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# Lexicographic unranking algorithms for the Twelfold Way\*

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## Abstract

The Twelfold Way represents Rota’s classification, addressing the most fundamental enumeration problems and their associated combinatorial counting formulas. These distinct problems are connected to enumerating functions defined from a set of elements denoted by  $\mathcal{N}$  into another one  $\mathcal{K}$ . The counting solutions for the twelve problems are well known. We are interested in unranking algorithms. Such an algorithm is based on an underlying total order on the set of structures we aim at constructing. By taking the rank of an object, i.e. its number according to the total order, the algorithm outputs the structure itself after having built it. One famous total order is the lexicographic order: it is probably the one that is the most used by people when one wants to order things. While the counting solutions for Rota’s classification have been known for years it is interesting to note that three among the problems have yet no lexicographic unranking algorithm. In this paper we aim at providing algorithms for the last three cases that remain without such algorithms. After presenting in detail the solution for set partitions associated with the famous Stirling numbers of the second kind, we explicitly explain how to adapt the algorithm for the two remaining cases. Additionally, we propose a detailed and fine-grained complexity analysis based on the number of bitwise arithmetic operations.

**2012 ACM Subject Classification** Mathematics of computing → Combinatorial algorithms; Theory of computation → Generating random combinatorial structures

**Keywords and phrases** Twelfold Way, Set partitions, Unranking, Lexicographic order

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## 1 Introduction

The Twelfold Way, a classification from the 1960s by Rota, was introduced to address the most fundamental enumeration problems associated with their combinatorial counting formulas. It has been extensively discussed in Stanley’s book [23, Section 1.9]. The distinct problems are related to the enumeration of functions defined from a set of elements denoted by  $\mathcal{N}$  into another set denoted by  $\mathcal{K}$ . The respective cardinalities of these sets are denoted as  $n$  and  $k$ . Each set may consist of either distinguishable or indistinguishable elements, resulting in consideration of four pairs of sets. Additional constraints pertain to the properties of the functions, whether they are injective, surjective, or arbitrary. Consequently, we encounter twelve cases when enumerating these functions. The counting solutions are well-known, as presented in Stanley’s book [23, Section 1.9]. In Table 1, we illustrate the classical combinatorial object enumerating each set of functions, in contrast to Stanley, who directly presents the counting solution.

In this paper, our focus lies in the generation of these classical combinatorial objects. To initiate our exploration, we arrange each object within a given class in lexicographic order. Subsequently, given the rank of an object, our goal is to construct it directly. This process is referred to as a *lexicographic unranking algorithm*. For instance, among the six permutations of  $\{1, 2, 3\}$ , the first one (with rank 0 in lexicographic order) is  $[1, 2, 3]$ , followed



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| elts of $\mathcal{N}$ |  | elts of $\mathcal{K}$ |  | $f$ is arbitrary   | $f$ is injective                                     | $f$ is surjective  |
|-----------------------|--|-----------------------|--|--|--|--|
| dist.                 |  | dist.                 |  | <b>1.</b>  | <b>2.</b>  | <b>3.</b>  |
|                       |  |                       |  | $n$ -sequence in $\mathcal{K}$                                     | $n$ -permutation of $\mathcal{K}$                    | composition of $\mathcal{N}$<br>with $k$ subsets               |
|                       |  |                       |  | $k^n$  | $k^n$  | $k! \cdot \left\{ \begin{matrix} n \\ k \end{matrix} \right\}$ |
| enumeration           |  |                       |  | easy   | [6, Section 5]                                       | Section 4.1  |
| lex. unranking        |  |                       |  |  |  |  |
| indist.               |  | dist.                 |  | <b>4.</b>  | <b>5.</b>  | <b>6.</b>  |
|                       |  |                       |  | $n$ -multisubset of $\mathcal{K}$                                  | $n$ -subset of $\mathcal{K}$                         | composition of $n$<br>with $k$ terms                           |
|                       |  |                       |  | $\binom{k+n-1}{n}$   | $\binom{k}{n}$                                       | $\binom{n-1}{n-k}$   |
| enumeration           |  |                       |  | see survey [6] and references therein                              |  |  |
| lex. unranking        |  |                       |  |  |  |  |
| dist.                 |  | indist.               |  | <b>7.</b>  | <b>8.</b>  | <b>9.</b>  |
|                       |  |                       |  | partition of $\mathcal{N}$<br>into $\leq k$ subsets                | partition of $\mathcal{N}$<br>into $\leq k$ elements | partition of $\mathcal{N}$<br>into $k$ subsets                 |
|                       |  |                       |  | $\sum_{i=0}^k \left\{ \begin{matrix} n \\ i \end{matrix} \right\}$ | $[n \leq k]$   | $\left\{ \begin{matrix} n \\ k \end{matrix} \right\}$          |
| enumeration           |  |                       |  | Section 4.2  | easy   | Theorem 11   |
| lex. unranking        |  |                       |  |  |  |  |
| indist.               |  | dist.                 |  | <b>10.</b>   | <b>11.</b>   | <b>12.</b>   |
|                       |  |                       |  | partition of $n$<br>into $\leq k$ parts                            | partition of $n$<br>into $\leq k$ parts $\{1\}$      | partition of $n$<br>into $k$ parts                             |
|                       |  |                       |  | $p_k(n+k)$   | $[n \leq k]$   | $p_k(n)$   |
| enumeration           |  |                       |  | [19, Section 4.8]  | easy   | [19, Section 4.8]  |
| lex. unranking        |  |                       |  |  |  |  |

■ **Table 1** The Twelfold Way\*

\*The notation  $k^n$  corresponds to the product  $k \cdot (k-1) \cdots (k-n+1)$ ;  $[n \leq k]$  is the Iverson bracket returning 1 when  $n \leq k$  and 0 otherwise;  $\left\{ \begin{matrix} \cdot \\ \cdot \end{matrix} \right\}$  and  $\binom{\cdot}{\cdot}$  stand respectively for the Stirling numbers of the second kind and binomial coefficients; and  $p_k(n)$  is the number of integer partitions of  $n$  into  $k$  positive integers.

by the second one (with rank 1), which is  $[1, 3, 2]$ , and so forth, culminating with the last one (rank 5) being  $[3, 2, 1]$ . Consequently, the lexicographic unranking algorithm for the function with rank 4 returns  $[3, 1, 2]$ . In Table 1, we provide references to such algorithms for 9 out of the 12 cases. However, for cases 3, 7, and 9, no knowledge about lexicographic unranking algorithms seems available in the literature. This paper introduces an approach to unranking in lexicographic order for the *set partitions of an  $n$ -set into  $k$  blocks* (case 9). Furthermore, we present extensions of this approach to address cases 3 and 7.

The problem of unranking objects emerges as one of the most fundamental challenge in combinatorial generation, as seen in [20], and is applicable in various domains such as software testing [16], optimization [8], or scheduling [24]. In different contexts, it serves as the core problem for generating complex structures, as observed in phylogenetics [2] and bioinformatics [1]. As mentioned earlier, to unrank, one must first establish a total order over the objects in question. The often-utilized order is the *lexicographic* order due to its ease of handling, leading to extensive study in the literature. However, Ruskey notes in [19, p. 59] that lexicographic generation is typically not the most efficient, thus requiring particular care in lexicographic unranking. Knuth dedicates a section to the lexicographic generation of combinatorial objects in [10], relating it to the special case of Gray codes.

Other combinatorial objects are also explored in Ruskey's and Kreher and Stinson's books on combinatorial generation [19, 11]. Skiena focuses on the practical implementation of such algorithms [21].

Usually, the approach for constructing structures using a recursive decomposition schema involves leveraging this decomposition to build a larger object from smaller ones. This method is extensively detailed in the well-known book by Nijenhuis and Wilf [17]. The approach has been systematically applied to decomposable objects in the context of analytic combinatorics, initially for recursive generation [5], and later for unranking methods [15].

**Related work.** Let us first quickly detail the classical unranking methods for the Twelvefold Way. As indicated in Table 1, cases 1, 8, and 11 are straightforward. In fact, an  $n$ -sequence in  $\mathcal{K}$  consists of a word of length  $n$  over the finite alphabet  $\mathcal{K}$ , making lexicographic unranking direct. Cases 8 and 11 are extreme situations, both corresponding to the Iverson bracket  $[n \leq k]$ . As a result, the enumeration problems contain either one function (only when  $n \leq k$ ) or none. The unranking method is trivial.

Cases 4, 5, and 6 are all associated with the enumeration of subsets and are directly related to combination enumerations. Various algorithms to solve such lexicographic unranking problems are relevant in the literature. In [6], we present a survey of the most efficient methods with a modern algorithm complexity analysis. Moreover, we introduce a new algorithm based on the factoradics number system, which is at least as efficient as the others.

Case 12 is associated with integer partition enumerations, and [11] presents an efficient recursive algorithm. This algorithm follows lexicographic order but for the reverse standard form of printing a partition. In standard form, partitions print the components from the largest to the smallest, whereas this algorithm is based on the reverse printing (from the smallest component to the largest one). It appears that, currently, there is no existing lexicographic unranking method specifically designed for the standard form of printing. case 10 can be considered an extension of case 12, much like case 7 is an extension of case 9.

The last three cases pertain to set partition problems. Various combinatorial objects, such as permutations with a specific pattern [3], graph coloring [9], walks in graphs [4], or trees for phylogenetics [2], are enumerated by set partitions. In a recent paper [13] the uniform random generating for set partitions for given  $n$  and  $k$  is studied, in the context of clustering algorithms. However, as far as we know, there is no lexicographic algorithm that takes arguments  $n, k$  and the rank  $r$ , returning the  $r$ -th partition in lexicographic order. Instead, there exists another classical object called a *restricted growth sequence* that is in bijection with set partitions (see [14, 19]). The unranking approaches presented in these works return such restricted growth sequences in lexicographic order. However, the natural bijection from restricted growth sequences to partitions does not preserve the lexicographic order.

**Main results.** To develop an efficient unranking generator for set partitions, we first introduce the lexicographic order over set partitions. Some care must be taken since we are dealing with sets of integers. Therefore, we use a standard printing of a set partition to obtain a canonical representation. We then introduce an *ad hoc* combinatorial algorithm to unrank set partitions in lexicographic order. Due to the very large integers manipulated in the algorithms, of order of  $n \ln n$  bits, our algorithm computes the necessary ones on-the-fly in a lazy paradigm. The correctness and complexity of the algorithm are managed based on specific combinatorial properties derived throughout the paper. Finally, we present some experiments using a Go<sup>1</sup> implementation for our algorithm. We leverage the simple

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<sup>1</sup> The Go language offers routines to manage `concurrency`.

and efficient parallelism mechanism provided by this language to significantly reduce space consumption without degrading time consumption for large values of  $n$ .

**Organization of the paper.** Following the introduction of the paper, Section 2 highlights the combinatorial aspects of set partitions and presents some preliminary properties. In Section 3, we introduce our method for unranking set partitions, providing key insights into proving the correctness and complexity of our approach. Additionally, we present ideas for running calculations in parallel and share experiments that validate our parallel approach. Finally, Section 4 presents extensions of our unranking algorithm to address cases 3 and 7 from the Twelfold Way.

## 2 Preliminaries

### 2.1 Context of set partitions

► **Definition 1.** Let  $S$  be a set of  $n$  distinguishable elements. A partition  $\pi$  of  $S$  in  $k$  blocks is a collection  $B_1, B_2, \dots, B_k$  of disjoint non-empty subsets of  $S$  such that for every element from  $S$  belongs to exactly one  $B_i$ , for  $i \in \{1, \dots, k\}$ .

As an example let  $S$  be  $\{1, \alpha, 2, 3, 4, \beta, 6, 12\}$ . The collection  $\{2, 3\}, \{4, 6, 12\}, \{\beta, 1, \alpha\}$  is a partition of  $S$  in 3 blocks. In the rest of for paper, the set of positive integers from 1 to  $n$  is denoted by  $\llbracket n \rrbracket$ . We can identify a set  $S$  of  $n$  elements with  $\llbracket n \rrbracket$ , thus from now we will only be interested in partitions for  $\llbracket n \rrbracket$ .

► **Definition 2.** Let  $1 \leq k \leq n$  be two positive integers and  $S$  be  $\llbracket n \rrbracket$ . The set of  $k$ -partitions of  $S$  is denoted by  $\mathcal{P}_k^n$ . The sequential form of a partition of  $\mathcal{P}_k^n$  (i.e. a  $k$ -partitions of  $S$ ) is such that for all  $i \in \llbracket k \rrbracket$ , the block  $B_i$  contains the smallest integer from  $\llbracket n \rrbracket$  not present in  $\cup_{j < i} B_j$ . Furthermore for each block, it is represented in the increasing order of its elements.

For example  $\{1\}, \{2, 3, 5\}, \{4, 6\}$  is a 3-partition of  $\llbracket 6 \rrbracket$  represented in its sequential form. The sequential form is a canonical representation of the partition. As a shortcut, we will from now represent a partition simply as 1/235/46. In the paper we have chosen to use the terminology and the notations from Mansour [14].

► **Fact.** Let  $1 \leq k \leq n$  be two positive integers. The number of partitions in  $\mathcal{P}_k^n$  is the Stirling number of the second kind denoted by  $\left\{ \begin{smallmatrix} n \\ k \end{smallmatrix} \right\}$ . It satisfies the following recurrence:

$$\left\{ \begin{smallmatrix} n \\ k \end{smallmatrix} \right\} = \begin{cases} \left\{ \begin{smallmatrix} n-1 \\ k-1 \end{smallmatrix} \right\} + k \cdot \left\{ \begin{smallmatrix} n-1 \\ k \end{smallmatrix} \right\} & \text{if } 1 < k < n; \\ 1 & \text{otherwise, i.e. when } k = 1 \text{ or } k = n. \end{cases} \quad (1)$$

This sequence is stored in OEIS A008277<sup>2</sup>. We now introduce a natural order over  $k$ -partitions.

► **Fact.** Let  $A$  and  $B$  two subsets of positive integers. We say that  $A \leq B$  iff either

- $A = B$ , or
- $A \subset B$  and  $\max(A) < \min(B \setminus A)$ , or
- $B \subset A$  and  $\min(A \setminus B) < \max(B)$ , or
- $\min(A \setminus B) < \min(B \setminus A)$ .

<sup>2</sup> OEIS stands for the On-line Encyclopedia of Integer Sequences.

The relation  $\leq$  is a total order over subsets of  $\llbracket n \rrbracket$ .

For example  $\{1, 3\} \leq \{1, 3, 4\}$  and  $\{1, 3\} \leq \{1, 4\}$ . But we also have  $\{1, 3, 4\} \leq \{1, 4\}$ .

► **Fact.** Let  $1 \leq k \leq n$  be two positive integers. The lexicographic order<sup>3</sup> over partitions from  $\mathcal{P}_k^n$ , in sequential form, is well defined using the latter order to compare two blocks: in fact a partition in  $k$  blocks is a Cartesian product of  $k$  subsets of positive integers.

There is another classical representation for partitions called *canonical form* in [14]. A partition in  $k$  blocks is represented as a word over a  $k$ -letters alphabet. For example the partition  $1/235/46$  is represented by the word  $122323$ . The  $i$ th letter is the index of the block containing the integer  $i$ . Using this representation we can also define a lexicographic order over partitions, but here we compare partitions that do not necessarily contain the same numbers of blocks. The lexicographic order over the sequential form is not compatible with the lexicographic order used for the sequential form we are interested in. This can be noted in the Table 2.

► **Definition 3.** Using the lexicographic order over the sequential form for partitions in  $\mathcal{P}_k^n$ , we define a ranking function assigning to each partition its rank corresponding to the number of  $k$ -partitions smaller than it in the lexicographic order.

| Rank | Partition | Canonical form [14] | Rank | Partition | Canonical form [14] |
|------|-----------|---------------------|------|-----------|---------------------|
| 0    | 1/2/345   | 12333               | 13   | 13/2/45   | 12133               |
| 1    | 1/23/45   | 12233               | 14   | 13/24/5   | 12123               |
| 2    | 1/234/5   | 12223               | 15   | 13/25/4   | 12132               |
| 3    | 1/235/4   | 12232               | 16   | 134/2/5   | 12113               |
| 4    | 1/24/35   | 12323               | 17   | 135/2/4   | 12131               |
| 5    | 1/245/3   | 12322               | 18   | 14/2/35   | 12313               |
| 6    | 1/25/34   | 12332               | 19   | 14/23/5   | 12213               |
| 7    | 12/3/45   | 11233               | 20   | 14/25/3   | 12312               |
| 8    | 12/34/5   | 11223               | 21   | 145/2/3   | 12311               |
| 9    | 12/35/4   | 11232               | 22   | 15/2/34   | 12331               |
| 10   | 123/4/5   | 11123               | 23   | 15/23/4   | 12231               |
| 11   | 124/3/5   | 11213               | 24   | 15/24/3   | 12321               |
| 12   | 125/3/4   | 11231               |      |           |                     |

■ **Table 2** Ranking of the 3-partitions of  $\llbracket 5 \rrbracket$

► **Definition 4.** Let  $1 \leq k \leq n$  be two positive integers. Let  $P$  be a partition from  $\mathcal{P}_k^n$ , represented in the sequential form as  $B_1/B_2/\dots/B_k$ . An integer subset  $p$  is called prefix of  $P$  if  $p \subset B_1$  and  $p \leq B_1$ .

For the partition  $12/35/4$ , there are three possible prefixes  $\emptyset, 1$  and  $12$ . We can further extend the definition of prefixes of a partition by letting  $S$  being any subset of  $\llbracket n \rrbracket$ . Thus removing the first block of the latter partition gives  $35/4$ , we define prefixes of the 2-partition (of  $\{3, 4, 5\}$ ) to be  $\emptyset, 3$  and  $35$ . Here we formalize this extension.

► **Definition 5.** The definition of a prefix  $p$  of a partition is extended to any set  $S$  partitioned in a sequence of blocks (with the first one being denoted by  $B_1$ ) such that  $p \leq B_1$ .

<sup>3</sup> The lexicographic order of partitions from  $\mathcal{P}_k^n$  in sequential form is a total order.

## 2.2 Combinatorial properties

We are now interested in counting results for partitions sharing the same prefix. These are the core results for our unranking algorithm.

► **Proposition 6.** *Let  $1 \leq k \leq n$  be two positive integers. Let  $\ell$  and  $d$  be two integers such that either  $\ell = d = 1$  or  $1 < \ell \leq d$ . Let  $S_k^n(\ell, d)$  be the number of partitions in  $\mathcal{P}_k^n$  accepting as prefix of length  $\ell$ :  $1 \alpha_2 \alpha_3 \dots \alpha_{\ell-1} d$ . We have*

$$S_k^n(\ell, d) = \sum_{u=0}^{\min(n-k-\ell+1, n-d)} \begin{Bmatrix} n-\ell-u \\ k-1 \end{Bmatrix} \binom{n-d}{u}.$$

**Proof.** First if  $\ell = d = 1$ , then in the sequential form the first block necessarily contains 1. Thus  $S_k^n(1, 1) = |\mathcal{P}_k^n| = \begin{Bmatrix} n \\ k \end{Bmatrix} = \sum_{u=0}^{n-k} \begin{Bmatrix} n-1-u \\ k-1 \end{Bmatrix} \binom{n-1}{u}$ . The latter equality is given e.g. in [7, p. 251, Table 251].

In the second case when  $1 < \ell \leq d$ , we aim at counting the number of partitions in  $\mathcal{P}_k^n$  accepting  $1 \alpha_2 \alpha_3 \dots \alpha_{\ell-1} d$  as a prefix. In order to exhibit a combinatorial interpretation, we rewrite  $S_k^n(\ell, d)$  as

$$S_k^n(\ell, d) = \sum_{u=0}^{\min((n-\ell)-(k-1), n-d)} \begin{Bmatrix} n-(\ell+u) \\ k-1 \end{Bmatrix} \binom{n-d}{u}.$$

Once the prefix is given, it remains to complete the first block  $B_1$  from the partition, and then to calculate how we can further partition the other elements in the next blocks. The variable  $u$  in the sum corresponds to the number of elements that are appended to the prefix to complete  $B_1$ . Its value ranges from 0 up to the maximal number of elements that we can append i.e.  $(n-\ell) - (k-1)$  because at least  $k-1$  among the remaining  $n-\ell$  elements must be assigned to the other  $k-1$  blocks. Obviously the number of possible elements  $u$  is also upper bounded by the number of remaining elements, i.e.  $n-d$ . Once the number  $u$  of elements for the completion of  $B_1$  is given, we choose  $u$  elements greater than  $d$ : the number of possibilities is given by the binomial coefficient. Finally it remains to build the other blocks of the partition: we partition  $n-(\ell+u)$  elements into  $k-1$  blocks. Hence the formula is proved. ◀

We introduce an example using Table 2 for  $\mathcal{P}_3^5$ . If we are interested in the prefix 13, then there are 3 partitions without completing block  $B_1$ , in the sum, when  $u = 0$  we get  $\begin{Bmatrix} 3 \\ 2 \end{Bmatrix} = 3$ . The other possible value is  $u = 1$  with the general term being  $\begin{Bmatrix} 2 \\ 2 \end{Bmatrix} \binom{2}{1} = 2$  as it appears in the table.

In order to get a formula that is more efficient to calculate, we observe that the latter numbers  $S_k^n(\ell, d)$  depend essentially in three variables instead of four. The proof is direct with some variable renaming.

► **Proposition 7.** *Let  $n, k, d$  be integers with  $0 \leq k \leq n$  and  $0 \leq d \leq n$ . By defining*

$$\tilde{S}_k^n(d) = \sum_{u=0}^{\min(n-k, n-d)} \begin{Bmatrix} n-u \\ k \end{Bmatrix} \binom{n-d}{u}, \text{ we get } S_k^n(\ell, d) = \tilde{S}_{k-1}^{n-\ell}(d-\ell).$$

We note that  $S_k^n(1, 1) = \tilde{S}_{k-1}^{n-1}(0) = \begin{Bmatrix} n \\ k \end{Bmatrix}$ . Note that the 3-dimension sequence  $\tilde{S}$  seems not to be stored in OEIS. There exists several generalizations of Stirling numbers, but none of them apparently corresponds to our sequence  $\tilde{S}$ .

► **Corollary 8.** *The numbers  $\tilde{S}_k^n(d)$  satisfy the following recurrence:*

$$\tilde{S}_k^n(d) = \begin{cases} \tilde{S}_{k-1}^{n-1}(d-1) + k \cdot \tilde{S}_k^{n-1}(d-1) & \text{if } 1 \leq k \leq n \text{ and } 1 \leq d \leq n; \\ \begin{cases} \{n+1\} \\ \{k+1\} \end{cases} & \text{if } d = 0 \text{ and } 0 \leq k \leq n; \\ 0 & \text{otherwise.} \end{cases} \quad (2)$$

Note the later recurrence is similar to the one satisfied by Stirling numbers of the second kind (but with here a third variable  $d$  giving some kind of level of numbers). The proof is provided in Appendix A.

► **Proposition 9.** *Let  $n, k, d$  be integers with  $0 \leq k \leq n$  and  $0 \leq d \leq n$ . The function  $\tilde{S}_k^n(d)$  can be represented as a binomial transform:*

$$\tilde{S}_k^n(d) = \sum_{u=0}^{\min(n-k, d)} (-1)^u \begin{Bmatrix} n+1-u \\ k+1 \end{Bmatrix} \binom{d}{u}.$$

The main idea of the proof consists in proving that the two expressions given in Propositions 7 and 9 are satisfying the same recurrence and thus are equal.

**Proof.** In order to prove this new expression for  $\tilde{S}$ , we just have to prove that this expression satisfy the recurrence stated in Corollary 8. Substituting  $d$  by 0 we get the base case. We now consider the case where the three integers  $n, k, d$  satisfy  $0 \leq k \leq n$  and  $1 \leq d \leq n$ . Using Proposition 9 in the case where  $0 < k < n$  (the cases  $k = 0$  or  $k = n$  are obvious) we have

$$\begin{aligned} \tilde{S}_{k-1}^{n-1}(d-1) + k \cdot \tilde{S}_k^{n-1}(d-1) &= \sum_{u=0}^{\min(n-k, d-1)} (-1)^u \begin{Bmatrix} n-u \\ k \end{Bmatrix} \binom{d-1}{u} \\ &\quad + k \cdot \sum_{u=0}^{\min(n-1-k, d-1)} (-1)^u \begin{Bmatrix} n-u \\ k+1 \end{Bmatrix} \binom{d-1}{u} \end{aligned}$$

By using factorization and Stirling numbers of the second kind recurrence, we obtain:

$$\tilde{S}_{k-1}^{n-1}(d-1) + k \cdot \tilde{S}_k^{n-1}(d-1) = \sum_{u=0}^{\min(n-k, d-1)} (-1)^u \left( \begin{Bmatrix} n+1-u \\ k+1 \end{Bmatrix} - \begin{Bmatrix} n-u \\ k+1 \end{Bmatrix} \right) \binom{d-1}{u}.$$

After having telescoped the two sums we get the stated result. ◀

Finally, given two prefixes, one being smaller than the second one, the next proposition allows to compute how many partitions are in-between the two prefixes. More formally:

► **Proposition 10.** *Let  $1 \leq k \leq n$  be two positive integers. Let  $d_1 \in \llbracket n \rrbracket \setminus \{1\}$ ,  $d_0 \in [d_1 - 1]$  and  $\ell > 1$  be integers. The number of elements of  $\mathcal{P}_k^n$  that admit a length- $\ell$  prefix satisfying  $1 \alpha_2 \dots \alpha_{\ell-2} d_0 \tilde{d}_1$  (for all  $\tilde{d}_1$  ranging from  $d_0 + 1$  to  $d_1$ ) is given by*

$$R_k^n(\ell, d_0, d_1) = \tilde{S}_{k-1}^{n-\ell}(d_0 - \ell) - \tilde{S}_{k-1}^{n-\ell}(d_1 + 1 - \ell).$$

The proof of the proposition is given in Appendix A.

### 3 Methods for unranking set partitions

Merging the combinatorial properties stated in the previous section, we are now ready to design algorithms to unrank set partitions in the lexicographic order.



### 3.1 Unranking algorithm design

Our aim consists in constructing the  $r$ -th partition related to a pair  $n, k$  in sequential form for the lexicographic order. The constructions follows the next main lines. The global idea consists in building the normalization of the partition. So we build together its block pattern and its reversed factoradics (seing the partition as a size- $n$  permutation).

- The building of the blocks is going from left to right;
- The construction of a block is also from left to right, component by component using a binary search approach;
- Finally once the block pattern and the reversed factoradics are set, a slight adaptation of the lexicographic permutation unranking algorithm gives the result.

The details for the correctness of our approach lies on the ranking function associated to the set partitions. Details about this function are presented in Appendix B.

We first present in detail the main function UNRANKING of Algorithm 1. Using a loop, at each turn it defines the next block of the partition and then refine the value of the rank related to the remaining part of the partition. The result  $B$  returned by NEXT\_BLOCK contains the indices of the components of the block that has been calculated and  $acc$  allows to update the rank so that it is related to the remaining part of the partition that must still be computed. With our previous definition,  $B$  is the normalization of the corresponding partition block. At the end of the function a dynamic extraction is executed in an array containing elements from 1 to  $n$  according to the indices in  $Res$ .

■ **Algorithm 1** Lexicographic unranking of the partition with rank  $r$  in  $\mathcal{P}_k^n$

---

|   |   |
|---|---|
| <pre> 1: function UNRANKING(<math>n, k, r</math>) 2:   <math>n' := n</math> 3:   <math>Res := []</math> 4:   while <math>k &gt; 1</math> do 5:     (<math>B, acc</math>) := NEXT_BLOCK(<math>n, k, r</math>) 6:     Append(<math>Res, B</math>) 7:     <math>r := r - acc</math> 8:     <math>n := n - len(B)</math> 9:     <math>k := k - 1</math> 10:  Append(<math>Res, [0, 0, \dots, 0]</math>) 11:  <math>Res := EXTRACT(n', Res)</math> 12:  return <math>Res</math> 1: function EXTRACT(<math>n, R</math>) 2:  <math>L := [1, 2, \dots, n]</math> 3:  <math>P := []</math> 4:  for <math>r</math> in <math>R</math> do 5:    <math>p := []</math> 6:    for <math>i</math> in <math>r</math> do 7:      Append(<math>p, L[i]</math>) 8:      Remove(<math>L, i</math>) 9:    Append(<math>P, p</math>) 10:  return <math>P</math> </pre> | <pre> 1: function NEXT_BLOCK(<math>n, k, r</math>) 2:  <math>Block := [0]; acc := \binom{n-1}{k-1}</math> 3:  if <math>r &lt; acc</math> then 4:    return (<math>Block, 0</math>) 5:  <math>d0 := 1; index := 2; inf := 2; sup := n</math> 6:  <math>complete := False</math> 7:  while not complete do 8:    while <math>inf &lt; sup</math> do 9:      <math>mid := \lfloor (inf + sup)/2 \rfloor</math> 10:     if <math>r \geq acc + R_k^n(index - 1, d0, mid - 1)</math> then 11:       <math>inf := mid + 1</math> 12:     else 13:       <math>sup := mid</math> 14:     <math>mid := inf; threshold := \binom{n-index}{k-1}</math> 15:     <math>acc := acc + R_k^n(index - 1, d0, mid - 2)</math> 16:     Append(<math>Block, mid - index</math>) 17:     if <math>r &lt; threshold + acc</math> then 18:       <math>complete := True</math> 19:     else 20:       <math>index := index + 1</math> 21:       <math>d0 := mid; inf := d0 + 1; sup := n</math> 22:       <math>acc := acc + threshold</math> 23:  return (<math>Block, acc</math>) </pre> |
|---|---|

---

Remove( $L, i$ ) removes element with index  $i$  in  $L$ .

The function NEXT\_BLOCK takes parameters  $n, k, r$  and returns essentially the first block of the  $r$ -th partition in  $\mathcal{P}_k^n$ . In fact, using Table 2 the call NEXT\_BLOCK(5, 3, 16) returns 0 1 1 (instead of 1 3 4), the latter block being obtained through a dynamic extraction of the element 0 in [1, 2, 3, 4, 5] then the element 1 is extracted in the remaining part [2, 3, 4, 5] and finally the element 1 in [2, 4, 5]. Constructing the blocks of indices instead of the blocks of values allows to neglect about the remaining elements for the further blocks construction. Note that

obviously the last block of the partition contains only the indices 0 (Line 10 from UNRANKING Algorithm) and the first element of a block is always index 0, both due to the sequential form. Finally while calling UNRANKING(5, 3, 16), at the end of Line 10, *Res* contains  $[[0\ 1\ 1][0][0]]$ . Reading the components from right to left we get the factoradics 0 0 1 1 0 of the number 8 corresponding to the lexicographic rank of the permutation  $[1, 3, 4, 2, 5]$  (cf. [6] for details).

► **Theorem 11.** *UNRANKING( $n, k, \cdot$ ) is a lexicographic unranking algorithm for set partitions from  $\mathcal{P}_k^n$ .*

**Proof key-ideas.** To derive the proof, we first rely on the factoradics of the rank number, and the RANKING function, both detailed in Appendix B. Hence the core property of our algorithm relies on the function NEXT\_BLOCK. Its call with parameters  $n, k, r$  returns the first block of the  $r$ -th partition of  $\mathcal{P}_k^n$  (in sequential form). After  $k - 1$  calls to it we get the pattern of the partition and also the factoradics for the underlying permutation. ◀

### 3.2 Complexity analysis and experiments for unranking

In our implementation in Go<sup>4</sup>, we offer two approaches for the necessary Stirling numbers calculations: either a precomputation of them or a computation on the fly of those that are needed at each step. We never precompute the 3 dimension table  $\tilde{S}_k^n(d)$ . In fact, in many bad cases these numbers are of order of  $n!$ , thus precomputing would be too expensive while only few of the numbers are needed. We compute the necessary numbers  $\tilde{S}_k^n(d)$  on the fly.

First let us recall the behavior of the sequence of Stirling numbers of the second kind when  $k$  is ranging from 1 to  $n$ .

► **Fact.** *Let  $1 \leq k \leq n$  be two positive integers. The sequence  $\left\{\binom{n}{k}\right\}$  is unimodal and its maximum is reached when  $k_n \sim n/\ln n$ . Around this value, we have  $\log \left\{\binom{n}{k_n}\right\} = \Theta(n \log n)$ <sup>5</sup>. Furthermore, we have an upper bound valid for all  $1 \leq k \leq n$ :*

$$\log \left\{\binom{n}{k}\right\} \leq (n - k) \log k + \log \binom{n}{k} \leq (n - k) \log k + k \log \left(\frac{n \cdot e}{k}\right).$$

See the fundamental paper of Rennie and Dobson [18] to get a proof for these results.

In the following we propose six distinct implementations of the function  $\tilde{S}$  presented in Proposition 7 and underlying the function  $R$  from Proposition 10.

- S\_v1: direct implementation of the formula stated in Proposition 7;
- S\_v2: implementation of the formula from Proposition 7 taking into account the symmetry of binomial coefficients, thus the sum contains half of the terms in comparison to S\_v1 (and thus half of the multiplications);
- S\_v3: direct implementation of the formula stated in Proposition 9;
- S\_v4: implementation of the formula from Proposition 9 taking into account the symmetry of binomial coefficients, thus the sum contains half of the terms in comparison to S\_v3;
- S\_v5: is our most efficient algorithm without precomputations. The calculation way consists in deciding according whether a call to S\_v2 or to S\_v4 should be the most efficient, according to the number of terms in the sums interacting with Propositions 7 and 9;
- S\_v6: all necessary Stirling numbers of the second kind are precomputed and this precomputation is not taken into account in the further time complexity experiments.

<sup>4</sup> Go implementation and the material used for repeating the experiments are all available [here](#).

<sup>5</sup> In this paper we use the notation  $\log$  for the logarithm in basis 2.

## XX:10 Lexicographic unranking for the Twelfold Way

The integers computed during the unranking algorithm are very large, thus a classical complexity in the number of arithmetical operations is not precise. We hence are interested in the bit-complexity, corresponding the the number of atomic operations on digits.

► **Theorem 12.** *For the time complexity, the algorithm UNRANKING based on each of the function  $S_v$  has a bit-complexity bounded by*

$$O\left(\frac{(n-k)^3 M(n)}{n} \ln n \log k + \frac{k(n-k)^2 M(n)}{n} \ln n \log\left(\frac{n \cdot e}{k}\right)\right),$$

where  $M(n)$  is the bit complexity for the multiplication of two numbers, each one containing  $n$  bits.

The naïve multiplication algorithm satisfies  $M(n) = \Theta(n^2)$ . But using, for example, Karatsuba algorithm, we obtain  $M(n) = \Theta(n^{\log_3 3})$  for the time complexity. In Go<sup>6</sup>, as soon as the integers are greater than  $2^{40}$ , Karatsuba multiplication algorithm is used. In our context, almost all cases are thus based on the latter algorithm.

**Proof.** We are interested in a worst case complexity analysis when  $n$  is large and for  $k$  ranging in  $\llbracket n \rrbracket$ . We are using the same kind of analysis in bit complexity as the one presented in [6, Section 4.3]. We compute an upper bound of the complexity in the central range of the Stirling numbers of the second kind. The central range, when  $n$  tends to infinity, is observed when  $k = \Theta(n/\ln n)$ . A detailed similar analysis is presented in the paper [12]. In our context each Stirling number necessitates  $\log \binom{n}{k}$  bits to be stored. They are multiplied by binomial coefficients containing at most  $n$  bits. Thus Stirling numbers are separated in blocks of  $n$  bits in order to use a multiplication of similar sizes numbers, inducing a time complexity bounded by  $\log \binom{n}{k} / n \cdot M(n)$ . Furthermore the number of calls the the function  $\tilde{S}$  is  $O((n-k) \ln n)$  induced by the repetitive calls to the binary search algorithm. Compiling all these upper bounds gives the stated bit-complexity. ◀

For approach  $S_v6$ , the following result establishes that the precomputation is negligible in terms of time complexity compared to the unranking itself. However note that the memory complexity is quadratic instead of linear (in  $n$ ) by using the precomputation step.

► **Proposition 13.** *The bit-complexity for the Stirling numbers precomputation is bounded by*

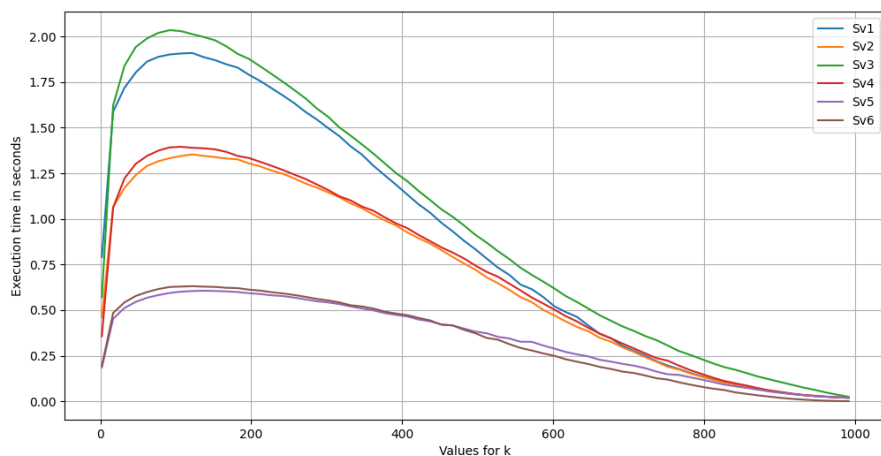
$$O\left(k(n-k)^2 M(\log k) + k^2(n-k) \frac{\log n}{\log k} M(\log k)\right).$$

In order to get the Stirling numbers on the fly, we use parallel computations. In fact, for each block determination, we observe that only two neighbors columns from the triangle of numbers are needed. Thus during the determination of a block, we compute in parallel the next two columns that will be necessary for the next block. Thanks to this approach, we present an algorithm which uses a reasonable quantity  $O(n)$  of memory and with essentially the same time complexity than the algorithm where Stirling numbers are exhaustively precomputed, thus needing  $O(n^2)$  memory size.

In Figure 1, we run experiments<sup>7</sup> by fixing  $n = 1000$  and  $k$  ranging from 2 to 992 with steps of 15 units. For each value of  $k$ , 500 uniform samples are computed and the average time

<sup>6</sup> Go documentation for `big integers manipulations`.

<sup>7</sup> The experiments provided in this paper are driven by using a PC equipped with an Intel Xeon X5677 processor, 32GB of DDR4-SDRAM and running Debian GNU/Linux 12.



■ **Figure 1** Time (in seconds) for unranking a partition in  $\mathcal{P}_k^{1000}$  when  $k$  is ranging in  $\llbracket 1000 \rrbracket$ .

for the building of the partition is drawn for each Algorithm S\_v1 up to S\_v6. Obviously Algorithms S\_v2 and S\_v4 are better than their naïve versions respectively S\_v1 and S\_v2. It is interesting to note that the optimization S\_v5, obtained by computing the most efficient formula between Propositions 7 and 9. Finally we remark that the Algorithm S\_v5 is almost as efficient as S\_v6 where all precomputation of Stirling numbers have been stored before the computation of the partition. Strangely, for the smallest values of  $k$ , we note that S\_v5 is even faster than S\_v6. This is probably due to the RAM accesses: in fact in some preliminary experiments with computers equipped with DDR5 RAM Algorithm S\_v6 is always faster than S\_v5, and this is what is expected.

## 4 Extension and conclusion

As we observe in Table 1, both enumeration cases 3 and 7 are some extended version of the enumeration case 9. An adaptation for the RANKING function allows to rank the families counted by cases 3 and 7; then adapting the unranking algorithm solves these cases.

### 4.1 Ordered set partitions

Recall Stirling numbers of the second kind are counting the numbers of surjective functions from set  $N$  to set  $K$ , where the elements of  $N$  are distinguishable and also for those in  $K$ . We can represent these functions as set partitions. Now, what happens when elements of  $K$  are distinguished? These functions are counted by *ordered Stirling numbers of the second kind*. In addition, they can be represented as *ordered set partitions*, which are similar to set partitions except that the order of the subsets matters. For instance, while in the world of unordered set partitions, elements 14/25/3; 14/3/25; 25/14/3; 25/3/14; 3/14/25 and 3/25/14 are equivalent and represented by the partition 14/25/3 in sequential form, in the world of ordered set partition, the 6 elements are all different.

► **Proposition 14.** *Let  $1 \leq k \leq n$ , be two integers with  $n$  being the cardinality of set  $N$ . The number of ordered set partition of  $N$  in  $k$  (non empty disjoint) subsets is  $k! \cdot \left\{ \begin{smallmatrix} n \\ k \end{smallmatrix} \right\}$ . The family of these partition is denoted by  $\mathcal{O}_k^n$ .*

## XX:12 Lexicographic unranking for the Twelfold Way

The proof is direct: the blocks in the sequential form of a set partition are distinguishable, thus permuting them gives the associated ordered set partitions.

► **Fact.** Let  $1 \leq k \leq n$ , be two integers, the lexicographic order on set partitions  $\mathcal{P}_k^n$  is easily extended to get the lexicographic order for the ordered set partitions from  $\mathcal{O}_k^n$ .

We can now derive the enumeration core result in this new context.

► **Proposition 15.** Let  $1 \leq k \leq n$  be two integers. Let  $\ell$  and  $d$  be two integers such that either  $\ell = d = 1$  or  $1 < \ell \leq d$ . Let  $T_k^n(\ell, d)$  be the number of ordered set partitions in  $\mathcal{O}_k^n$  accepting of the prefix of length  $\ell$ :  $\alpha_1 \dots \alpha_{\ell-1} d$ .

$$T_k^n(\ell, d) = \sum_{u=0}^{\min(n-k-\ell+1, n-d)} k! \begin{Bmatrix} n-\ell-u \\ k-1 \end{Bmatrix} \binom{n-d}{u}.$$

This formula is the analogous to  $S_k^n(\ell, d)$ . Using the same variable changes, we also get a three variable function, like  $\tilde{S}_k^n(d)$ . Then we can deduce an adaptation of our first algorithm by replacing Stirling numbers of the second kind by ordered Stirling numbers of the second kind and using the latter formula.

### 4.2 Bell's set partitions

In the twelfold way, the remaining case where no lexicographic unranking algorithm is known is when  $f$  is an arbitrary function from a set  $\mathcal{N}$  whose elements are distinguishable to a set  $\mathcal{K}$  where elements are indistinguishable. We denote by  $\mathcal{F}$  the family of these functions. Such functions can be represented as unordered set partitions with at most  $k$  blocks where  $k$  is the numbers of elements in  $\mathcal{K}$ .

Let  $\mathcal{K}_i \subset \mathcal{K}$  be a subset of  $i$  distinguishable elements and  $\mathcal{B}_i$  the functions that are surjective from  $\mathcal{N}$  into  $\mathcal{K}_i$ . We have  $\mathcal{B}_k^n = \bigcup_{i=1}^k \mathcal{B}_i$  and for a given  $i \in \llbracket k \rrbracket$ ,  $|\mathcal{B}_i| = \left\{ \begin{smallmatrix} n \\ i \end{smallmatrix} \right\}$ . Obviously  $|\mathcal{B}_k^n| = \sum_{i=0}^k |\mathcal{B}_i| = \sum_{i=0}^k \left\{ \begin{smallmatrix} n \\ i \end{smallmatrix} \right\}$ . The cardinality of  $\mathcal{B}_k^n$  is counted by the  $k$ -restricted Bell numbers and finally, when  $k = n$ , we get the Bell numbers.

► **Fact.** Let  $1 \leq k \leq n$ , be two integers, the lexicographic order on set partitions  $\mathcal{P}_k^n$  is also lexicographic for  $\mathcal{B}_k^n$ .

► **Proposition 16.** Let  $1 \leq k \leq n$  be two integers. Let  $\ell$  and  $d$  be two integers such that either  $\ell = d = 1$  or  $1 < \ell \leq d$ . Let  $U_k^n(\ell, d)$  be the number of Bell's set partitions in  $\mathcal{B}_k^n$  accepting of the prefix of length  $\ell$ :  $1 \alpha_2 \dots \alpha_{\ell-1} d$ .

$$U_k^n(\ell, d) = \sum_{u=0}^{\min(n-k-\ell+1, n-d)} \sum_{i=1}^k \begin{Bmatrix} n-\ell-u \\ i-1 \end{Bmatrix} \binom{n-d}{u}.$$

Again, his formula is the analogous to  $S_k^n(\ell, d)$ . Using the same variable changes, we also get a three variable function, like  $\tilde{S}_k^n(d)$ . Then we can deduce an adaptation of our first algorithm by replacing Stirling numbers of the second kind by Bell's number and using the latter formula.

As a final remark, the correctness of both previous algorithms is directly hanging to the one for the set partition algorithm. What is remaining is their complexity analysis: it is not difficult, and it will be written in a long version of this paper.

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**A** Appendix related to the formulas for  $\tilde{S}$

Here we provide the proof of the recursive equation satisfied by  $\tilde{S}_k^n(d)$ .

**Proof of Corollary 8.** We aim at proving that this recurrence is satisfied by the formula  $\tilde{S}_k^n(d)$  given in Proposition 7. Let  $0 \leq k \leq n$  be two integers. We get the value  $S_k^n(0) = \sum_{u=0}^{n-k} \left\{ \begin{matrix} n-u \\ k \end{matrix} \right\} \binom{n}{u} = \left\{ \begin{matrix} n+1 \\ k+1 \end{matrix} \right\}$  according to [7, p. 251]. We now consider the case where the three integers  $n, k, d$  satisfy  $0 \leq k \leq n$  and  $1 \leq d \leq n$ . Using Proposition 7 in the case where  $0 < k < n$  (the cases  $k = 0$  or  $k = n$  are obvious) we have

$$\begin{aligned} \tilde{S}_{k-1}^{n-1}(d-1) + k \cdot \tilde{S}_k^{n-1}(d-1) &= \sum_{u=0}^{\min(n-k, n-d)} \left\{ \begin{matrix} n-1-u \\ k-1 \end{matrix} \right\} \binom{n-d}{u} \\ &\quad + k \cdot \sum_{u=0}^{\min(n-1-k, n-d)} \left\{ \begin{matrix} n-1-u \\ k \end{matrix} \right\} \binom{n-d}{u} \\ &= \sum_{u=0}^{\min(n-k, n-d)} \left( \left\{ \begin{matrix} n-1-u \\ k-1 \end{matrix} \right\} + k \cdot \left\{ \begin{matrix} n-1-u \\ k \end{matrix} \right\} \right) \binom{n-d}{u}. \end{aligned}$$

Using the classical recurrence for Stirling numbers of the second kind (*cf.* Equation (1)) we obtain the stated result. ◀

**Proof of Proposition 10.** Using the notations from the proposition statement, we are interested in the number of set partitions from  $\mathcal{P}_k^n$  accepting as prefix  $1 \alpha_2 \dots \alpha_{\ell-2} d_0 \tilde{d}_1$ , when  $\tilde{d}_1$  ranges in  $\{d_0 + 1, \dots, d_1\}$ . So using the approach exhibited in the proof of Proposition 6, we get

$$\begin{aligned} R_k^n(\ell, d_0, d_1) &= \sum_{u=1}^{\min(n-k-\ell+1, n-d_0)} \left\{ \begin{matrix} n-\ell-u \\ k-1 \end{matrix} \right\} \binom{n-d_0}{u} \\ &\quad - \sum_{u=1}^{\min(n-k-\ell+1, n-1-d_1)} \left\{ \begin{matrix} n-\ell-u \\ k-1 \end{matrix} \right\} \binom{n-1-d_1}{u}. \end{aligned}$$

In fact the first sum computes the number of partition accepting prefix  $1 \alpha_2 \dots \alpha_{\ell-2} d_0$ , but the first block contains at least one more element (since  $u$  starts at 1). To those partitions we remove the ones whose first block is completed only with elements greater than  $d_1$ . Then if we add the terms  $u = 0$  in both sums, this terms are opposite, thus we can rewrite

$$R_k^n(\ell, d_0, d_1) = \tilde{S}_{k-1}^{n-\ell}(d_0 - \ell) - \tilde{S}_{k-1}^{n-\ell}(d_1 + 1 - \ell),$$

as stated in Proposition 10. ◀

## B Appendix related to the ranking algorithm

In order to introduce the way to rank a set partition, we first recall the definition of the factorial number system, or factoradics. It is a mixed radix numeral system in which the representation of integers relies on the use of factorial numbers. The factoradics are deeply related to the lexicographic (un)ranking of permutations. Details and references are presented in our paper [6].

► **Definition 17.** *Let  $u$  be a positive integer and let  $n$  be the unique integer satisfying  $(n-1)! \leq u < n!$ . Then there exists a unique sequence of integers  $(f_\ell)_{\ell \in \{0, \dots, n-1\}}$ , with  $0 \leq f_\ell \leq \ell$  for all  $\ell$ , such that:*

$$u = f_0 \cdot 0! + f_1 \cdot 1! + \dots + f_{n-2} \cdot (n-2)! + f_{n-1} \cdot (n-1)!$$

The finite sequence  $f_0 f_1 \dots f_{n-1}$  is called the factoradic decomposition (or factoradics) of  $u$  (note that  $f_0 = 0$  for all values for  $u$ ).

Take the number  $u = 41\,196$  as an example, we obtain the following decomposition:  $41\,196 = 0 \cdot 0! + 0 \cdot 1! + 0 \cdot 2! + 2 \cdot 3! + 1 \cdot 4! + 1 \cdot 5! + 1 \cdot 6! + 0 \cdot 7! + 1 \cdot 8!$ , thus its factoradics is  $0\,0\,0\,2\,1\,1\,1\,0\,1$ . Obviously 0s can be appended to the right of the factoradics without changing the integer.

► **Fact.** *Let  $n$  be a positive integer. The factoradics with  $n$  components relates the lexicographic rank of a permutation and the permutation itself.*

This deep link is, for example, described in our previous paper [6].

Let us further introduce two new notations. Let  $1 \leq k \leq n$  be two positive integers. Let  $P$  be a partition from  $\mathcal{P}_k^n$ , represented in its sequential form  $B_1/B_2/\dots/B_k$ . For  $i \in \llbracket k \rrbracket$ , we denote by  $t_i$  the number of elements of the block  $B_i$  and for  $j \in [t_i]$ , the notation  $B_{i,j}$  refers to the  $j$ -th element of  $B_i$ . We further denote by  $t_{<i}$  the accumulated number of elements in  $B_1/\dots/B_{i-1}$ , i. e.  $t_{<i} = \sum_{j=1}^{i-1} t_j$ .

► **Definition 18.** *Let  $1 \leq k \leq n$  be two positive integers. Let  $P \in \mathcal{P}_k^n$  be a partition written in sequential form. The normalization of  $P$ , denoted by  $\bar{P}$  consists in the collection  $\bar{B}_1/\bar{B}_2/\dots/\bar{B}_k$ , such that each element  $\bar{B}_{i,j}$  is equal to  $B_{i,j}$  translated by  $-\{|\ell \mid \exists i_0 \leq i \text{ and } B_{i_0,\ell} \leq B_{i,j}\}|$ .*

For example, for  $P$  the set partition from  $\mathcal{P}_3^{10}$  written in sequential form :  $P = 13/25679/4810$ , we get  $\bar{P} = 01/01112/000$ . Using the normalization of a set partition is such that, once the first blocks have been computed, the rest of the partition can be constructed without considering the elements appearing in the previous blocks. We gain some kind of independence between the blocks. Obviously this is only a relative independence. Once we want to get the set partition itself, we take care of the remaining elements when the first blocks have been determined.

► **Theorem 19.** *Let  $1 \leq k \leq n$  be two positive integers. Let  $P \in \mathcal{P}_k^n$  be a partition written in sequential form and  $\bar{P} = \bar{B}_1/\bar{B}_2/\dots/\bar{B}_k$  its normalization. The rank of  $P$  for the lexicographic order is given by*

$$\text{RANKING}(P) = \sum_{i=1}^{k-1} \sum_{\ell=2}^{t_i} \left( \binom{n - t_{<i} - \ell + 1}{k - i} + R_{k-i+1}^{n-t_{<i}}(\ell, \bar{B}_{i,\ell-1} + \ell - 1, \bar{B}_{i,\ell} + \ell - 1) \right).$$



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**Proof key-ideas.** Let  $1 \leq k \leq n$  be two positive integers. Let  $P \in \mathcal{P}_k^n$  be a partition and  $\bar{P}$  its normalization written as  $\bar{B}_1/\bar{B}_2/\dots/\bar{B}_k$ . The RANKING function takes into account the block pattern of  $P$  and the rank of  $P$  seen as a size  $n$  permutation (i.e. by omitting the block pattern of  $\bar{P}$ ) to produce the lexicographic rank of  $P$  seen as a partition from  $\mathcal{P}_k^n$ .

First of all, from  $P$  (or  $\bar{P}$ ) we deduce the values for  $n$  and  $k$ . Then, in order to compute the rank associated of  $P$ , we iterate the following process from left to right, block by block. We do not need to consider the remaining values once a block has been built due to the normalization  $\bar{P}$ .

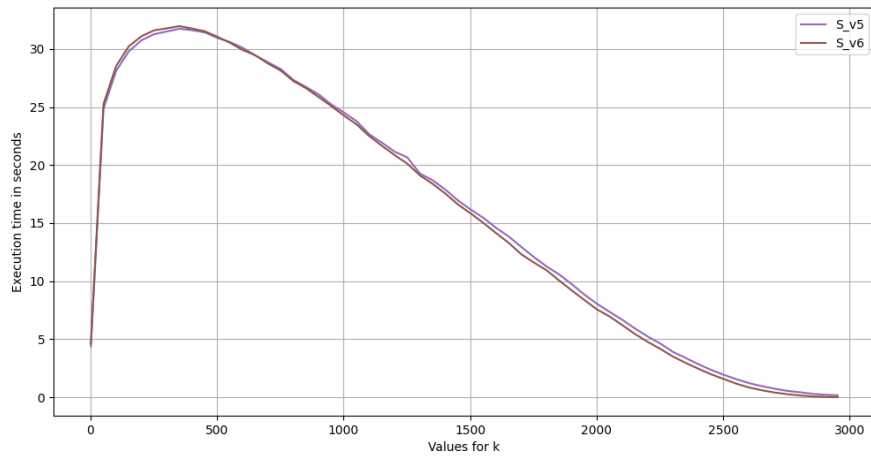
So let us suppose we are interested in the first block. We iterate over all prefixes  $p$  smaller than  $\bar{B}_1$ , and accumulate the numbers of partitions accepting  $p$  as a prefix, because all of them are smaller than  $P$  in the lexicographic order. These numbers are calculated using functions  $S_k^n$  and  $R_k^n$ . Once done we get the first possible value for the rank of  $P$ , and also its maximal value again by using  $S_k^n$  (the upper bound is not necessary for the rest of the process). We then start again with the next block, keeping in memory the accumulated value. ◀

Let us present on our running example the process. So we are dealing with  $P$  whose normalization is 01/01112/000. We thus deduce  $n = 10$  and  $k = 3$ . The accumulated rank is 0 for the moment. Starting with the first block 01 we increase the accumulated rank by 255 corresponding to the number of set partitions whose first normalized block is reduced to 0, i. e.  $\binom{9}{2}$ . We further increase the rank by 3025 that corresponds to all set partitions whose first block is of length at least 2 and that accept 0 as a prefix, but not 01. At this point, we have used all information from the first normalized block and memorized it into the accumulated rank whose value is now 3280. The second block starts with 0 and the number of set partitions with a block reduced to 0 is now  $\binom{7}{1} = 7$ , i. e. it remains 7 elements to fill the last block. Then the number of partitions whose (first) normalized block is of length at least 2 and that accept 0 as a prefix, but not 01 is 63. Thus the accumulated rank is now 3344. At this point we suppose the second block starts with 01 and first it is reduced to 01, there is only 1 in this situation (all other elements fill the last block). We now are interested in the number of partitions whose (first) normalized block is of length at least 3 and that accept 01 as a prefix, but not 011. Their count is 0 (010 is not an acceptable prefix). Thus the accumulated rank is now 3345. It remains two steps as the previous ones to finally obtain the rank 3351 for the set partition  $P$ .

Finally, as a conclusion, taking the lexicographic rank of a partition, the values  $n$  and  $k$ , and following an analogous process as the previous one (but not the reversed process because it is more convenient to do the exhibition of the normalized partition from left to right) we obtain an algorithm for lexicographic unranking.

### C Appendix related to the unranking algorithm

Let us introduce a second experiments in Figure 2 for larger set partitions. We do not observe here anymore Algorithm S\_v5 that is more efficient than S\_v6. When we compute the ratio of time necessary for both algorithms, we note when  $n$  is increasing the ratio is tending to 1 until when  $k$  is almost  $n$  (then there is almost nothing to compute for obtaining a set partition while the computing of a linear number of Stirling numbers of the second is costly and present using S\_v5 algorithm).



■ **Figure 2** Time (in seconds) for unranking a partition in  $\mathcal{P}_k^{3000}$  when  $k$  is ranging in  $[[3000]]$ .