

# Approximation Algorithms for Mixed Fractional Packing and Covering Problems

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We study general mixed fractional packing and covering problems ( $MPC_\epsilon$ ) of the following form: Given a vector  $f : B \rightarrow \mathbb{R}_+^M$  of  $M$  nonnegative continuous convex functions and a vector  $g : B \rightarrow \mathbb{R}_+^M$  of  $M$  nonnegative continuous concave functions, two  $M$  - dimensional nonnegative vectors  $a, b$ , a nonempty convex compact set  $B$  and a relative tolerance  $\epsilon \in (0, 1)$ , find an approximately feasible vector  $x \in B$  such that  $f(x) \leq (1 + \epsilon)a$  and  $g(x) \geq (1 - \epsilon)b$  or find a proof that no vector is feasible (that satisfies  $x \in B$ ,  $f(x) \leq a$  and  $g(x) \geq b$ ).

The fractional packing problem with convex constraints, i.e. to find  $x \in B$  such that  $f(x) \leq (1 + \epsilon)a$ , is solved in [4, 5, 8] by the Lagrangian decomposition method in  $O(M(\epsilon^{-2} + \ln M))$  iterations where each iteration requires a call to an approximate block solver  $ABS(p, t)$  of the form: find  $\hat{x} \in B$  such that  $p^T f(\hat{x}) \leq (1 + t)\Lambda(p)$  where  $\Lambda(p) = \min_{x \in B} p^T f(x)$ . Furthermore, Grigoriadis et al. [6] proposed also an approximation algorithm for the fractional covering problem with concave constraints, i.e. to find  $x \in B$  such that  $g(x) \geq (1 - \epsilon)b$ , within  $O(M(\epsilon^{-2} + \ln M))$  iterations where each iteration requires here a call to an approximate block solver  $ABS(q, t)$  of the form: find  $\hat{x} \in B$  such that  $q^T g(\hat{x}) \geq (1 - t)\Lambda(q)$  where  $\Lambda(q) = \max_{x \in B} q^T g(x)$ . Both algorithms solve also the corresponding min-max and max-min optimization variants within the same number of iterations. Furthermore, the algorithms can be generalized to the case where the block solver has arbitrary approximation ratio [7, 8, 9].

Further interesting algorithms for the fractional packing and fractional covering problem with linear constraints were developed by Plotkin et al. [13] and Young [15]. These algorithms have a running time that depends linearly on the width - an unbounded function of the input instance. Several relatively complicated techniques were proposed to reduce this dependence. Garg and Könemann [3] described a nice algorithm for the fractional packing problem with linear constraints that needs only  $O(M\epsilon^{-2} \ln M)$  iterations.

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For the mixed packing and covering problem (with linear constraints), Plotkin et al. [13] proposed also approximation algorithms where the running time depends on the width. Young [16] described an approximation algorithm for a special mixed packing and covering problem with linear constraints and special convex set  $B = \mathbb{R}_+^N$ . The algorithm has a running time of  $O(M^2 \epsilon^{-2} \ln M)$ . Recently, Fleischer [1] gave an approximation scheme for the optimization variant (minimizing  $c^T x$  such that  $Cx \geq b$ ,  $Px \leq a$  and  $x \geq 0$  where  $a$ ,  $b$ , and  $c$  are nonnegative integer vectors and  $P$  and  $C$  are nonnegative integer matrices).

Young [16] posed the following interesting open problem: find an efficient width-independent Lagrangian-relaxation algorithm for the mixed packing and covering problem (with linear constraints): find  $x \in B$  such that  $Px \leq (1 + \epsilon)a$ ,  $Cx \geq (1 - \epsilon)b$ , where  $P, C$  are nonnegative matrices,  $a, b$  are nonnegative vectors and  $B$  is a polytope that can be queried by an optimization oracle (given a vector  $c$ , return  $x \in B$  minimizing  $c^T x$ ) or some other suitable oracle.

**New results:** We found an approximation algorithm for the general mixed problem with  $M$  convex and  $M$  concave functions  $f_m, g_m$  that uses an suitable oracle of the form: find  $\hat{x} \in B$  such that  $p^T f(\hat{x}) \leq \sum_{m=1}^M p_m$  and  $q^T g(\hat{x}) \geq \sum_{m=1}^M q_m$  [10]. The algorithm uses  $O(M\epsilon^{-2} \ln(M\epsilon^{-1}))$  iterations or coordination steps, where in each iteration an oracle of the form above is called. Recently we found an improved width-independent Lagrangian-relaxation algorithm for the general mixed problem [11]. The algorithm uses a variant of the Lagrangian or price directive decomposition method. This is an iterative strategy that solves  $(MPC_\epsilon)$  by computing a sequence of triples  $(p, q, x)$  as follows. A coordinator uses the current vector  $x \in B$  to compute two price vectors  $p = p(x) \in \mathbb{R}_+^M$  and  $q = q(x) \in \mathbb{R}_+^M$  with  $\sum_{m=1}^M p_m + q_m = 1$ . Then the coordinator calls here a feasibility oracle to compute a solution  $\hat{x} \in B$  of the block problem  $BP(p, q, t)$

$$\text{find } \hat{x} \in B \text{ s.t. } p^T f(\hat{x})/(1+t) \leq q^T g(\hat{x})(1+t) + 2\bar{p} - 1,$$

(where  $t = \Theta(\epsilon)$  and  $\bar{p} = \sum_{m=1}^M p_m$ ) and makes a move from  $x$  to  $(1 - \tau)x + \tau\hat{x}$  with an appropriate step length  $\tau \in (0, 1)$ . Such a iteration is called a coordination step. In case  $\bar{p}$  is close to  $1/2$ , we use a slightly different block problem  $BP'(p, q, t)$  of the form:

$$\text{find } \hat{x} \in B \text{ s.t. } p^T f(\hat{x})/(1+8t) \leq q^T g(\hat{x})(1+8t) + (2\bar{p} - 1 - t).$$

Our main result is the following: There is an approximation algorithm that for any given accuracy  $\epsilon \in (0, 1)$  solves the general mixed fractional packing and covering problem  $(MPC_\epsilon)$  within

$$N = O(M(\epsilon^{-2} \ln \epsilon^{-1} + \ln M))$$

iterations or coordination steps, where each of which requires a call to the block problem  $BP(p, q, t)$  or  $BP'(p, q, t)$ .

Independently, Khandekar and Garg [2] proposed an approximation algorithm for the general mixed problem that uses  $O(M\epsilon^{-2} \ln M)$  iterations or coordination steps.

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