mance is fixed at either optimizing bandwidth cost or cachemiss probability, without regarding for the other metric.

In the thus far implemented joint-price schemes, we have been assigning requests to download chunks *strictly* from the set of min-priced servers. We now relax this strict consideration by regarding any BS, whose price is within a *tolerance value* of  $\tau$  from the minimum price, as *eligible* to serve chunks for an incoming request (provided as before the eligible BSs are connected to the request's location); chunks are however downloaded by sorting the eligible BSs in the increasing order of their prices. In Figure 4 we have depicted the performance of the joint-price scheme for different values of  $\tau$ , where the earlier strict min-price approach now corresponds to  $\tau = 0$ ; the case where all connected BSs (irrespective of their prices) are eligible corresponds to  $\tau = \infty$ .

We observe that as  $\tau$  increases the trade-off curves shift downwards, implying that it is possible to achieve a lower cache-miss probability for a given target bandwidth cost. However, the range of trade-off that is possible reduces as  $\tau$ increases. For instance, using  $\tau = 100$  it is not possible to reduce the bandwidth cost to less than 40; In fact,  $\tau = \infty$ case achieves the lowest cache-miss probability, however at the expense of being constrained to operate at a higher range of bandwidth cost. This shift in performance is because, as  $\tau$  increases, more BSs become eligible to serve a request so that the cache-miss probability decreases; however, more BSs are now loaded, resulting in a bandwidth scarce system. Thus, further trade-off in performance can be achieved by suitably choosing the value of  $\tau$ .

In summary, the joint-price scheme, in conjunction with the CLRU policy for cache management, can be a practical candidate for request assignments in futuristic cellular networks where a dense deployment of heterogeneous femtocell base-stations are expected. The cache-miss cost b, along with the tolerance value  $\tau$ , can be used to serve as "tunable knobs" to trade-off one metric for the other.

## 5. CONCLUSION

We proposed an optimization framework to study the problem of cost minimization in cellular cache networks. Towards this direction, we proposed an online algorithm for caching and request assignments which is shown to be optimal and stable in a limiting regime that is obtained by scaling the arrival rates and the content chunking. Based on the online algorithm, we proposed a light-weight joint-price scheme for request assignment that can be used in conjunction with the LRU cache management strategy. Through simulations we found that our joint-price based request assignment strategy outperforms the common practices of routing purely based on either load or content availability. Our proposed jointprice routing mechanisms are thus an appealing candidate combining sound theoretical guarantees with good experimental performance while being simple to implement.

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