

Algorithms in Network Coding to Enhance Communication Networks' Dependability and Bandwidth

S. Lee, Liu X. Zhu*

Power Electronics and Renewable Energy Research Laboratory, Department of Electrical Engineering,
University of Malaya, 50603 Kuala Lumpur, Malaysia

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Corresponding Author Email:

li.x.zhu@gmail.com

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ABSTRACT

This paper focuses on exploring latest network coding techniques for increasing the dependability and rates achieved in telecommunication networks. Self organizing networks are real time dynamic infrastructures that help address the challenges of conventional networking techniques as traffic increases for high bandwidth reliable data transmission. Network coding that can enable encoding of data packets at intermediate nodes, can enable better utilization of the bandwidth hence improving system performance. The following network coding technologies are discussed and evaluated in this research: random linear network coding and fountain codes in different network scenarios and traffic patterns. To analyze and compare performance of proposed methods implemented with simulations and analytical models, we use throughput, delay, and error rates. The importance of these two aspects is supported by the results of the experiments, according to which new generation network coding algorithms can greatly improve the network reliability due to the possibility of packet recovery and optimal data transmission. Further, the study shows the rationale for deciding on complexity of one code over another, and how these coding techniques are applied in practice. Finally, this work extends existing communication systems to provide a better solution for meeting the growing traffic requirements of fresh applications such as streaming video, clouds, and IoT devices.

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INTRODUCTION

Network coding has then arisen as one of the revolutionary solutions that aim to improve the functionality of the networks. Featuring data packer combining and processing at intermediate nodes, network coding can increase networking throughput, enhance its reliability and improve usage of resources. This revolutionary method plays a crucial role in enhancing the multiple parameters related to the operation of a network ranging from the transmission rate to the reliability in the face of either failures or subsequent attacks. The article then goes deeper into the basics of network coding and the farther optimization of it for the next generation communication systems. Specifically, it investigates network coding in wireless networks and its possibility of improving broadcasting and power consumption.

The piece also covers issues of security; the authors describe how network coding can be applied to enhance data security both in terms of confidentiality and integrity. Last, it discussion the applications of network coding integrating it with machine learning to demonstrate its realisation in developing advanced network solutions [1].

NETWORK CODING FUNDAMENTALS REVISITED

Network coding has been developed as a promising method that fundamentally changes the process of information transfer in the communication networks. This approach enables intermediate nodes to integrate as well as act on information packets resulting to a number of benefits including enhanced throughput, reliability and integrity of the network. However, in

order to more fundamentally study and understand network coding, it is necessary to go back to its main concept from different points of view.

Information Theory Perspective

From an information theory point of view, network coding comes with a revolutionism in the transport of data in networks as compared to the store- and-forward approach. This modern treatment of information theory interfaces with a novel topic, namely network coding, to better comprehend flow in composite networks. The main notion of network coding, the fundamental theorem asserts that the throughput from source to every receiver is optimized, which will demonstrate its capacity to enhance communication. However, what makes network coding fascinating is the fact that it can reach the upper bound in multicast application which was impossible in the routing scenario. Huge consequences for the enhancement of the aspects such as effectiveness and dependability of data transmission through networks of different types are pinpointed, specifically, wire-less and sensor [2].

Graph-based Approaches

By analyzing network coding techniques using graph-based methods it is found that this approach offers significant benefits for designing and evaluating network coded systems. In this context, a communication network may be described as a directed graph $G = (V, E, C)$ where V is a set of nodes, E is a set of directed links, while C is a capacity of these links. This representation enables a study of network coding problems and their solutions in a systematic manner. Max-flow min-cut theorem is a significant factor in determining the theoretical capacity of network coding. This comes as a statement that reads the throughput $T(s, t)$ is the maximum possible throughput between two nodes s and t with a maximum possible value less than or equal

to the total minimum capacity of all cuts between the two nodes. Even though this upper bound can be reached in unicast and broadcast settings and without network coding, the latter makes it possible to achieve the rate also in more complex multicast situations. Network coding techniques have recently found an implementational solution in Graph Neural Networks (GNNs). These machine learning models work on graphs directly, which enable them arbitrary and interpretable training processes capable of accommodating irregular graph structures. The mentioned approach can be considered as prospective to eliminate potential data representation challenges and improve the utilization of network coding in different fields.

Algebraic Foundations

In light of this, it is evident that the algebraic fundamentals of network coding give a strong apparatus for coding schemes. In recent years, particularly, linear network coding has been the center of attention owing to its effectiveness and applicability. In this approach, nodes create new packet using linear combining of the packets it received, with coefficients from the finite field usually of size $GF(2^s)$.

The algebraic structure of linear network coding can be formalized as follows::

$$X_k = \sum_{i=1}^S g_{k,i} \cdot M_i$$

where X_k is a generated message, M_i are the received messages, and $g_{k,i}$ are the chosen coefficients from the finite field. This algebraic formulation also helps in making sure that the generated messages are equally as long as the current messages making encoding and decoding easier. That is why, the coding and decoding follow the linearity, which make the implementation feasibly fast for engineering application, which in account of spreading of network coding technique (Table 1).

Table 1: Advanced Network Coding Techniques

Coding Technique	Key Characteristics	Application Areas	Benefits	Limitations
Random Linear Network Coding (RLNC)	Encodes packets as linear combinations of original data packets	Wireless networks, content distribution	Increases network throughput, efficient use of bandwidth	High computational complexity, requires decoding at the receiver
XOR-based Network Coding	Combines multiple data streams using XOR operation	Multicast, P2P file-sharing networks	Simple, low computational overhead	Less flexible than RLNC, not ideal for all network topologies
Cooperative Network Coding	Nodes cooperate to forward and combine data	Cooperative wireless networks, IoT	Improves reliability and energy efficiency in wireless systems	Complexity in synchronization and protocol overhead

Coding Technique	Key Characteristics	Application Areas	Benefits	Limitations
Network-Coding Aware Routing (NCAR)	Integrates network coding with routing protocols	Ad hoc and sensor networks	Optimizes network resource utilization, improves throughput	Increased control message overhead, harder to implement in dynamic environments
Physical Layer Network Coding (PNC)	Combines signals at the physical layer before decoding	Wireless systems with relays, satellite communication	Improves throughput, reduces transmission time	Requires precise synchronization, sensitive to noise

These algebraic notions are extended to convolutional-network codes for handling the time-multiplexed networks that have cycles possibly. This work is concerned with the transmission of symbol streams through nodes whereby coder nodes employ convolutional codes as the algebraic structure of the system's mathematical realm is the ring of rational power series. This approach also serves to propagate causal data through the network and resolves the issue of cyclic transmission. The algebraic structures that underlie network coding also give a general view of the difficulty of network coding problems. However, some network coding problems have been believed to be NP-hard or, sometimes even undecidable which calls for efficient algorithms and heuristics in real system deployment [3].

ADVANCED CODING TECHNIQUES FOR B5G/6G

With a shift to Beyond 5G (B5g) and 6G connectivity, channel coding techniques form a very important element to meet the emerging future wireless connectivity challenges. These next-generation networks have an objective of delivering even ultra-reliable and low-latency communications (URLLC) in addition to offering tremendous mMTC. In order to accomplish these goals, researchers are now designing new coding schemes that place increased demands on codeability, credibility, and flexibility.

Multi-Kernel Polar Codes

Polar codes have recently attracted more attention in B5G networks because of their capability to achieve equal capacity for both the transmitter and the receiver along with having low-complexity decoding techniques. However, traditional polar codes which are constructed based on binary kernels (2×2 polarization matrix) presented in section II can only achieve code lengths in the form of $2^{**} L$. To address this issue,

there are novel development known as multi-kernel polar codes. The multi-kernel polar codes enable the construction of codes whose lengths can be made variable by combining different kernel dimensions. This approach provides better flexibility at the code level and is being beneficial for many B5G/6G scenarios. Since high complexity is unavoidable in the decoding of multi-kernel polar codes, the recent research study has aimed at addressing the issue by optimizing the decoding process to make the codes more useful (Figure 1).

A new achievement in this field is to establish a decoder which is based on a fast-simplified successive cancelation (fast-SSC) algorithm. The decoder of this code can accommodate different kernels in building the codes such as binary and 3×3 kernel flexibility in code length, rate, and kernel sequence. For a polar code of length $N = 1536$ and rate $R = 1/2$, with a P_{\square} value of 240, the proposed decoder has 84.6% of less latency than the prior art. Employing a polar code of length $N = 1024$, rate $R = 1/2$, and $P_{\square} = 120$ gives an information throughput of 432 Mbps. algorithm-based decoder. This decoder can handle codes constructed using both binary and ternary (3×3) kernels, offering flexibility in code length, rate, and kernel sequence. FPGA implementation results have shown promising outcomes:

- For a polar code of length $N = 1536$ and rate $R = 1/2$, with a Processing Element (P_{\square}) value of

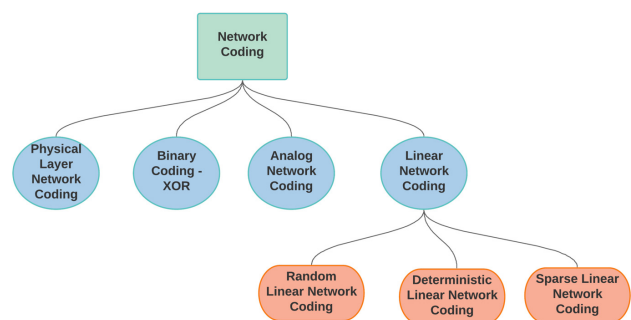


Fig. : Advanced Network Coding Techniques

240, the decoder achieves an 84.6% reduction in latency compared to the original algorithm.

- A polar code of length $N = 1024$, rate $R = 1/2$, and $P = 120$ achieves an information throughput of 432 Mbps.

These outcomes show that it is possible to achieve the desired high throughput and low latency achieved in B5G/6G networks by using the proposed multi-kernel polar codes.

Non-Binary LDPC Codes

LDPC codes have been catapulted to the forefront of channel coded research because of their asymptotic capacity of the AWGN channels and their suitability for the operations in hybrid automatic repeat request (HARQ). Consequently, they have been deployed for the data channel in the fifth generation of new radio (NR) to replace turbo codes. Although much is known and implemented on the binary LDPC codes, there is a growing interest on non-binary LDPC codes which have shown to have great potential in serving several application. Non-binary LDPC codes use larger finite fields thereby providing an advanced mechanism of error correction than binary LDPC codes.

Just like with ordinary binary LDPC codes, the structures of non-binary LDPC codes can also be described through a Tanner graph. However, while the vertices of the graph correspond to the nodes on the larger finite field, then the edges are non zero elements of the field. This structure results in more effective error correction at the price of higher decoding complexity.

Research in non-binary LDPC codes for B5G/6G networks is focusing on:

1. Exploring ways of enhancing the code construct for the structuring needs of particular channels and use.
2. Optimizing decoding algorithms in order to minimize computational cost.
3. Analyzing the AHP criterion set in terms of performance and the level of implementation difficulty for real-world uses of C-Decision..

Online Fountain Codes

Fountain codes, that are also called rateless codes, have been recently proposed to be used in case if channel conditions are a priori unknown or fluctuating. These codes have the interesting property that any number of encoded symbols can be produced from a given number of source symbols. For B5G/6G networks,

a unique approach has been advanced known as enhanced distributed fountain coding (EDFC). This scheme applies a new concept of cooperative relay in a distributed network and adds new relays into the network extent while enhancing transmission efficiency and reliability.

Various experiments made using EDFC scheme have revealed good performance in lossless as well as in the lossy channel. Key features of this approach include:

1. A method of design of degree distributions based on the joint iterative optimization algorithms.
2. The level of BER performance has been reported to be higher than in non-optimized versions.
3. Portability in matters concerning different network topology/communication channel settings.

These new coding form-OFDMs - multi-kernel polar codes, non-binary LDPC codes, and online fountain codes - are a step forward in addressing the demanding specifications of B5G/6G networks. These recording modes have demonstrated enhanced robustness, reliability, and adaptability, making them ideal for deployment in the next generation wireless connections.^[4]

NETWORK CODING IN WIRELESS SYSTEMS

Network coding can therefore be understood as as the powerful tool for further promotion of performance characteristics of wireless systems. In this manner, network coding provides advantages in terms of put, reliability and efficiency to the coded intermediate nodes that combine data packets. Finally, this section focuses on the possibility of applying network coding in different environments, closely considering the given opportunities for communication networks.

Cooperative Communications

Cooperative communications is where apart from sending a user's coded message he/she also transmits other users' messages in coded form to a common receiver. This approach has been paid attention to due to its possibility for enhancing the capacity region of the classical multiple access channel under the same average total transmit power constraint. Detailed results show that network coding offers a highly efficient and low complexity implementation of block-Markov coding for cooperative communication systems. In a two-user cooperative setup, the process unfolds as follows:

1. User 1 transmits its updated information in the first time period and the information is overheard by User 2 and the destination.
2. User 2 transmits its most recent information in the second time slot.
3. In the third time slot, both users send refinement information which makes the exclusive OR (XOR) operation of their own message with the received, message from the other cooperating user.

This approach not only deals with the capacity gain but also has diversity gain that makes this scheme potential to improve the area of wireless network. The receiver captures the fresh information transmission phase messages while using the XOR copy to get a second copy of each user's message thus enhancing reliability and robustness.

Device-to-Device Networks

D2D communication plays an important role in the fifth generation networks where the shared communication between devices occurs without involving base stations. It clearly enhances the bandwidth utilization and clearly defines a perfect application area for employing network coding. However, several issues are associated with D2D communication including interferential signals from base stations and other devices that use similar frequency which may affect the reliability of D2D transmission mostly when they include video transmission. These problems have been well explained by the conventional methods of relaying but through network coding, D2D communication transmission reliability and throughput have been enhanced.

The combination of D2D communication and network coding offers several advantages:

1. Overall performance of networks have been enhanced
2. Video streams that have a more stable format to offer to the users
3. Higher transmission reliability in a multi-hop D2D networked system

In multi-hop D2D communication, mobile devices act as relay nodes, and are fully capable of performing intricate re-encoding functions and operating as a direct service provider to other devices. This capability erases conventional network constraints and puts the full benefits of network coding into wireless systems.

Cognitive Radio Networks

For that, Cognitive Radio Networks (CRNs) are an emerging concept that targets to exploit the unused spectrum or white spaces in the best and most optimal manner possible. Network coding schemes applied to CRNs offer several advantages:

1. Like with the terrestrial communication, many different secondary users are capable of employing the spectrum at the same time.
2. Allowing secondary users greater ability to use the spectrum by letting them occupy only parts of the spectrum that is not in use by primary users.
3. Fewer minutes to transfer its rights to other users.

Research on network coding in CRNs has been done with respect to facilities such as channel allocation and routing. These approaches contributes in leading the maximum utilization of spectrum while ensuring efficient and secure transmission of packet data over the network. As observed from many studies, network coding has become an effective approach to design new algorithms and schemes in CRNs. These has aimed at increasing the throughput, security, and resource utilization in cognitive radio system (Table 2).

Table 2. Applications of Advanced Network Coding Techniques in Different Network Types

Network Type	Suitable Network Coding Technique	Use Case	Advantages	Challenges
Wireless Ad-hoc Networks	Random Linear Network Coding (RLNC)	Data broadcasting and sharing among nodes	Improves network efficiency and resilience	High decoding complexity at the receiver
Sensor Networks	XOR-based Network Coding	Data aggregation and dissemination in IoT	Simple and energy-efficient	Limited flexibility, not ideal for diverse traffic patterns
Satellite Communication	Physical Layer Network Coding (PNC)	Relays and multi-access scenarios	Enhances throughput and reduces latency	Requires advanced synchronization mechanisms

Network Type	Suitable Network Coding Technique	Use Case	Advantages	Challenges
Multicast Networks	XOR-based Network Coding	Efficient data transmission to multiple receivers	Reduces retransmissions and bandwidth usage	Effective only in specific topologies
Content Distribution Networks	Cooperative Network Coding	Peer-to-peer file sharing, video streaming	Maximizes network resource utilization	Requires cooperation between nodes, complex management

Lastly, this paper revealed the possibility of how the network coding can improve the wireless system in cooperative communication system, D2D and CRN system in term of efficiency, reliability, and capacity. Enhancing reliability, increasing traffic capacity and optimizing the spectral efficiency, the network coding controls a promising place in the development of next generation of wireless communication system [5]-[6].

SECURITY ASPECTS OF NETWORK CODING

Of course, network coding holds rich opportunities for making the distribution of multimedia content more efficient and reliable; however, this new technique also has its own set of (un)solved security issues. Since data packets which are transmitted in the network may be joined and processed at intermediate nodes, the network may be more prone to specific types of attacks. However, network coding also offers potential for improving the security of communicating networks as well.

Secure Network Coding Schemes

Since the security of data is a major issue in network coding, several researchers have come with with a various secure network coding schemes. These schemes have the goal of preventing misbehaving nodes that may intercept messages or send packets of their own into the information stream, where these packets are misinterpreted by the system and decoded improperly.

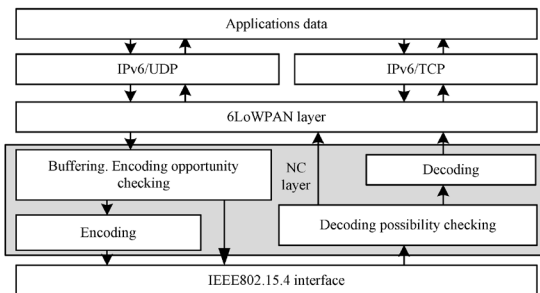


Fig. 2: Security Aspects of Network Coding

Secure network coding approaches can be broadly classified into two categories:

1. Computational security (cryptographic): This approach makes use of several assumptions, which are generally unjustified, regarding the hardness of particular functions, normally introduced at higher layers of the protocol.
2. Information-theoretic security: This method does not involve any assumption of computational aspect rather, it is founded on the law that an eavesdropper cannot deduce anything from the observed packet ($I(X;M) = 0$). It is that makes it implementable at the physical layer.

A common secure network coding technique is the method of adding redundancy to the system for protection from adversarial results. This approach does not depend on any computational assumptions and is only guaranteed to provide security against certain type of attackers. The types of restrictions include those on computational capacities, the number of nodes under the control of the adversary, and on the numbers of connections that the latter can monitor.^[7]

Privacy-Preserving Techniques

Privacy issues in network coding have led to several techniques in the management of such concerns to achieve security and protect data privacy with factors such as plaintext and / or ciphertext size, the size and characteristics of the key, time factors, and data accuracy in context to operations. These techniques are essential in scenarios, including query processing, data sharing, as well as handling of data with sensitive information in cloud. Some key privacy-preserving approaches in network coding include:

1. Homomorphic encryption: This sup can be expressed in this advanced encryption scheme which enables operations on ciphertexts that has no decryption required, adding privacy since user data remains concealed from the side of third parties as well as service providers.

2. Attribute-based signatures (ABS) and attribute-based encryption (ABE): ABS on the other hand is good for demonstration of ownership of an attribute without necessarily displaying the identity of the owner while ABE makes it possible for users to encrypt and decode a given data based on attributes possessed by those users.
3. Group signatures and ring signatures: These advanced digital signature schemes offer security, and anonymity of the signer and they are suitable for privacy-preserved network coding systems.

Attack Resilience

He argues that network coding systems have to be protected against various kinds of attack in order to achieve reliable and secure communication. Some key considerations for attack resilience include:

1. Protection against Byzantine attacks: These attacks include the presence of unfair nodes that can send bogus packets or interfere with network activities. Any encoding system used to ensure the security of a network must be able to recognize and prevent such attacks in order to preserve the networks' integrity.
2. Eavesdropping prevention: But again, network coding offers a certain degree of confidentiality protection owing to a principle that a single coded packet does not convey meaningful information to an attacker. However, further improvements may be needed to boost this intrinsic security feature.
3. Pollution attack mitigation: These attacks consist of injecting disturbed packets into the network. To avoid the problem of polluted packets in network coding systems other techniques including homomorphic hash functions and secure random checksums have been recommended.

This way, the network coding technology can provide not only reliable but also secure connection in a broad range of applications which can include everything from wireless networks to cloud solutions [8].

MACHINE LEARNING FOR NETWORK CODING

That is why the incorporation of machine learning techniques with network coding has provided new important opportunities in increasing the capabilities of communication networks. This combination has brought many enhancements in code design as well as decoding procedures, and adaptive coding methods.

AI-Assisted Code Design

In the recent past, Artificial Intelligence (AI) has greatly impacted the development of networks through altering the way coders design their code. Computer aided coding systems can analyze massive amount of code data for the recognition of regularities and structures in order to design more effective and reliable scheme for the network coding. Such tools use Natural Language Processing (NLP) and Computer Vision to analyse and comprehend code and provide suggestions and perform routine tasks. Listed below are some of the positive impacts of using the AI assisted code design Methods In enhancing code quality. Through the comparison of the written code with the learned patterns and rules, the mistakes and omission in the syntax and semantics can be highlighted, along with the possible corrections and optimizations according to the existing best practices in coding. This approach enhances the performance and reliability of network coding implementations on the side of developers and also enhances innovation and creativity.

Deep Learning Decoders

Utility of the deep learning for decoding the network coding schemes has been found significant as mentioned in the below researches. These advanced algorithms improve the drawbacks of conventional decoding methods, including decoding complexity and achievable decoding delay. A common area of its usage is spot polar decoders, for instance, where utilization of dominant learning approaches is applied to address the complexity and enhance the erasure correction. For example, researchers have proposed forming deep neural network-based belief propagation (BP) decoders that lower computational complexity and memory requirements by conventional BP decoders. RNN-based polar BP decoders have been proposed in the literature as well, together with the weight quantization methods to achieve more efficient implementation for decreasing computational load and memory utilization. These approaches have been shown to involve gains in decoding rates with or even increased error correction performance.

Reinforcement Learning for Adaptive Coding

Reinforcement learning (RL) has quickly developed into an effective means of designing learnable network coding policies. This interactive capability of machine learning helps the network coding systems to

acquire and manage changes in the channel admission and network architectures. Another active use of RL in network coding is in the area of the sliding coding window. To solve this problem, researchers have implemented dynamic control of the sliding coding window by utilizing the Q-learning algorithms. This adaptive approach also reduces the utilization of network resources and provide better reliability of the transmission. In addition RL has been applied for the determination of coding coefficients in random linear network coded (RLNC) systems. Using Deep Q-Networks (DQN) these systems can learn how to choose suitable coding coefficients depending on packets in the current window and past coding data. This has a direct solution to the problem of excessively high randomness in RLNC coding coefficients, enhanced decoding probability, and generally better network performance. There is a promising future as applications of machine learning techniques incorporated in network coding will lead to improving the reliability of communication networks. Thus, it will be possible to witness a constant refinement of the code design, the decoding process, as well as adaptive coding strategy, all of which are bound to create even a more efficient method of data communication across different networks.

CONCLUSION

The results assuming network coding gives a great perspective for transformation of communication networks, but at the same time provides a more efficient, reliable and secure communication. Their diffusion across multiple fields from wireless systems to fog and cloud environments demonstrates their roles in modern networking. The combination of network coding with machine learning methods has extended new opportunities, which creates new developments in code design, decoding processes and adaptive coding. This paper analysed the current progress and future potential of network coding techniques in providing essential input to future communications networks. Continuing research in this area with enhanced

technologies used in the network field is therefore expected to lead to improvement of better, efficient and secure networks. Such a progress will be crucial to satisfy the rising needs of modern communication systems such as B5G, 6G, and others and to solve the problems associated with the constant evolution of technologies that connect devices and people.

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