

# FREQUENT PATTERN MINING ON UNCERTAIN GRAPHS

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## ABSTRACT

Weakness is typical for a wide extent of affirmed applications, which unavoidably applies to diagram information. Specialist flawed charts are seen in bio-informatics, social affiliations, and so forth This paper rouses the issue of ordinary sub framework mining on single sketchy outlines, and researches two exceptional - probabilistic and expected - semantics to the degree help definitions. Diagram information are poor upon shortcomings in different applications because of inadequacy and imprecision of information. Mining unsure diagram information is semantically not actually identical to and computationally more testing than mining precise chart information. This paper assesses the issue of mining reformist sub chart plans from defective outline information. The reformist sub chart arrangement mining issue is formalized by masterminding another measure called anticipated assistance. A normal mining tally is proposed to discover a concluded arrangement of standard sub diagram designs by permitting a blunder strength on the regular sponsorships of the found sub chart plans. The check utilizes a beneficial measure calculation to pick if a sub diagram model can be yield or not. The savvy and exploratory outcomes show that the assessment is useful, precise and adaptable for enormous crude chart information bases.

**KEYWORDS:**Algorithms, Performance

## INTRODUCTION

Shortcoming is brand name for a wide extent of authentic applications, either endogenous or inadvertent. For instance, in a participation social affiliation, given individuals Bill and Matthew, it may not be conceivable to demand a relationship of the structure "Bill arranges well with Matthew", utilizing open data close by. Our trust in such affiliation is reliably assessed by likelihood. To communicate that the affiliation exists with a likelihood of  $p$ , and the appraisal of  $p$  is settled really by locale specialists utilizing open data, or hence by data extraction and age rules. These days, the necessities for managing shortcoming become more irreplaceable in the giant information period, where information of different characteristics by and large arise. In this venture, thus, the base on flawed diagrams, where our insight is introduced as a chart with shortcoming related to edges. Other than as of late referred to social affiliations, unsure diagram model is gotten in correspondence affiliations, far off sensor affiliations; protein connection networks standard administrative affiliations, and so forth.

Unremitting model mining has been an associated with subject in information tunneling for over 10

years, getting bewildering ground. Framework plans, or consistent sub diagrams, are particularly persuading starting late, which sub graphs are found from an assortment of little blueprints or single gigantic outline with help no not really a client indicated limit. Reformist sub diagrams are helpful at portraying layout datasets, mentioning and assembling graphs, and building basic records.

One wisdom from our advancements to the broken case is that the various assessments don't show relative guides to the deterministic case. For instance, in the deterministic case, the FP-headway figuring is unmistakable to be an incomprehensibly able way of thinking. Notwithstanding, in our tests, discovered that the augmentations of the applicant make and-test correspondingly as the hyper-structure based checks are amazingly more wonderful. Additionally, many pruning methodologies, which turn out amazingly for the event of low shortcoming probabilities, don't turn out decently for the event of high shortcoming probabilities. This is on the grounds that the developments of a piece of the checks to the unsure case are far and away additionally stunning, and require various kinds of deals in the key assessments. Therefore, in spite of the new reasonable techniques proposed by this paper, an immense duty of this paper

is the data that brand name improvements of deterministic calculations may show abnormal direct.

While the chance of tenacious sub diagram and strategies for mining standard sub frameworks on deterministic outlines are verifiably known, the case winds up being furthermore charming and less centered around flawed graphs. A dubious diagram is a unique edge-weighted graph, where the weight on each edge  $(u, v)$  is the presence likelihood of the connection between vertices  $u$  and  $v$ . Of late, research exertion has been given to visit sub chart mining (FSM) on an assortment of negligible faulty graphs. Being relatively enormous, regardless, the issue on single gigantic unsure diagrams stays open, given that genuine epic affiliations are consistently attracted with shortcoming in nature. The measure of papers co-made is recorded, with which the probability of future re-enactment of the coordinated effort can be assessed, which is a likelihood in nature. While amazing and sagacious devices are required to dismantle the crude social affiliations, standard sub framework mining is clearly one of it, which can uncover solid interest propensity in probabilities.

## RELATED WORKS

In [1] Yongxin Tong, Xiaofei Zhang, Caleb Chen Cao, Lei Chen et al presents the rising of various new genuine applications, for example, protein-protein connection (PPI) affiliations, visual model attestation, and careful traffic frameworks, directing monster volumes of faulty diagrams has pulled in much idea in the information base association. As of now, most existing key solicitations over diagrams just assistance deterministic charts, however genuine outline information are frequently loud, mixed up, and partitioned. In this paper, to concentrate a particularly flawed framework demand, probabilistic super diagram rule demand over monster sketchy graphs. In particular, given a sketchy diagram information base UGD which contains a great deal of unsure blueprints, a deterministic request diagram  $q$ , and a probabilistic limit  $\delta$ , a probabilistic super graph rule demand is to discover the arrangement of flawed layouts. Specifically, to propose a compelling separating structure and a novel probabilistic improved record, called PS-Index, to redesign pruning power in the disconnecting stage. Furthermore, the up-and-comer plots which pass the sifting stage are endeavored in the check stage through a convincing clashing likelihood surveying based measure calculation. At long last, to assert the abundancy and productivity of

the proposed frameworks through wide starters. For a scrappy diagram information base, this framework at first neglects all probabilities of sketchy layouts and utilizations existing systems for sub chart search in deterministic charts to prune some questionable outlines. By at that point, it further uses probabilistic pruning to channel more applicants.

In [2] Ye Yuan, Guoren Wang, Lei Chen, Haixun Wang et al presents Many assessments have been driven on looking for the competent reaction for sub chart likeness search over certain (deterministic) diagrams by virtue of its wide application in different fields, including bioinformatics, easygoing organization evaluation, and Resource Description Framework (RDF) information the bosses. These works expect that the covered information are sure. In any case, actually, plots are reliably crazy and faulty because of different elements, for example, bungles in information extraction, irregularities in information bargain, and security saving purposes. Accordingly, in this paper, to consider sub chart resemblance search on colossal probabilistic layout information bases. Not actually comparable to past works expecting that edges in an unsure diagram are self-administering of one another, to examine the flawed charts where edges' events are related. To officially show that sub layout comparability search over probabilistic charts is #P-finished, thusly, to utilize a channel and-attest system to stimulate the solicitation. In the segregating stage, grow tight lower and farthest limitations of sub chart similarity likelihood subject to a probabilistic cross section list, PMI. PMI is made out of discriminative sub blueprint highlights related with tight lower and most extreme requirements of sub outline isomorphism likelihood. Considering PMI, to can figure out boundless probabilistic outlines and expand as far as possible.

In [3] WalaaEldinMoustafa, Angelika Kimmig, AmolDeshpande, LiseGetoor et al presents There is a making need for strategies which can find shortcomings and solution demands over chart facilitated information. Two basic sorts of shortcoming are shortcoming over the quality appraisals of focuses and shortcoming over the presence of edges. In this paper, to get those along with character shortcoming. Character shortcoming tends to shortcoming over the orchestrating from objects alluded to in the information, or references, to the crucial confirmed substances. To propose the chance of a probabilistic substance plot (PEG), a probabilistic diagram model that depicts scattering

over likely outlines at the part level. The model contemplates focus quality shortcoming, edge presence shortcoming, and character shortcoming, and appropriately connects with us to purposely reason basically all of the three sorts of shortcomings in a uniform way. To introduce an overall structure for building a PEG given imperfect information at the reference level and grow astoundingly competent assessments to answer sub chart arrangement coordinating solicitations in this setting. Our calculations depend upon two extraordinary contemplations: setting cautious way mentioning and decay by join-competitors, which absolutely diminish the request search space. A serious exploratory assessment shows that our system outsmarts standard use by tremendous degrees.

In [4] ZhaonianZou and Jianzhong Li et al presents Structural-setting resemblances between vertices in charts, for example, the Jaccard closeness, the Dice similitude, and the cosine likeness, expect basic situations in various graph information appraisal systems. In any case, shortcoming is normal in huge chart information, and thusly the old style ramifications of crucial setting similitudes on definite frameworks don't look great on flawed graphs. In this paper, propose a normal significance of basic setting similarity for crude diagrams. Since it is computationally restrictive to ascertain the likeness between two vertices of a crude chart plainly as shown by it's, to take a gander at two gainful ways to deal with oversee planning similarities, expressly the polynomial-time exact figuring's and the prompt time measure assessments. The starter results on authentic imperfect frameworks check the possibility of the proposed concealed setting resemblances likewise as the accuracy and suitability of the proposed examination assessments. The fundamental setting similarities proposed for unsure charts really assess how relative two vertices are should have been when shortcoming exists in their overall region. In like way, they can be utilized as basic instruments for analyzing the trademark attributes of scrappy frameworks, e.g., sub graphs that are relied on to be of high thickness, and subsets of vertices that are expected to shape associations.

In [5] Rong-Hua Li, Jeffrey Xu Yu, Rui Mao, and Tan Jin et al presents present two sorts of request assessment issues on sketchy diagrams: need demand examination and edge question assessment. Since these two issues are #P-finished, most past reactions for these issues depend after clueless Monte-Carlo

(NMC) taking a gander at. Notwithstanding, NMC reliably prompts a huge change, which from an overall perspective decreases its abundancy. To beat this issue, propose two classes of assessors, called class-I and class-II assessors, considering disconnected researching. Significantly more explicitly, from the outset propose two classes of central described examining assessors, named BSSI and BSS-II, which pack the whole individuals into  $2r$  and  $r+1$  layers by picking  $r$  edges autonomously. Second, to diminish the change, locate that both BSS-I and BSS-II can be recursively acted in each layer. Accordingly, propose two classes of recursive described dissecting assessors called RSS-I and RSSII freely. Third, for a specific sort of issue, propose two cut-set based portrayed auditing assessors, named BCSS and RCSS, to likewise improve the precision of the class-I and class-II assessors. For all the proposed assessors, to show that they are sensible and their movements are completely more subtle than that of NMC. Also, the time complexities of the huge number of proposed assessors are indistinguishable from the time flightiness of NMC under a fragile uncertainty.

### **Exact Graphs**

AGM begins the inquiry by inspecting charts containing a solitary vertex, and afterward it continues by producing bigger up-and-comers adding one additional vertex at each resulting step. FSG utilizes edges, rather than vertices, as the essential structure block for applicant age. It restricts the class of the continuous sub diagrams to associated charts and acquaints a few heuristics with increment the productivity of registering the help of an example, utilizing diagram vertex invariants, for example, the level of every vertex in the diagram. It additionally improves the productivity of the competitor design age by presenting the exchange ID strategy. PM additionally follows expansiveness first count for producing the up-and-comer designs; notwithstanding, rather than the past methodologies which utilize single vertices or edges as essential structure blocks for design age, it uses edge-disjoint ways. This decreases the necessary emphases, while it is demonstrated that culmination is kept up.

### **PROPOSED SYSTEM**

FSM under expected semantics is appealing over looking at subjects while that under probabilistic semantics is more legitimate for perceiving highlights. Enlivened by these endeavors, to augment the

considerations, and also depict keep up on single enormous questionable diagrams under the two semantics - expected and probabilistic. For help under probabilistic semantics, it is depicted as the amassed probabilities of the inferred graphs having support more noteworthy than an edge, which is a tirelessness cutoff of the help. For help under anticipated semantics, it is depicted as the amassed commitment to help, weighted to its reality likelihood over completely concluded layouts, for example likelihood dissipating over the help with completely interpreted charts of the sketchy outline. By at that point, sub outlines beating a given help limit are viewed as ceaseless. Because of the move of definition, existing assessments on a plan of flawed charts are not, presently material to single crude layouts. In like way, propose proficient plans with exactness ensure, where the computational preliminary of genuine managing edge-based likelihood and vertex-based help is in addition tended to.

### Graph Representations

The least difficult instrument whereby a chart structure can be spoken to is by utilizing a contiguosness framework or nearness list. Utilizing a nearness lattice the lines and segments speak to vertexes, and the crossing point of line  $I$  and segment  $j$  speaks to a potential edge interfacing the vertexes  $v_i$  and  $v_j$ . The worth held at crossing point  $\langle I, j \rangle$  normally shows the quantity of connections from  $v_i$  to  $v_j$ . Nonetheless, the utilization of nearness grids, albeit clear, doesn't fit isomorphism recognition, in light of the fact that a diagram can be spoken to from various perspectives relying upon how the vertexes are counted. As for isomorphism testing it is in this way attractive to embrace a steady marking system that guarantees that any two indistinguishable charts are named similarly paying little mind to the request in which vertexes and edges are introduced. An accepted marking procedure characterizes a novel code for a given diagram.

Authoritative naming encourages isomorphism checking on the grounds that it guarantees that on the off chance that pair of charts are isomorphic, at that point their sanctioned naming will be indistinguishable. One straightforward method of creating an authoritative marking is to smooth the related nearness framework by linking lines or segments to deliver a code involving a rundown of whole numbers with a base lexicographical requesting forced. To additionally decrease the calculation

coming about because of the changes of the framework, authoritative naming are typically packed, utilizing what is known as a vertex invariant plan that permits the substance of a contiguosness lattice to be apportioned by the vertex names. Different authoritative marking plans have been proposed, a portion of the huger are portrayed in this subsection.

### Sub graph Enumeration

The current strategies for counting all the sub diagrams may be arranged into two classes: one is the joint activity received by FSG and AGM and another is the augmentation activity. The significant worries for the joint activity are that a solitary join may create various up-and-comers and that an applicant may be repetitively proposed by many join tasks. The worry for the augmentation activity is to limit the hubs that a recently acquainted edge may join with. Identicalness class put together augmentation is established with respect to a DFS-LS portrayal for trees. Essentially, a  $(k + 1)$ - sub tree is created by joining two incessant ksubtrees. The two  $k$  sub trees should be in a similar comparability class. A proportionality class comprises of the class prefix encoding, and a rundown of individuals. Every individual from the class can be spoken to as a  $(l, p)$  pair, where  $l$  is the  $k$ -th vertex mark and  $p$  is the profundity first situation of the  $k$ -th vertex's parent. It is confirmed, in that all potential  $(k + 1)$ - sub trees with the prefix  $[C]$  of size  $(k - 1)$  can be created by joining each pair of individuals from a similar identical class  $[C]$ . Equivalence classes can be founded on one or the other prefix or postfix.

### Frequency Counting

Two Methods are utilized for diagram checking: Embedding records (EL) and Recomputed embeddings (RE). For charts with a solitary hub store and implanting rundown of all events of its name in the information base. For different diagrams a rundown is put away of implanting tuple that comprise of (1) a file of an inserting tuple in the installing rundown of the archetype chart and (2) the identifier of a diagram in the information base and a hub in that chart. The recurrence of a structure is resolved from the quantity of various diagrams in its installing list. Implanting records are brisk, yet they don't scale to huge information bases. The other methodology depends on keeping a bunch of dynamic" diagrams in which events are over and over recomputed.

### Uncertain Graphs

Beginning late, there has been a making interest in utilizing sketchy charts as an information model in applications that need to regulate shortcoming. Accordingly, different issues for mining questionable outlines have arisen. The issue of finding solid sub blueprints in sketchy graphs is considered. Given a blueprint that is penniless upon inconsistent edge bafflements, the objective is to discover and shed various edges so the likelihood of accomplish a ton of picked focuses in the wealth sub chart is expanded. Three epic kinds of probabilistic way demands have been portrayed in for questionable charts tending to street affiliations, where edge probabilities get the shortcoming in active time gridlock conditions. Likewise, both accurate and gauge figuring's know about answer such demands. A hypothesis of k-Nearest Neighbor requests in faulty charts is introduced in where a structure is proposed considering elective approaches to manage portray the distance between focus focuses considering edge probabilities. All of these works undeniably show the developing require an interest in mining flawed charts.

Despite the way that this figuring makes it conceivable to prompted the common help of an applicant plan for a questionable chart with an enormous number of edges, the computational expense is still high, and hence the method doesn't scale well, notwithstanding, for moderate size information bases with up to a couple of various scrappy diagrams. In our methodology, to slaughter this constraint, by building a record of the unsure framework information base, which all around prunes the pursuit space and connects with for extra enhancements subject to early end and productive booking to maintain a strategic distance from the costly sub graph isomorphism tests.

### **Enumeration-evaluation algorithm**

The unmistakable verification stage is indistinguishable from that for FSM on a deterministic diagram. Accordingly, any unmistakable evidence system utilizing the Apriori property can be utilized. The Apriori property conveys that super charts of an exceptional sub blueprint can't be constant. In particular, all sub charts of a faulty layout can be created in a set up encouraged non-cyclic diagram (DAG), where the middle focuses address up-and-comer sub graphs (with the root being invalid). An indirect part in the DAG from a model  $g_0$  to  $g$  shows that  $g_0$  is a brief super graph of  $g$ . To list all

conceivable sub frameworks by beginning from reformist single edges and adding each time another edge to those standard sub charts, so that sub graphs including  $n$  edges can be found at level- $n$  of the DAG. Basically the successors of a normal sub blueprint will be counted. To evade copy assurance of a sub diagram while holding complete the process of, existing framework gSpan powers a lexicographic requesting among the sub graphs. To moreover utilize this methodology for dazzling count of up-and-comer sub diagrams.

The assess stage decides if a specified sub diagram is continuous by contrasting its help and the limit. A credulous technique is to create all suggested diagrams, register and total the help commitment of the sub chart in each inferred diagram, and afterward determine the help and contrast and the limit. This can be fairly tedious because of the enormous number of inferred diagrams and the high unpredictability of help calculation, and thus, gets deplorable to end-clients. By and by, To look for each occasion to restore answers inside sensible time

### **MUSE- Mining Uncertain Subgraph patterns Algorithm**

Dream (Mining Uncertain Sub chart pattErns), is proposed to locate an inexact arrangement of incessant sub diagram designs in a dubious chart information base. It approximates the arrangement of all incessant sub diagram designs in the accompanying way. Let  $\text{minsup}$  be the normal help limit and  $\epsilon \in [0, 1]$  be a general mistake resilience. In MUSE, all sub diagram designs with expected help at any rate  $\text{minsup}$  are yield, however all sub chart designs with expected help under  $(1 - \epsilon)\text{minsup}$  are not yield. Additionally, choices are discretionary for sub chart designs with expected help in  $[(1 - \epsilon)\text{minsup}, \text{minsup})$ .

The MUSE calculation receives two basic strategies. The first is the proficient technique to decide if a sub chart example can be yield or not. It initially approximates the normal help of a sub diagram design by a span encasing the normal help of the sub chart example and afterward settles on choice on if the sub diagram example can be yield by checking the covering connection between the approximated stretch and  $[(1 - \epsilon)\text{minsup}, \text{minsup})$ . Along these lines, it dodges the trouble in precisely registering the normal help of the sub diagram design. The subsequent procedure is the proficient strategy to analyze sub

diagram designs. To demonstrate that the normal help fulfills the Apriori property, that is, all super charts of a rare subgraph designs are additionally rare. To exploit this property, all sub diagram designs are coordinated into a tree, and the tree is crossed in the profundity first procedure. In the event that a sub diagram design can't be yield therefore, at that point all its relatives in the tree require not to be analyzed.

## RESULT AND DISCUSSION

### Time Efficiency of MUSE

To explored the time effectiveness of MUSE on the genuine questionable chart information base regarding the limit minsup and the boundaries  $\epsilon$  and  $\delta$ . This is on the grounds that the quantity of yield incessant subgraphs designs diminishes quickly as minsup expands.

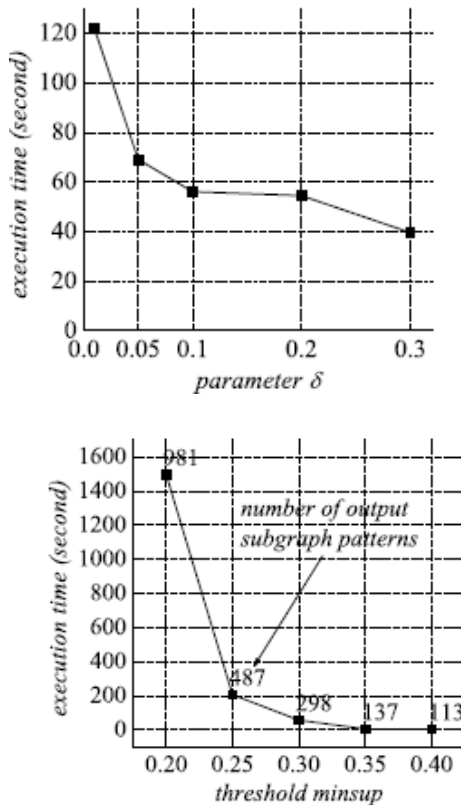


Fig varying Different parameter

### Approximation Quality of MUSE

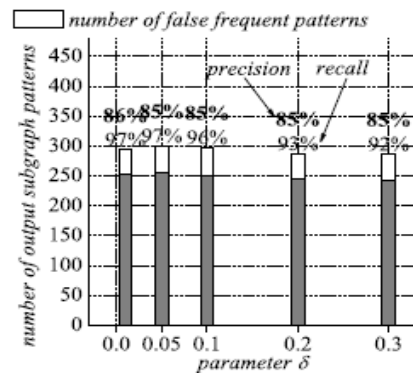
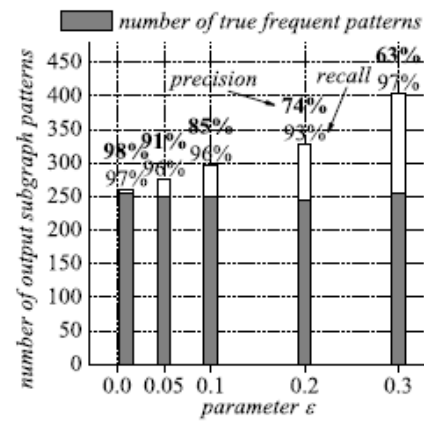


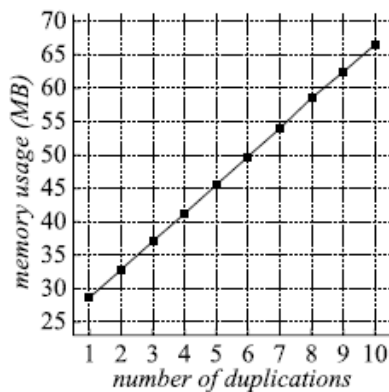
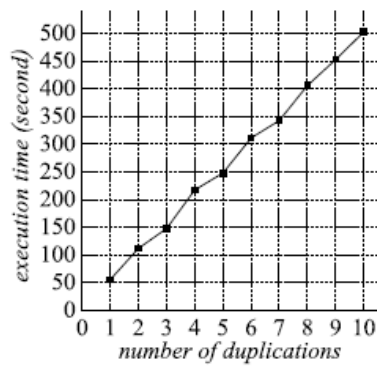
Fig Approximation quality of MUSE with respect to parameters  $\epsilon$  and  $\delta$

Dream is a rough mining calculation; To assessed its estimate quality as for  $\epsilon$  and  $\delta$  on the genuine dubious diagram information base. The guess quality is estimated by the exactness and review measurements. Exactness is the level of genuine successive sub diagram designs in the yield sub chart designs. Review is the level of returned sub diagram designs in the genuine continuous sub chart designs. Since it is NP-elusive all evident successive sub diagram designs, to respected the sub chart designs found utilizing  $\epsilon = 0.01$  and  $\delta = 0.01$  as the genuine continuous sub chart designs. The likelihood of an incessant sub diagram design being yield diminishes, consequently the quantity of returned genuine continuous sub chart designs diminishes, lessening the review. All the test results confirm that MUSE can have high estimate quality.

### Scalability of MUSE

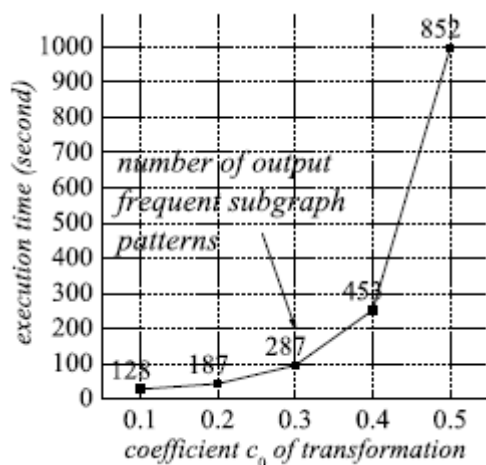
The adaptability of MUSE concerning the quantity of questionable diagrams in an unsure chart information base. To controlled the quantity of dubious diagrams by copying the unsure charts in the information base. The test results confirm that MUSE is entirely adaptable to enormous questionable diagram

information



### Impact of Uncertainties on MUSE

This examination researched the effect of disseminations of vulnerabilities on the proficiency of MUSE. To fluctuate the circulation of vulnerabilities, to forced numerical changes to the vulnerabilities of each unsure chart. This is on the grounds that with the expanding of  $c_1$ , the change of the presence prospects increases, and more edges will have high presence prospects. It expands the quantity of sub diagram designs with high anticipated backings, in this manner expanding the execution time subsequently.



bases.

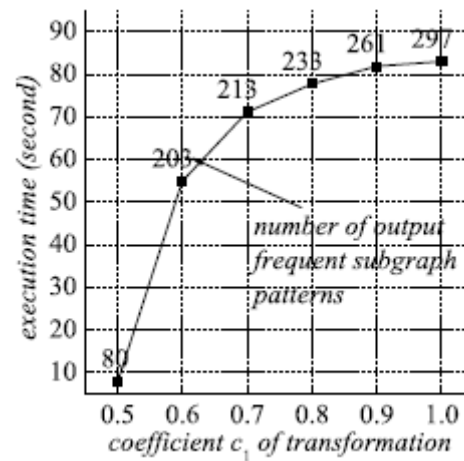


Figure 11: Impact of uncertainties on the efficiency of MUSE

### CONCLUSION

The issue of mining standard sub chart plans on faulty diagram information. The standard sub diagram arrangement mining issue is formalized by presenting the normal help measure. Under a count examination structure, to propose an attainable check to accomplish rich mining execution. The #P-hard help calculation is settled by approximating the ensured sparks into a stretch with exactness ensure. For probabilistic semantics, to make the most of sharing heuristics to refresh the capacity. For predicted semantics, to prune troublesome and avow promising sub diagrams, autonomously, at checkpoints by using structure-based upper and lower limits. A prompted mining assessment, called MUSE, is proposed to find an off base arrangement of standard sub layout plans from a sketchy diagram information base. The appraisal and the test results show that MUSE has high effectiveness, high theory quality and high adaptability.

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