodiazepine template with potential substitution (mixture) points; substituents attach at the atoms with indices which are not satisfied. The indices 8 and 9 in the SMILES indicate bonds which cyclize within the template. Indices 1–7 are ordered connection points for mixture substitution; these unsatisfied bonds are preceded by "&" to indicate they correspond to other indices in the CHORTLES. (b) The benzodiazepine template in the context of a mixture. Positions 1, 3, 4, and 6 are fixed with [H]1, a hydrogen attached to the aromatic nitrogen and carbons. The second position is a mixture (indicated by "*2") where each substituent is in the basis set of the example mixture sequence. Position 5 is a mixture (indicated by "*5") with a basis set indicated in the example mixture sequence. Position 7 is a mixture (indicated by "*7") with a basis set indicated in the example mixture sequence. The substituents are Hyd for hydrogen (H), Fluor for fluorine (F), Cyano for cyano (C#N) where the "#" indicates a triple bond, Tfm for trifluoromethyl (C(F)(F)(F)), Diohpr for dihydroxy homo propane (CC(O)CO), Benz for benzyl (c1ccccc1), Chlorbenz for chlorobenzene (c1c(Cl)cccc1), and Tfmbenz for trifluoromethylbenzene (c1c(C(F)(F)F)cccc1). (c) An actual single molecule component of the mixture shown in b.

representations in order to allow both sequence and substructure searching. However, mixture pools, consisting of different—but related—compounds do not lend themselves to a single atomic representation.

We developed CHORTLES, a method for representing mixtures as simple strings of characters. As with the previously described CHUCKLES method, this new method uses a monomer reference table which pairs a monomer name with an all-atom chemical SMILES¹⁷ or SMARTS.¹⁸ The CHORTLES language is a superset of CHUCKLES which allows mixtures to be specified as variability at monomer positions.

Conventional sequence searching^{19,20} assumes explicit representation of individual oligomers. Performing a sub-

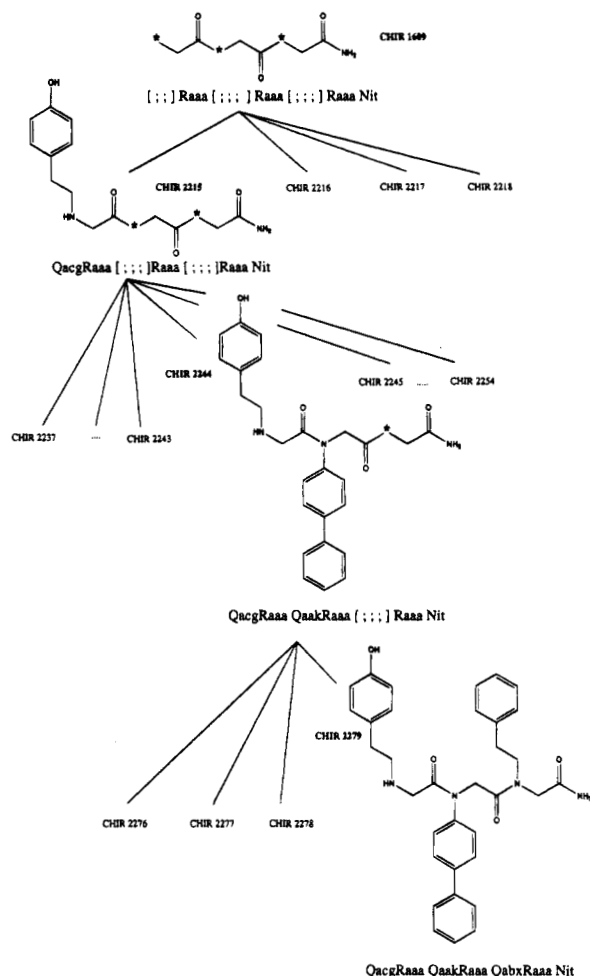
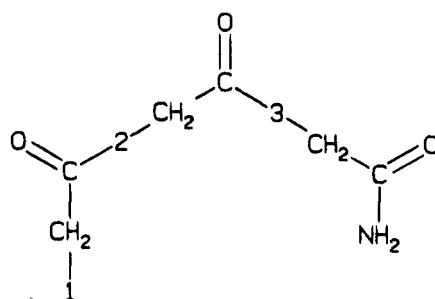


Figure 3. Deconvolution family hierarchy for α_1 -adrenergic receptor hit, CHIR 1609. The most general mixture with three mixture positions is deconvoluted into four children, each with the first position fixed. CHIR 2215, the active child, is further deconvoluted into its 17 children, each with the first two positions fixed. Of the 17 siblings, CHIR 2237–2254, CHIR 2244 is active and is further deconvoluted to four children which are individual compounds (all three positions fixed). CHIR 2279 is the compound responsible for most of the inhibition of the α_1 -adrenergic receptor.

sequence search with mixtures using currently available packages requires enumeration and storage of all component sequences within a mixture. Such explicit representation, with fixed positions repeated in each oligomer, would require prohibitive amounts of space. In addition, searching a mixture of n components would require n sequence comparisons per query. We touch on some search strategies here; we will describe a more comprehensive approach for searching CHORTLES in a subsequent paper.

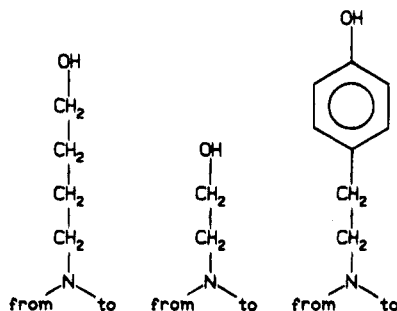
Synthetic combinatorial libraries contain hundreds to 10^6 molecules; a single phage-displayed peptide library may contain 10^{12} individual sequences. Enumeration of individual molecules in libraries would exceed the capability of even the largest database systems very rapidly. Furthermore, experiments (e.g., receptor binding assays) are performed on the mixture, not on the individual components of the mixture. Since experimental data only pertains to the mixture as a whole, we store and represent the mixture as a single entity. As a mixture is deconvoluted,¹⁴ one or more mixture positions is expanded into separate submixtures or individual compounds; these components can then be added to the database.

CHIR: 1609.1 --> 272 compounds

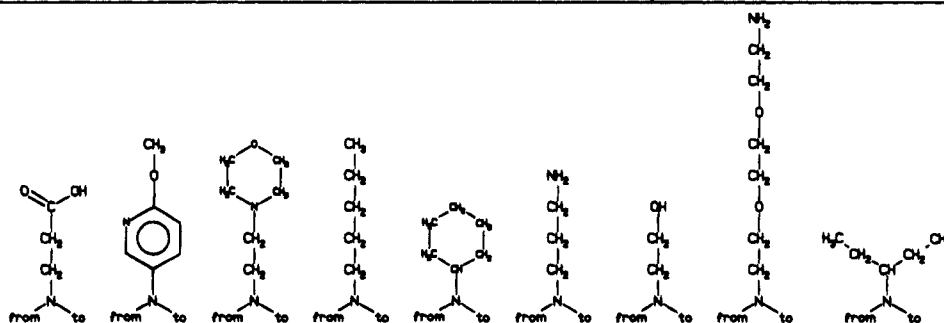


Mixture 1 --> 4 components

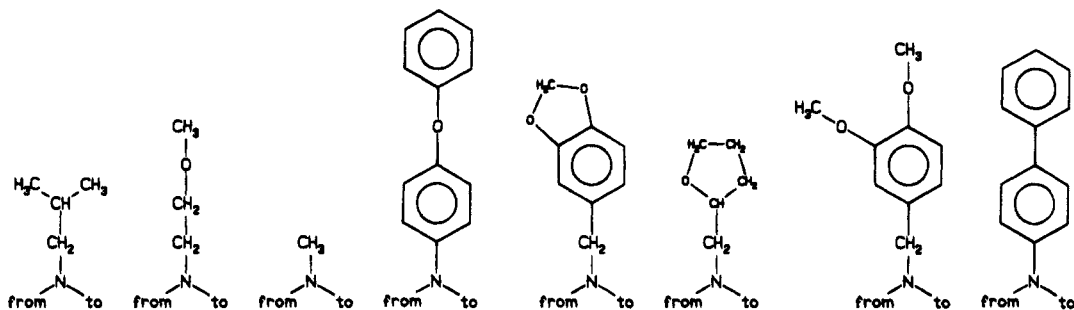
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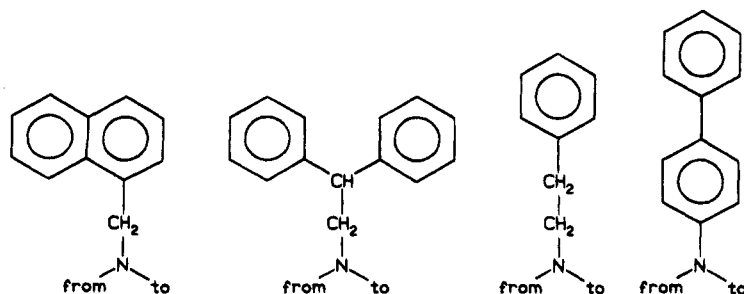
Mixture 2 ... --> 17 components



Mixture 2 (cont.)

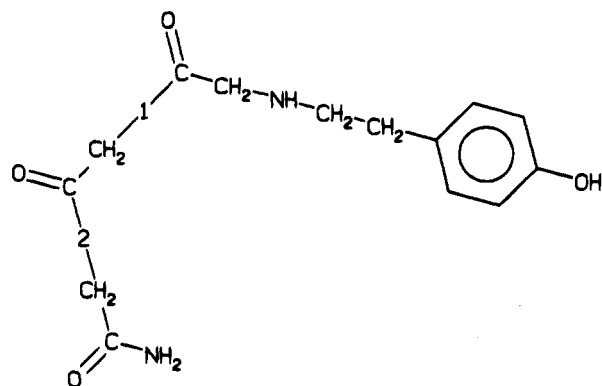


Mixture 3 --> 4 components



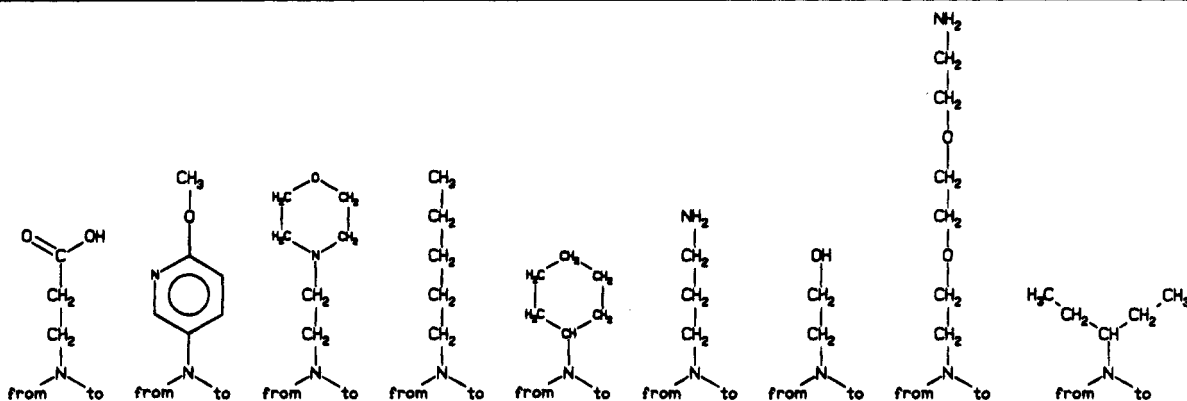
CHIR: 2215.1, PARENT: 1609.1

--> 68 compounds

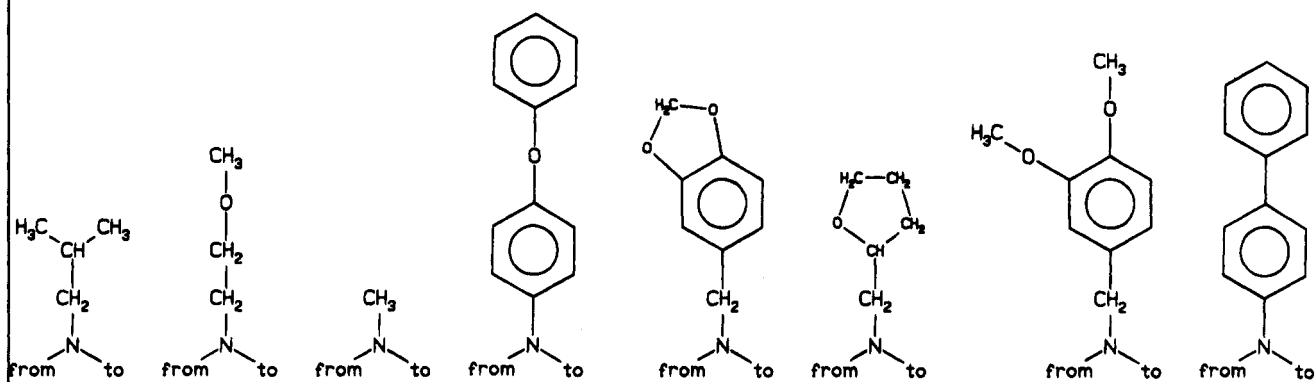


Mixture 1 ...

--> 17 components

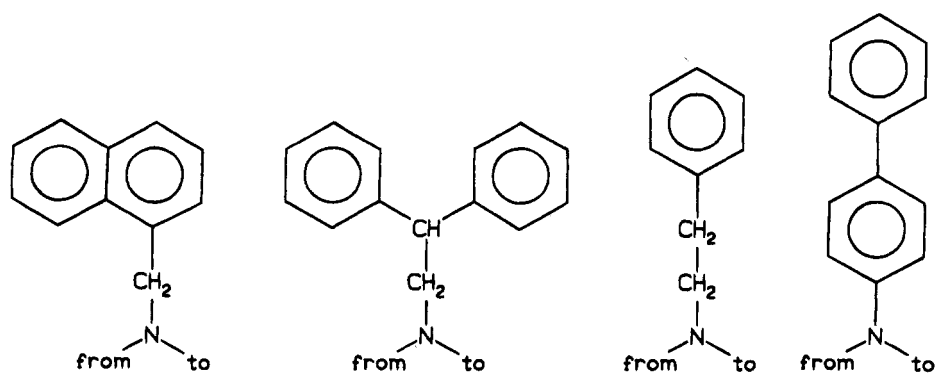


Mixture 1 (cont.)



Mixture 2

--> 4 components



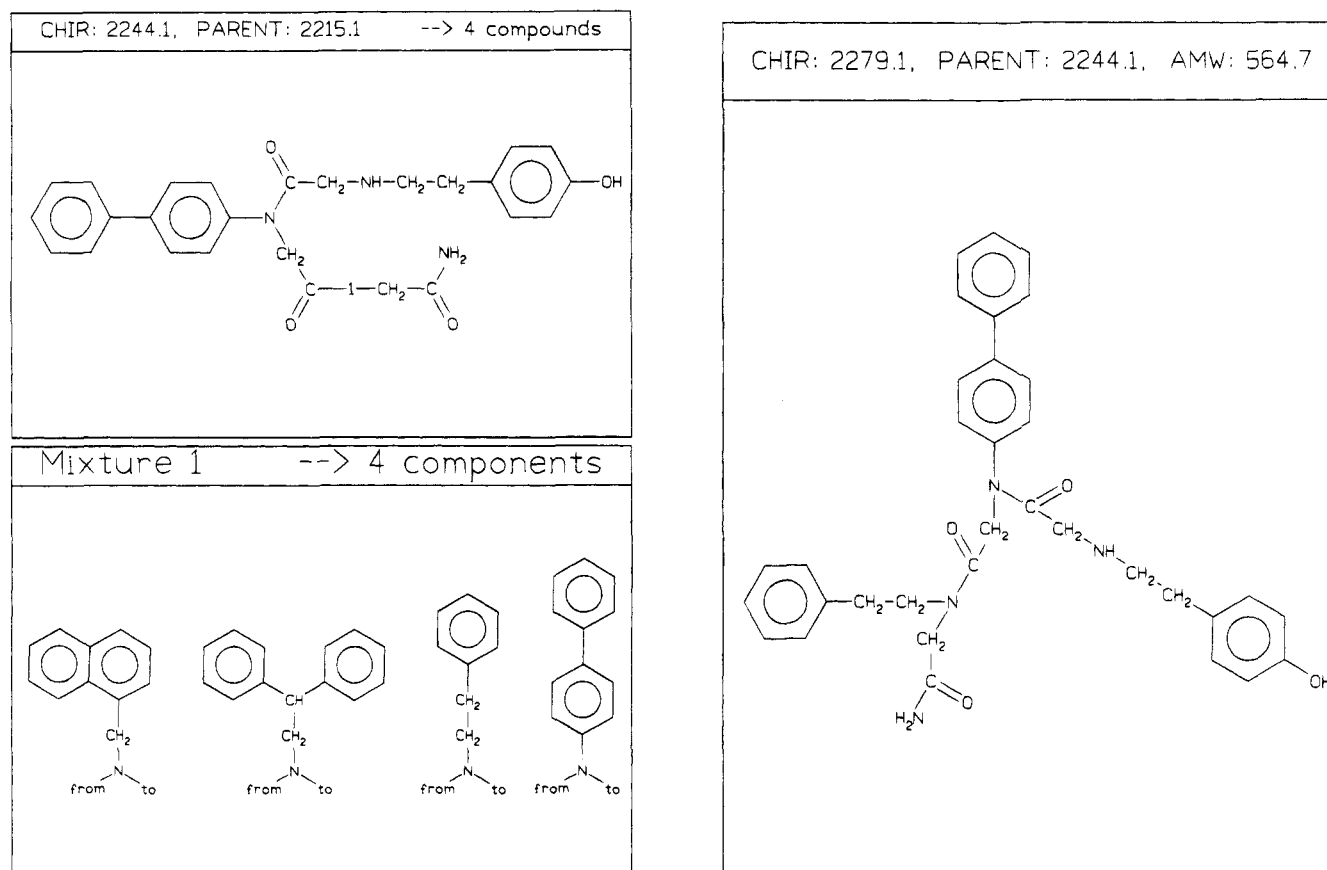


Figure 4. The combinatorial libraries which show successive deconvolution; each library is less complex than its predecessor by one position. The overall relationship between the libraries is shown in Figure 3. Full CHORTLES notation is described in the text. (a) CHIR 1609 mixture basis sets at all three positions in the trimer. Component amines are depicted in separate boxes. (b) CHIR 2215 mixture, child of 1609, represents a single level deconvolution of its parent. The first position is fixed; it has one fixed position and two mixture positions. This less complex library has three siblings; together they comprise all the components of the full library of the parent, 1609.1. (c) CHIR 2244 mixture represents a further deconvolution of the parent 2215. The first and second positions are now fixed and only one mixture position remains. (d) CHIR 2279, an individual compound, child of 2244, contains no mixture positions, and is the active member of siblings 2276–2279.

METHOD

Representation of Mixtures: Language Hierarchy. A mixture sequence is represented as a sequence of monomer names. Monomer names start with an upper-case letter followed by zero or more lower-case letters. Fixed positions are just the monomer name. Mixture positions are delineated by a pair of matching square brackets (“[” and “]”), containing the basis set monomer names separated by semicolons. A mixture sequence is canonicalized by alphabetizing all members of a basis set. This representation is extremely thrifty with space. For example, AlaNval[Arg;Lys;His]Val is a pool of three compounds: AlaNvalArgVal, AlaNvalLysVal, and AlaNvalHisVal, where positions one, two, and four are fixed positions, and position three is a mixture position. The mixture [Arg; Glu; Ile; Ser; Tyr][Arg; Glu; Ile; Ser; Tyr][Arg; Glu; Ile; Ser; Tyr] contains 125 compounds.

In our database, the mixture pool is stored under a canonical SMILES for the “parent” sequence where each mixture position is represented by the atom, “*”. We treat “*” as a valid atom. Using the CHUCKLES method, the sequence is converted into an all-atom graph and subsequently into a SMILES. See Figure 1a. This SMILES is the key in our database. Associated with this identifying SMILES, we have CHORTLES mixture sequences. All CHORTLES that are subordinate to a SMILES have the same

fixed positions but may have different basis sets at the mixture positions.

Because of the large number of monomers used in our libraries, we have automated naming of monomers. And with the submonomer approach to generating peptoid mixtures,⁹ we separate the name for the side-chain-containing amine from the back-bone segment. We name amines Qaaa, Qaab, Qaac, Backbone segments are represented by Raaa, Raab, Raac, See Figure 1b for a sample sequence.

Template-based mixtures differ from oligomeric mixtures because they contain multiple attachment points on a single template. The attachment points are built into the template. Benzodiazepine, represented by c98c&1c&2c&3c&4c9N&5C(=O)C&6N=C&7, has seven attachment points, represented by indices 1–7. The “&” preceding an index indicates that the bond will be satisfied outside the template monomer in the CHORTLES. The index 9 indicates a ring closure between the two atoms associated with it, likewise for index 8. See Figure 2a. In the mixture sequence, the substituents connected to the attachment points are disconnected monomers (separated by a “.” character) attached via an index matching an index on the template. The mixture Benzodiazepine1234567.Hyd1.[Hyd;Fluor;Cyano]-2.Hyd3.Hyd4.[Hyd;Tfm;Eoh;Diohpr]5.Hyd6.[Benz;-Chlorbenz;Tfmbenz]7 has fixed positions 1, 3, 4, and 6, and mixture positions 2, 5, and 7. See Figure 2b for illustration

and description of monomers at mixture positions. An individual compound for a template-based system might look like Benzodiazepine1234567.Hyd1.Fluor2.Hyd3.Hyd4.Diohpr5.Hyd6.Benz7, where the indices 1–7 refer to groups attaching at seven different positions on the benzodiazepine. See Figure 2c. Note that the template is simply another monomer and need not be more complex than any other component of the CHORTLES.

Representation of Mixtures: Combinatorial Library Relation Hierarchy. We link related mixtures in a hierarchy with more complex mixtures at the root. We call a mixture the parent when it is deconvoluted into individual compounds or less complex mixtures (with fewer mixture positions), known as the children. The children of a parent, which all contain the same mixture positions, are known as siblings. To permit traversal of such a deconvolution, we introduce the Mixture_Parent, Mixture_Child, and Mixture_Sibling pointer datatypes (simply directional pointers between related molecules/mixtures) into our database.

When a mixture is found to be a "hit" during screening against a target molecule, its components (children) are synthesized as submixtures and then screened against the same target. Figure 3 depicts the familial relationship between successive deconvolutions for an α_1 -adrenergic receptor hit.¹⁴ Consider the mixture CHIR 1609 *-Raaa-*-Raaa-*-Raaa-Nit (see Figure 4a) which consists of three mixture positions of peptoids. CHIR 1609 inhibited [³H]-prazosin binding to the α_1 -adrenergic receptor. To discover which component(s) of the mixture were inhibiting, the first deconvolution of the parent mixture was performed.

Deconvolution of the first position yields three child submixtures: CHIR 2215 QaaeRaaa-*-Raaa-*-Raaa-Nit, CHIR 2216 QabjRaaa-*-Raaa-*-Raaa-Nit, and CHIR 2217 QacgRaaa-*-Raaa-*-Raaa-Nit. See Figure 4b. These three submixtures are known as siblings. Subsequent synthesis and screening of these submixtures revealed that submixture CHIR 2215 inhibited prazosin binding to the α_1 -adrenergic receptor.

The new parent pool, CHIR 2215, was then deconvoluted into its 17 component children (CHIR 2237–2254), with both positions one and two fixed. See Figure 4c. Assaying these pools showed CHIR 2244 (QacgRaaa-QaakRaaa-*-Raaa-Nit) to be the most active.

The final mixture position in CHIR 2244 is then deconvoluted by the synthesis of its four children, CHIR 2276 (QacgRaaa-QaakRaaa-QaakRaaa-Nit), CHIR 2277 (QacgRaaa-QaakRaaa-QaatRaaa-Nit), CHIR 2278 (QacgRaaa-QaakRaaa-QabiRaaa-Nit), and CHIR 2279 (QacgRaaa-QaakRaaa-QabxRaaa-Nit). See Figure 4d. CHIR 2279 was the most potent inhibitor of the α_1 -adrenergic receptor ($K_i = 5 \pm 3$ nM).

Figures 4a–d illustrate a general, compact pictorial display of combinatorial libraries. These displays are generated by translating the CHORTLES code into its associated monomers at each position and sending the resulting SMILES file to the Daylight program, PRADO, which produces PostScript output.

Fast Mixture Sequence Searching. A mixture pool may represent any number of component oligomers or template-based molecules. One can expand the mixture sequence into a list of its components and then perform a substructure search on the molecular graphs of the individual components. However, enumerating a mixture is costly in time and space.

Brute-force Mixture Search Program

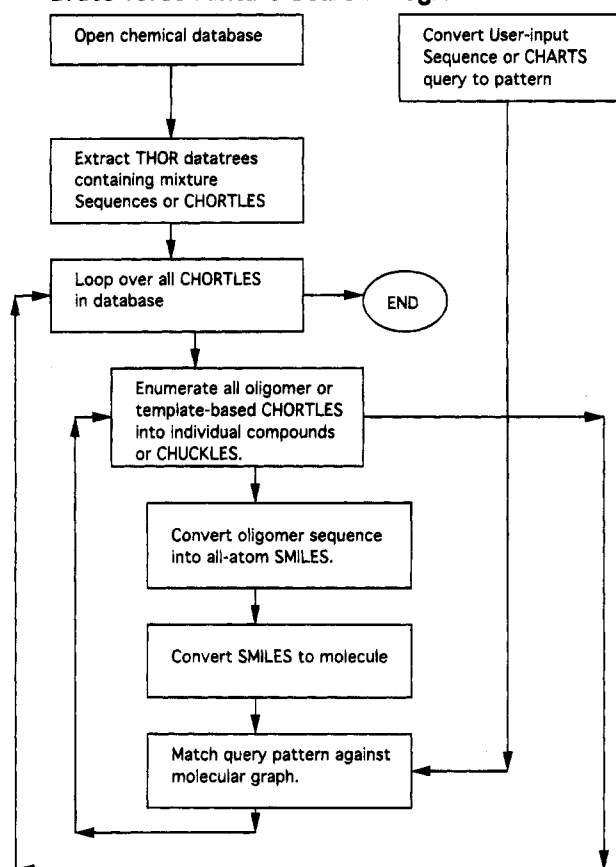


Figure 5. Brute-force mixture search flowchart. The query is turned into a pattern to be matched against the molecular graph of each enumerated member of the mixture. Each member is enumerated on the fly.

We have implemented a simple brute-force search algorithm which successively expands each mixture sequence into its component sequences and then converts these to all-atom structures for substructure searching.

We implemented this brute-force search method using toolkits from Daylight Chemical Information Systems, Inc. The first step is to convert the query CHORTLES or SMILES to a Daylight pattern. The database containing the CHORTLES mixtures is then opened, and all mixtures are extracted. For each CHORTLES (oligomeric or template-based), all components are enumerated, yielding individual molecules or CHUCKLES. Each CHUCKLES is then converted into the all-atom SMILES or molecular graph. This molecular graph is then converted into Daylight's molecule representation against which the pattern is matched. This approach makes use of the standard Daylight matching routines without any special search capabilities. When a match occurs, the search is terminated. See Figure 5 for a flow chart description of this search method.

Consider the benzodiazepine library in Figure 2. If one is looking for molecules which contain aromatic rings substituted with a fluorine (query: c1c(F)cccc1), nowhere in the database is such a ring explicitly represented. The aromatic ring is contained in the benzodiazepine template and the fluorine substituent is a monomer at position 2. However, the molecule represented by the query is not explicitly represented in the molecular graph in Figure 2b; a straightforward substructure search of the database will not yield a match. A brute-force expansion of the benzo-

600 Mega-bytes of storage space. However, one is not likely to have 100 000 mixture pools from the whole monomer set of 3000, so one can subdivide the monomer reference table for different classes of mixtures. Also, one can generate the bit strings on the fly.

Both the regular expression and bit-based searching cannot cross monomer boundaries as a full, atomic-level substructure search can, and, thus, monomer definitions can effect search success.

CONCLUSIONS

The use of oligomeric and template-based mixtures in drug-lead discovery presents us with new data storage problems. The CHORTLES method provides a straightforward, table-driven approach to accurate and compact representation of mixtures. The method lends itself to easy traversal of the mixture deconvolution hierarchy. Both the brute-force enumeration search and the bit-based search illustrate that all the data about the individual components can be derived from the CHORTLES mixture sequences.

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