Hydra: Practical Metadata Security for Contact Discovery, Messaging, and Dialing

David Schatz, Michael Rossberg and Guenter Schaefer

Telematics and Computer Networks Research Group, Technische Universität Ilmenau, Germany

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Abstract: Communication metadata may leak sensitive information even when content is encrypted, e.g. when contacting medical services. Unfortunately, protecting metadata is challenging. Existing approaches for anonymous communications either are vulnerable in a strong (but feasible) threat model or have practicability issues like intense usage of asymmetric cryptography. We propose Hydra, a mix network that is able to provide multiple anonymous services in a uniform way. In contrast to previous messaging systems with strong anonymity, we deliberately use padded onion-encrypted circuits. This allows to support connectionless applications like contact discovery with authenticated key exchange, messaging, and dialing (signalling for connection-oriented communications) with strong anonymity and relatively low latency. Our cryptography benchmarks show that Hydra is able to process messages an order of magnitude faster than state of the art messaging systems with strong anonymity. At the same time, bandwidth overhead is comparable to previous systems. We further develop an analytical model to predict the end-to-end latency of Hydra and validate it in a testbed.

1 INTRODUCTION

IP-based human-to-human communications like email, instant messaging and Voice over IP (VoIP) are ubiquitous in the private and professional sector. Consequently, it is crucial to protect the privacy of users. While confidentiality of content is achieved by cryptographic mechanisms, communication *metadata* is more challenging to protect. Unfortunately, metadata leakage may also be a serious privacy invasion for users. E.g., the mere fact that someone contacted a specific counseling or medical service may allow to infer sensitive information (Mayer et al., 2016). One challenge for realizing metadata confidentiality (*anonymity*) is that various characteristics of IP packets (like size, encrypted content) may be correlated at different positions in the network.

Using communication mixes (Chaum, 1981) is a promising approach to overcome the challenges: Routing uniformly sized messages across multiple relays and utilizing layered encryption defeats many attacks, even if some relays act maliciously. Messages are further mixed in batches to prevent timing analyses. A more severe challenge for protecting anonymity in the presence of global observers are long-term intersection/disclosure attacks exploiting user churn (Pham et al., 2011; Oya et al., 2014). To mitigate disclosure attacks, users should appear to be online as long as possible, even when they are not participating in a communication. For this, recent anonymous messaging systems rely on synchronized rounds, requesting every user to send a message every round (Lazar et al., 2018; Gelernter et al., 2016; Kwon et al., 2017). They further require asymmetric cryptography for layered encryption, restricting their scalability: Supporting millions of users with low end-to-end latency requires many powerful mixes.

In contrast, scalability for connection-oriented applications is achieved by onion routing, with Tor being the most prominent implementation today (Dingledine et al., 2004): Users create circuits beforehand by exchanging session keys with each relay on selected paths. For onion encryption of application data, only symmetric ciphers are required. However, onion routing as implemented by Tor is susceptible to attacks based on traffic and timing analyses. First, timing of circuit setup at different relays may be correlated by malicious mixes. Second, attackers may correlate relative timing between data packets of the same connection at sender and receiver. This is especially effective when attackers introduce artificial patterns, i.e. network flow watermarking (Wang et al., 2007). Recent circuit-based systems like TARANET (Chen et al., 2018) and Yo-

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del (Lazar et al., 2019) tackle both problems: Circuit setup packets are batched and mixed before forwarding. Furthermore, the packet flow of each circuit is shaped to a constant rate at each hop by forwarding packets at deterministic times and injecting dummy packets if necessary (*padded circuit*). Unfortunately, both systems share the drawback that receivers directly attach to circuit endpoints: First, this implies that the same circuit may not be used to contact two different users. Otherwise, observers could infer that these two users have a common contact and thus are likely to also know each other. Second, location anonymity is weak: Malicious users may easily disclose the IP address of their communication partners, e.g. by selecting a cooperating endpoint.

In this article we present Hydra, a system that provides strong anonymity for connectionless services. Similar to Yodel, users are synchronized to periodically create onion encrypted circuits that are used for multiple messages. During such an epoch, only symmetric cryptography is required, significantly improving scalability. Circuit padding provides unlinkability of circuit endpoints to users, even when users disconnect or active attacks are performed. To support common services like contact discovery with authenticated key exchange, messaging, and dialing with low latency, a padding rate like 3 pkt/min is sufficient. Consequently, Hydra is suited for mobile devices, enabling widespread deployment and large anonymity sets. Messages are forwarded across circuit endpoints by a rendezvous mechanism that overcomes the weaknesses of similar systems: Hydra provides strong location anonymity and a circuit may be used for different contacts, the latter inspiring the name Hydra.

The rest of this article is structured as follows: Sec. 2 defines our objectives and threat model. Related work is discussed in Sec. 3. Design details of Hydra are presented in Sec. 4. We evaluate Hydra in Sec. 5 and conclude in Sec. 6.

2 SYSTEM OBJECTIVES AND THREAT MODEL

First of all, users must be able to discover new contacts. This should be possible based on the knowledge of long-term *user pseudonyms*. After contact discovery, users must be able to send arbitrary messages to their contacts, with end-to-end confidentiality and authenticity protected by session keys. When recipients are offline, messages must be stored for later delivery. Non-functional objectives are categorized as follows: Anonymity. Two forms of anonymity need to be focused on: Communication relationships (including metadata like frequency and duration) shall be hidden from third parties (*relationship anonymity*). To avoid geographical tracking (Mayer et al., 2016), *location anonymity* is required, i.e. the mapping of pseudonyms to IP addresses must be hidden from third parties and contacts if they are not trusted. For both forms of anonymity, *graceful degradation* is required: Small fractions of malicious or compromised system entities shall not be able to break anonymity to a disproportional extend. Moreover, *forward secrecy* is desirable, i.e. leaked long-term secrets shall not compromise anonymity of past communications.

Quality of Service (QoS). End-to-end latency of messages shall be low. Acceptable latencies depend on the kind of application: Contact discovery is expected to be used infrequently (once per contact), perhaps accepting latencies up to minutes or hours. Other messages should be delivered in the order of seconds.

Efficiency and Scalability. For fixed system resources, the system shall support many active communications with good QoS. Power consumption for users shall be low to allow usage on mobile devices. Moreover, *horizontal* scalability is required: The system shall be able to support more users by adding more system entities.

Threat Model. We assume powerful attackers: *A* global external attacker may observe, manipulate, delay, drop, replay, or forge packets. However, he cannot bypass cryptographic protections (Dolev-Yao model). In addition, malicious system entities may share their internal state, e.g. key material. In cooperation with external attackers, their goal is to break relationship anonymity of users. Naturally, the fraction of malicious entities is assumed to be limited. *Malicious users* may share their view on end-to-end messages with attackers to break location anonymity of their contacts.

3 RELATED WORK

We focus on anonymity systems that use communication mixes (Chaum, 1981) as a building block. To recap, the main idea of a mix is to collect fixed-sized messages in a batch, discard duplicates, transform bit patterns in a cryptographically secure way and forward messages in randomized order. Using a chain of mixes and layered encryption defeats a limited number of malicious mixes. For completeness, we note that there are other primitives to anonymous communication, namely Dining Cryptographer networks (DC-nets) (Chaum, 1988) and private information retrieval (PIR). However, these techniques suffer from inherent scalability issues due to broadcast mechanisms or computational expensive operations. Consequently, they are only suited for small user populations. Riposte (Corrigan-Gibbs et al., 2015) uses ideas from both DC-nets and PIR, but introduces latencies of several hours for one million users.

Mix Networks. Many mix networks have been proposed to provide anonymity for connectionless applications. Recent proposals share a core concept (Van Den Hooff et al., 2015; Tyagi et al., 2017; Lazar et al., 2018; Gelernter et al., 2016; Kwon et al., 2020): Users send and receive onion-encrypted packets to exchange messages via some form of mailboxes. Mailbox identifiers are used to match messages of contacts even though their location is hidden behind a path of mixes. To defeat long-term disclosure attacks, periodic and synchronized rounds are enforced. In each round, every user is expected to participate. This implies creating dummy messages if no real messages have to be sent. Atom (Kwon et al., 2017) shares similar ideas, but does not expect users to participate every round, facilitating disclosure attacks.

Systems mentioned so far mainly differ in path selection, mailbox management, and defense against active attacks. Unfortunately, they all share drawbacks that limit their practicability: First, onion encryption uses asymmetric cryptography every round, limiting scalability. Supporting more users either degrades latency or requires significantly more mix resources. Second, mailbox identifiers (or shared secrets in general) rely on out-of-band exchange, introducing another attack vector. Moreover, mailbox identifiers are valid for exactly one round in some designs (Van Den Hooff et al., 2015; Tyagi et al., 2017; Lazar et al., 2018). As a result, contacts may only exchange messages when both participate in the same round (no offline storage). This also degrades location anonymity over time because rounds in which senders definitively were online are leaked to receivers.

Riffle (Kwon et al., 2016) allows users to anonymously upload messages to a set of servers efficiently: After a setup phase, messages are onion-encrypted with a symmetric cipher for multiple rounds. Unfortunately, anonymous download by receivers is not as efficient because it relies on PIR or broadcast.

Loopix (Piotrowska et al., 2017) introduces Poisson mixing: Instead of mixing in explicit batches or synchronized rounds, users select a random waiting time at each mix, exponentially distributed. Moreover, users send real messages and dummy messages following a Poisson process. Its arrival rate controls the trade-off between latency and overhead on a peruser basis. Unfortunately, sending less messages in an asynchronous systems leads to smaller anonymity sets on average, accelerating disclosure attacks, despite attackers' uncertainty due to mixing and cover traffic (Oya et al., 2014). Location anonymity relies on honest "providers" that act as offline-storage.

cMix (Chaum et al., 2017) avoids asymmetric cryptography at users for sending messages. Asymmetric cryptography by mixes is pre-computed, not degrading message latency. However, the protocol only works for a fixed mix cascade. Thus, cMix either does not scale horizontally, or anonymity sets are partitioned by using independent cascades in parallel.

Alpenhorn (Lazar and Zeldovich, 2016) uses identity-based encryption (IBE) to exchange a secret between contacts, and implements a dialing protocol: The secret is used to initialize a hash chain providing session keys and dial tokens. Using a synchronized mix network, the initiator sends the current dial token to a public mailbox server. To protect location anonymity of responders, dial tokens are stored in a Bloom filter that is fetched by every user. Subsequently, users check the existence of all possible tokens they know. To keep Bloom filters efficient, mailboxes may be split to multiple filters based on the hash of users' pseudonyms. However, this partitions responder anonymity sets because queries are not protected by mixes. Due to Bloom filter encoding, Alpenhorn is not able to support arbitrary messages.

Circuit-based Systems. To reduce the number of asymmetric cryptographic operations, many systems use pre-built circuits, Tor (Dingledine et al., 2004) being the most prominent example. During circuit setup, users and relays negotiate keys for subsequent onion encryption with *symmetric* ciphers. If responder anonymity is desired, users may setup hidden services. For this, service identifiers are publicly mapped to introduction points to which responders connect via circuits. While Tor defeats weak attackers with low overhead, it deliberately does not provide strong anonymity: Aiming at minimal circuit setup time and end-to-end latency allows various timing correlation attacks like watermarking (Wang et al., 2007).

Herd (Le Blond et al., 2015) and Aqua (Le Blond et al., 2013) are designed for anonymous VoIP and file sharing, respectively. They use onion routing similar to Tor, but hide activity patterns of users and circuit setup from observers by link padding. However, there is no protection from malicious mixes trying to correlate circuit setup at different positions in the network. Yodel (Lazar et al., 2019) provides VoIP calls with strong anonymity. To defeat disclosure attacks, users are synchronized to build two padded circuits every round, even when they are not in an active call. Unfortunately, location anonymity regarding a malicious contact a is weak: If there is a malicious mix v, a may simply select v as his circuit endpoint, forcing his contact to attach to v without protection. Similar, circuits cannot be used to contact multiple users. Otherwise, observers could correlate different contacts of a user, which are likely to also know each other.

TARANET (Chen et al., 2018) provides relationship anonymity at network layer. An application's data flow is split across different circuits, each padded to a static rate. While circuit setup packets are batched at each hop, users do not setup any circuits if they are inactive, accelerating disclosure attacks. Furthermore, TARANET deliberately does not provide location anonymity (senders have to know the network location of receivers beforehand).

Conclusion. Defeating disclosure attacks by global observers is challenging. In theory, it requires users to constantly send messages or dummies, preferably in a synchronized way. Besides bandwidth overhead, scalability of recent connectionless systems is mainly limited by using asymmetric cryptography for layered encryption of every message. The opposite approach, padded circuits, is far more promising when padding rates are adjusted to suit common connectionless services. Unfortunately, existing implementations have severe drawbacks as discussed above.

4 SYSTEM DESIGN

Hydra uses padded circuits to achieve strong anonymity in a scalable way. In contrast to similar proposals, circuits are combined with a novel rendezvous mechanism to overcome the deficiencies discussed in Sec. 3. We now define our assumptions, give an overview of Hydra, and present design details: Path selection, circuit design, user registration, contact discovery, and messaging. Finally, we discuss some considerations for users on mobile devices.

4.1 Assumptions and Overview

We assume time synchronization with an accuracy of $\approx 10 \text{ ms}$ between all system entities, e.g. via NTP and GPS. It is used to synchronize start and end times of *epochs* and multiple *rounds* during one epoch. Loss of synchronization results in increased packet loss as described in Sec. 4.3, but does not affect anonymity.



We further assume that users participate in as many epochs as possible to maximize anonymity set sizes and mitigate disclosure attacks.

Fig. 1 gives an overview of Hydra, including communication via circuits and the rendezvous mechanism. The following entities are involved:

- A user set U. Each user $u \in U$ has a pseudonym nym_u and a long-term key pair (k_u^+, k_u^-) . E.g., u may reuse an existing PGP key pair.
- A set of mixes *V*. We assume all *honest* mixes to be independently deployed. For key exchange with forward secrecy, each $v \in V$ generates ephemeral key pairs $(g^{x_{e,v}}, x_{e,v})$ for each epoch *e* and securely deletes old ones. For brevity, we use the classical Diffie-Hellman (DH) notation throughout the section, but elliptic curve DH and post-quantum secure key exchange protocols are also supported.
- Mixes further implement a distributed rendezvous service. For clarity, we denote mixes as the set of rendezvous nodes *R* when acting in this role.
- A contact service cs, which is only trusted to provide availability of contact discovery. If desired by user u, cs stores the mapping (nym_u, k_u^+) .
- A directory service managing available mixes with network addresses and public keys. As the service is trusted to provide unbiased information for path selection, we assume de-centralized deployment, e.g. like Tor's directory servers (Dingledine et al., 2004). The registration process is out of scope, but could be a voluntary-based system like Tor.
- Direct communication between any pair of system entities is assumed to be reliable, e.g. using TCP.

The functionality of Hydra may be summarized as follows: Each epoch consists of two phases, namely *setup* and *communication*. During setup, users establish padded circuits that tunnel various types of messages in synchronized rounds. For end-to-end delivery, a publish/subscribe protocol based on *hydra tokens* is used to forward messages between circuit endpoints via rendezvous nodes *R*. Tokens are generated by cryptographic secure hash functions with

64 bit output. If collisions occur, messages are copied so that all users subscribed to the same token receive them. Confidentiality is still protected by end-to-end encryption of all messages. For each token, the responsible $r \in R$ is determined deterministically, e.g. the directory service could sort *R* by key fingerprints. Then, the modulo operation on tokens may be used to determine the list index. Two types of tokens exist:

- The contact token ct_u of a user u is a hash of k_u⁺.
 Using ct_u, other users may initiate an authenticated key exchange. Alternatively, users may agree on a secret out-of-band. The shared secret is used to synchronize a hash chain that generates session keys with forward secrecy for every epoch.
- Using the session keys, contacts further derive *ren*dezvous tokens. Each rendezvous token rt_{e,a,b} is valid for one epoch e and one pair of users (a, b).

4.2 Path Selection and Dummy Circuits

For each epoch *e* a user wants to participate in, he independently selects a path $p_e \in V^l$ of mixes for his circuit. We denote the *l* possible positions on a path as *layers* and the endpoints of a path as entry and exit mixes/layers. Users select one mix for each layer in $\{1, \ldots, l\}$ uniformly at random, avoiding duplicates (sampling without replacement). As an exception, the entry mix is selected independently, allowing it to be on the path in one additional layer. Otherwise, attackers could rule out possible entry mixes by knowing parts of the path, e.g. the exit mix. Further optimizations of path selection are left for future work, e.g. restricting used links between layers, considering network latency and heterogeneous mix capacities.

Using a fixed path length *l* enables horizontal scalability, but has two important consequences: First, if the number of malicious mixes is $\geq l$, there is a nonzero probability of selecting malicious mixes only, breaking location anonymity for one epoch. This probability may be reduced by increasing l, at the cost of increased latency and overhead. To find suitable values for l, our analytical model developed in Sec. 5.2 may be used. Second, if p_e does not intersect with any other circuits, global observers may identify p_e . We counter this with dummy circuits created by mixes. To be more precise, mixes ensure that adjacent layers are fully connected, i.e. there is at least one circuit using each possible link in V^2 between layer *i* and i + 1. Mixes use the same path selection as users, but with shorter paths depending on the layer *i*. While this results in up to $(l-1) \times |V|^2$ dummy circuits at exit layer when no one uses Hydra, our evaluation in Sec. 5 shows that horizontal scalability for



large user populations is not affected. To defeat flooding attacks, e.g. attackers manage to block all but two users and create a matching number of circuits themselves, v creates at least one dummy circuit at each layer. Dummy circuits are also used by mixes to send messages to themselves, covering observed traffic at rendezvous nodes and the contact service.

4.3 Circuit Design

After selecting a path $p_e = (v_1, ..., v_l)$, users initiate the creation of circuits during the setup phase of epoch *e*. Circuits are subsequently used to transport fixed-sized *cells*. The objective of circuits is to unlink users from messages sent during *one* epoch. Defeating long-term disclosure attacks requires further caution as discussed later. The main threat for anonymity during one epoch are malicious mixes and attackers that control communication links of paths. Especially, attackers might try to link a user to his exit mix by manipulating packet timing (network flow watermarking) or packet content (tagging attacks) in a way that is observable even after packets pass honest mixes.

To avoid leaking information based on timing of circuit setup packets or circuit cells, forwarding between layers is synchronized by time (see Fig. 2). The communication phase is further divided into multiple rounds. Each round consists of one *upstream* and a subsequent *downstream* phase, each transporting exactly one cell per circuit. Before forwarding setup packets or circuit cells, mixes check for duplicates and apply a cryptographically secure transformation rounds, mixes additionally create dummy cells if they did not receive a cell on a circuit in time (both up-and downstream). The duration of one epoch is further specified by three parameters:



Figure 3: Example for authenticated onion encryption of a circuit setup packet for path $p_e = (v_1, v_2, v_3)$, i.e. l = 3.

- The interval Δt_c between synchronized forwarding of cells on adjacent layers. It has to be large enough to allow each mix to receive and process (onion decryption, random permutation) all cells from the previous layer in time. On the other side, Δt_c should not be too high, because the (minimum) end-to-end latency is $\approx 2(l+1)\Delta t_c$. Consequently, Δt_c should dynamically be set based on the expected number of circuits. E.g., mixes may send statistics of past epochs to the directory service, which in turn determines a suitable value for upcoming epochs.
- The interval Δt_w between communication rounds, tuning a trade-off between bandwidth overhead and latency. To compensate for potentially long setup (asymmetric cryptography), this time is used to process setup packets for the next epoch.
- The number *k* of rounds, tuning a trade-off between efficiency and robustness to mix churn: Long epochs are efficient as they avoid asymmetric cryptography for a long time. But if mixes fail, affected circuits break till the start of the next epoch.

To allow a seamless transition between subsequent epochs, the total idle time $k \times \Delta t_w$ has to be long enough to run the next setup phase. Finding suitable values for Δt_c , Δt_w and k is part of our quantitative evaluation in Sec. 5.2. The following paragraphs further detail setup and communication.

Setup Phase. During circuit setup, every user u exchanges session keys s_i with each mix $v_i, 1 \le i \le l$ on his selected path and subscribes to a set of tokens. For this, u sends a single onion-encrypted setup packet (see Fig. 3) to his entry mix v_1 . To create the setup packet, u generates fresh key pairs (g^{y_i}, y_i) . In combination with the ephemeral public key $g^{x_{e,x_i}}$ of mix v_i , session keys s_i are derived from $g^{x_{e,x_i}y_i}$. Furthermore, u generates nonces n_i (96 bit each) and applies an authenticated encryption scheme in layers. Naturally, the innermost layer is destined for the exit mix v_l , containing the tokens that u wants to subscribe to. We suggest to use 256 tokens (adding dummy tokens if necessary) for now, allowing enough contacts for normal usage. Users with more contacts may also

	,	Onion-encrypted						
circld	rndNo	cmd	args	token	payload			
8 B	4 B	7 B	1 B	8 B	240 B			
Figure 4: Packet format of circuit cells.								

subscribe to tokens by using special cells during communication phase as detailed later. However, tokens of frequent contacts should be placed in setup packets to allow receiving matching cells in all communication rounds. Token order is randomized to avoid tokens of the same contact to be linkable across epochs.

After encryption of one layer, n_i and g^{y_i} are added in plaintext so that mixes may decrypt their layer and check the authentication tag τ_i (128 bit). Address information (up to 144 bit for IPv6 address and port) of mix v_i is prepended before applying the next layer of encryption. After successful decryption, mix v_i strips g^{y_i} , n_i , τ_i , and the decrypted address information v_{i+1} before mixing and forwarding the packet. Note that packet sizes decrease deterministically and uniformly at each layer, not leaking information. Finally, the exit mix forwards the tokens to the responsible rendezvous nodes. A random circuit identifier circld is added to the setup packet and re-randomized at every hop. For later usage, mixes map ingress circlds to egress circld, s_i , previous hop and next hop. Moreover, setup packets include the epoch number *e*.

Due to layered encryption, mixes only learn previous and next hop. Honest mixes drop setup packets if authentication fails or duplicates are detected, defeating tagging and replay attacks. Dropped packets are compensated by creating dummy circuits. Replay protection may be based on τ_i : If attackers manipulate the tag to hide a replay, authentication fails. Similar, replays from past epochs result in failed authentication because of fresh DH values of honest mixes. Partially created circuits still participate in the communication phase up to the layer the setup was successful.

Static DH exchange allows users to prepare and send setup packets in advance without having to wait for a response. As a result, users may participate in an epoch e even when they miss the start of e due to loss of connectivity. This is beneficial not only for usability but also for anonymity: Attackers cannot exclude users from anonymity sets based on the fact whether they were online at epoch start.

Communication Phase. During communication phase, circuits transport fixed-sized cells, see Fig. 4. Apart from the circld, which is re-written at every hop, a cell contains the following data:

 The round number rndNo within an epoch, used for detection of duplicates and missing cells. Moreover, it acts as the tweak for a *tweakable block cipher* that is used for onion encryption as motivated later. A tweak is an additional, non-secret input to the block cipher.

- (cmd, args) may be used to send commands to an arbitrary mix on the circuit, inspired by Tor's "leaky pipe" design. Whenever a mix finds the cmd value to be a valid command code after onion decryption, he performs the specified action with optional arguments args. One command may be used to signal the exit mix that the cell contains more tokens to subscribe to at rendezvous nodes as described above. We define two more commands in the corresponding sections about contact discovery and messaging. If a user has no command to send, he randomizes both data fields, resulting in a sufficient small probability of the field being misinterpreted as one of the three valid commands.
- The token, used by exit mixes to forward the cell to the responsible rendezvous node. To not leak tokens to observers, they are encrypted for this step. If a subscription is found, the cell is forwarded to the corresponding exit mix, which in turn injects the data into the downstream circuit. If multiple cells are received for one circuit in the same round, they are queued for subsequent rounds. At epoch end, queued cells have to be dropped. Therefore, applications should implement an error correction protocol on top of Hydra.
- An end-to-end encrypted payload. Its size of 240 B is a reasonable trade-off between usability and bandwidth overhead caused by dummy cells. It should be large enough for most compressed text messages and larger messages may of course be split to multiple cells.

Onion encryption of cells works as usual: In upstream direction, users encrypt the cell *l* times using the exchanged session keys s_i , starting with s_l . Subsequently, each mix decrypts one layer. In downstream direction, mixes add one layer of encryption each, all decrypted by the user. We do not apply any authentication to cells. This is crucial to allow any mix to inject dummy cells that are not distinguishable from real cells by randomizing all bytes: Whenever a mix does not receive a cell for a round in time, he generates, mixes and sends a dummy cell instead. When users do not have real data to send and are online, they also generate dummy cells. Similar, exit mixes generate dummy cells in downstream direction if they do not receive any data from a rendezvous node for a circuit. Dummy cells are discarded by users (downstream) and rendezvous nodes (upstream) because the cell's token is not known (with high probability).

As encryption scheme, we propose to use a tweakable block cipher with a block size of 256 B, i.e. onion encryption works on a single block. Ciphers with a smaller block size may be "extended" to larger blocks (Patarin et al., 2012). Using a tweakable block cipher on a single block has two advantages:

- Decryption of the complete block depends on the tweak, i.e. the rndNo. Consequently, replaying old cells with an increased rndNo to avoid replay detection still leaks no information. That is because the bit pattern of the complete cell changes in an unpredictable way at the next honest hop. Similar, replayed cells from past epochs are transformed in an unpredictable way due to fresh session keys.
- Not using authentication potentially allows tagging attacks on data fields that are predictable. For Hydra, these fields are (cmd, args) and token if it is a contact token or rendezvous tokens are used more than once during an epoch. E.g., using AES in counter mode results in the plaintext being xored with a key stream. Consequently, attackers could tag messages by using xor with few 1 bits and checking for a low hamming distance to a valid command/known token at other hops. Contrary, the complete cell changes in an unpredictable way at the next honest hop when using a single block. This also destroys the token and consequently defeats tagging attacks in the presence of malicious contacts because the cell is not delivered correctly.

4.4 User Registration

Note that users may participate in epochs any time. Registration is only required if a user u wants to publish his pseudonym nym_u and public key k_u^+ with his location anonymity protected. Alternatively, users may use out-of-band mechanisms for contact discovery, e.g. by publishing on their own website or by meeting in person. If registration is desired, u generates (or requests) a cryptographic binding bind_u for k_{μ}^{+} to defeat impersonation. If this requires communication, circuits may be used to protect user locations. We do not enforce a specific implementation, but assume that u's contacts may verify bind_u. A fingerprint of k_u^+ could be used and verified outof-band, e.g. by meeting in person. Existing (verified) public keys may also be reused, e.g. from PGP. To register, u uses the payload of (multiple) cells to send $(nym_u, k_u^+, bind_u)$ to the contact service, using a reserved token. However, u should participate in a random number of epochs before registration. Otherwise, users who setup a circuit for the first time are linkable to new requests to the contact service.

4.5 Contact Discovery

The objective of contact discovery is an authenticated key exchange. A pre-condition for contacting a user b for the first time is to know its pseudonym nym_b or public key k_{b}^{+} . Furthermore, b has to subscribe to his contact token ct_b on a regular, but random basis. Subscribing to ct_b every epoch is risky for location anonymity: If attackers block all packets of b (and only his), a malicious contact service may observe the missing subscription and link b's IP address to nym_b . To resist longer blocking, a distribution with a large average (hours) should be used to draw waiting times between subscriptions. To further mitigate the attack, mixes use cells of their dummy circuits to randomly subscribe to publicly known contact tokens. However, b should also use cells for his subscriptions (instead of setup packets) to not be distinguishable. He may further send contact requests to himself to cover how many real requests he gets.

If only nym_b is known, a user a may request $(k_b^+, bind_b)$ from the contact service by using his circuit. Then, a initializes a temporary hash chain with a random seed s, starting at the current epoch e_a . Using the hash chain, temporary session keys and rendezvous tokens may be derived for epochs $e \ge e_a$. Using circuit cells, *a* initiates the contact discovery by sending s addressed to contact token ct_b and encrypted using k_b^+ . As b's subscription is not performed every epoch, the cells are likely dropped by the responsible rendezvous node if no further action is taken. Therefore, we use a special command in these cells to signal that its purpose is contact discovery. Then, the cell is forwarded to the contact service for later delivery instead of being dropped. Missed cells may be polled by b whenever he subscribes to his contact token. We expect this delay in contact discovery to be acceptable because it has to be performed only once per contact. Starting with epoch $e_a + 1$, a subscribes to the temporary rendezvous tokens to receive the response from b. Similar, b subscribes to the temporary tokens as soon as he sends the response, starting at epoch $e_b > e_a$. Then, a and b may tunnel an arbitrary key exchange protocol by using circuit cells addressed to the temporary tokens, protected by using the temporary session keys. Note that a must not initiate discovery for multiple contacts on the same circuit: This would allow to link the contact tokens.

As soon as *a* and *b* share a secret, they use it to synchronize a long-term hash chain to derive future session keys and rendezvous tokens as described in Sec. 4.1. Only then *a* may reveal his identity $(nym_a, k_a^+, bind_a)$ to *b*. While this implies that *b* cannot reject a request before key exchange is done, it is inevitable to protect anonymity with forward secrecy: If k_b^- was compromised, attackers could decrypt anything based on the temporary hash chain.

4.6 Messaging

To receive messages from contact a in epoch e, user b subscribes to the shared rendezvous token $rt_{e,a,b}$. Then, a can send arbitrary messages using the payload of one or multiple cells during the communication phase of e. Note that using the same rendezvous token for a complete epoch leaks the number of exchanged cells to exit mixes, but they cannot link $rt_{e,a,b}$ to a or b. The payload of each cell is secured end-to-end by using authenticated encryption with a session key derived from the hash chain. In contrast to onion encryption, we do not impose restrictions on the used scheme. In case of temporary disconnected users, entry mixes may act as offline storage. Alternatively, a non-trusted storage service may be used, mapping circuit ids to cells. Using reliable communication for all direct communication channels, the message loss probability is expected to be negligible in absence of active attacks. Nevertheless, the messaging application may still run an error correction protocol on top.

End-to-end latency is minimized when every cell is delivered to b the same round i as a sends it. However, this leaks that a was online in round i to malicious contacts. Cooperating with a global observer, b could then perform an intersection attack to disclose a's location over time due to inevitable user churn. Pre-sending cells for future rounds does not help either if a's entry mix is malicious. Consequently, if a does not trust b, he proceeds as follows: For every cell he sends to b, he uses (cmd, args) of the preceding cell to instruct a random mix v on the circuit to delay forwarding by args rounds. If v is neither the entry nor the exit mix, the sending round is unlinked from the receiving round. That is because even if v is malicious, he does not know both circuit endpoints if l > 3. Note that *a* has to consider the "shift" in the rndNo at v to derive the correct tweaks for onion encryption. If v fails to delay the cell correctly, onion decryption fails and the cell is turned into a dummy.

Our protocol is best suited for text-based messaging. When aiming at a low bandwidth overhead during communication, sending rates are low. Consequently, sending application data that requires many cells to be encapsulated is possible, but introduces large end-to-end latencies. Still, Hydra can be used to dial a contact and agree on a switch to an anonymous protocol that supports higher bandwidth. E.g., an anonymous VoIP service could be used to also transport pictures. Unfortunately, user populations are expected to be smaller for these applications, possibly degrading anonymity. Further note that users sending/receiving many messages in a short time-frame might experience increased end-to-end latency due to queuing delay. That is because messages have to be multiplexed over one circuit with low sending rates. If users do not mind leaking the fact that they (plan to) send/receive with high rates, they may create multiple circuits per epoch to increase throughput.

4.7 Notes on Mobile Devices

While the timing shown in Fig. 2 achieves the lowest end-to-end latency, it requires users to be active twice per communication round (send and receive at different times). To optimize battery life on mobile devices at the cost of an increased latency of $\approx \Delta t_w$, users may instead fetch the downstream cell of round *r* while sending the upstream cell of round r + 1.

While developing a prototype client application for Android, we further noticed that new versions of Android enter "doze mode" very quickly after turning off the screen. During doze, an application cannot schedule an accurate wake timer (it may be delayed up to some minutes). Even explicitly asking the user for permissions cannot completely circumvent these restrictions. A workaround is to use Google's firebase service to periodically send an "external wake timer" to mobile users, using a high priority message. These are guaranteed to not be delayed as long as the application is frequently used ("working set bucket"). Our first prototype confirms that $\approx 90\%$ of "timers" arrive within 1 s. Nevertheless, native support for accurate timers during doze mode is desirable in future.

5 EVALUATION

We start with a qualitatively discussion if and to what extend our objectives (Sec. 2) are met. Many aspects were also discussed in Sec. 4 to guide our design, but are summarized here. Subsequently, a quantitative evaluation shows the practicability of Hydra using an analytical model, validated by a prototype.

5.1 Qualitative Discussion

Hydra supports contact discovery, messaging, and dialing with key exchange and offline storage. The following paragraphs discuss non-functional properties.

QoS, Efficiency, and Scalability. Using circuits for many rounds enables an efficient deployment. Overlapping epochs allow compensation of potentially

long circuit setup times (asymmetric cryptography). However, epochs should not be too long with regard to robustness: A failing mix disrupts communication for many circuits for up to two epochs because the setup phase of the subsequent epoch may also be affected. The minimum epoch length to compensate for the setup phase is part of our quantitative evaluation. The interval Δt_w between subsequent rounds tunes a trade-off between end-to-end latency and overhead. The overhead is limited to efficient symmetric cryptography and small dummy cells. We further evaluate this trade-off in our quantitative evaluation as it also affects setup time. Preparing setup packets beforehand and using padded circuits enable users to skip some rounds or complete epochs without degrading anonymity. This is especially useful for usage on mobile devices (power saving, temporary loss of connectivity). Increased latency for receiving messages often is acceptable, e.g. when a user does not want to be disturbed anyway. Horizontal scalability is part of our quantitative evaluation: On the one hand, adding more mixes decreases the number of user circuits one mix has to handle at each layer. On the other hand, adding more mixes potentially increases the total number of circuits due to more dummy circuits.

Anonymity. We start by discussing possible attack vectors by weak attackers and (cumulatively) move on to more powerful attackers. The weakest attackers we assume are global observers. They observe when users join Hydra and in which epochs they participate. However, they cannot track paths of circuits due to onion encryption and synchronization for both setup and communication phase. This is true even when only few users participate (e.g. bootstrapping Hydra) because mixes also create dummy circuits to ensure that every possible link carries a circuit. If only two users are online, observers cannot decide whether they are communicating or not: They observe traffic to/from both users, and to/from rendezvous nodes and the contact service in any case because mixes also send subscriptions, contact requests and end-to-end messages on dummy circuits. Furthermore, observers cannot read any tokens due to encryption between exit mixes and rendezvous nodes/contact service.

Active external attackers may further drop, delay, replay, manipulate, or forge packets. Dropping setup packets does not leak information as it is similar to a scenario where only few users participate. Especially, missing subscriptions to contact tokens are covered by mixes randomly subscribing to user tokens. Dropping or delaying circuit cells has no observable effect on circuit endpoints due to synchronization and padding: Because authentication of cells is avoided, dummies are not distinguishable from real cells. Incidentally dropping a cell, with content (cmd/contact tokens) that is predictable for attackers, has no observable effect either, because attackers do not know when those are sent. Replay protection is employed for both phases. Tagging attacks are defeated by layered authentication for setup packets and by using a tweakable block cipher with a large block size for cells. Forging setup packets is detectable due to authentication. Forging a cell for round i is possible and potentially has the same effect as dropping the cell with rndNo = i because mixes only forward one cell per round. Nevertheless, the bit pattern of forged cells changes at the next mix in an unpredictable way, leaking no information. In summary, anonymity sets include all active users. Disclosure attacks based on user churn are still possible in theory and will always be in any anonymity system. Nevertheless, by supporting large users populations and minimizing observable churn by pre-sending setup packets, disclosure attacks are mitigated as good as possible.

If at least one mix v on a path is honest, malicious mixes positioned before and after v cannot infer that they are part of the same circuit: Any manipulation of packets before they reach v has no observable effects after passing v. If the honest mix v further is not the entry mix, dummy circuits ensure that attackers cannot further track possible path prefixes/suffixes as there is at least one circuit between v and all other mixes in both adjacent layers. If only the entry mix of a circuit is honest, attackers can narrow down the location anonymity set to all users that use this entry mix. At worst, all mixes are malicious and location anonymity is broken. Relationship anonymity is preserved unless the circuits of both contacts are completely malicious. Malicious exit mixes further observe the number of exchanged real messages for a rendezvous token, but cannot link them to users.

Malicious directory servers may try to manipulate path selection by not announcing honest mixes or replacing address information and public keys. This is defeated by a distributed consent of multiple servers. Nevertheless, the number of malicious directory servers has to be limited to guarantee security. A malicious contact service may observe the number of contact requests to a given contact token. However, this information is fuzzy because users also contact themselves. Apart from the contact token, packets relayed by the contact service only contain an encrypted random seed. The contact service cannot manipulate the user database because of cryptographic bindings.

Malicious users may attack location anonymity by intersection if they can infer in which round their contacts were definitively sending cells. To defeat such

attacks, we allow users to delay forwarding of cells within their circuit. There is a theoretical attack on location anonymity of user a in epoch e by a malicious user b, an external attacker (or entry mix) and a malicious rendezvous node r responsible for $rt_{e,a,b}$: If the setup packet of a is dropped (and only his) robserves the missing subscription to $rt_{e.a.b.}$. However, attackers have to guess which setup packet to drop. If they drop the wrong one, they can only exclude a single user from the anonymity set. And even if attackers guess correctly, *a* is still indistinguishable from all users that do not participate in epoch *e*, e.g. because they are temporarily offline. Further note that a similar attack on location anonymity exists in any system: If one user is permanently blocked and the malicious contact does not receive new messages afterwards, attackers may assume that the guess was correct.

If attackers manage to forge cryptographic bindings of public keys to users, they may impersonate users at the contact service. Subsequently, they may wait for contact requests to disclose communication relationships. Consequently, secure handling of public keys is crucial, but outside the scope of this article.

5.2 Quantitative Evaluation

We aim to answer the following research questions:

- Given fixed capacities (number of mixes, their processing power and bandwidth), how many users may be supported with good end-to-end latency?
- How does Hydra's performance compare to other approaches that provide strong anonymity? To the best of our knowledge, Karaoke (Lazar et al., 2018) is one of the most efficient candidates to date and is therefore used for our comparison.
- Can Hydra support more users by adding more mixes, despite increased overhead due to dummy circuits (horizontal scalability)?
- How many rounds must circuits be used to allow the next setup phase to complete in time?

We answer the questions using an analytical model. Furthermore, performance results are validated using a prototype of Hydra deployed on a small testbed.

Model. Let n = |U| be the number of users and m = |V| the number of mixes. We assume each mix to have identical performance characteristics, i.e. using the minimum. The available bandwidth is denoted by β (full duplex). To model bandwidth overhead caused by a reliable transport protocol, the effective bandwidth is $\eta_t \times \beta$, with $\eta_t < 1$. Each mix may process setup packets on a single core with a rate

Table 1: Default parameters.						
Parameter	Default	Comments				
т	100					
t	18	AWS c4.8xlarge				
f	0.2					
l	14	$\Pr(\tilde{C}) \le 1.7 \times 10^{-10}$				
σ_s	$l \times 102 \mathrm{B} + 2064 \mathrm{B}$	ECDH, Curve448				
σ_c	268 B					
δ	100 ms					
ω	10 ms					
β	$10{ m Gbits^{-1}}$					
η_t, η_c	0.25					
Δt_w	30 s					

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of μ_s , and circuit cells with a ratio of μ_c , both given in pkt/s. To model the total processing power, μ_s and μ_c are further multiplied by the number t of cores and a factor $\eta_c < 1$ that models additional overhead, like key lookups and thread synchronization. We further denote the maximum propagation delay between any pair of mixes by δ and the maximum clock offset (time synchronization) by ω . The size of setup packets (at clients) is denoted by σ_s , cell size by σ_c . For our model, a constant fraction f < 1 of mixes is malicious, i.e. a total of $\tilde{m} = |f \times m|$. If $l \leq \tilde{m}$, the probability Pr(C) of a circuit to consist of malicious mixes only (the entry mix may be duplicated) is:

$$\Pr(\tilde{C}) = \frac{\tilde{m}}{m} \times \frac{\tilde{m}}{m} \times \frac{\tilde{m}-1}{m-1} \times \dots \times \frac{\tilde{m}-l+2}{m-l+2} \le \left(\frac{\tilde{m}}{m}\right)^l \quad (1)$$

If not stated otherwise, we use the parameters shown in Table 1. For fair comparison with Karaoke, the values are inspired by their setup using 100 Amazon AWS c4.8xlarge instances as mixes (Lazar et al., 2018). Note that they use very long paths, l = 14, which should be reconsidered in practical deployments. Our default cryptographic algorithms are ECDH on Curve448 for key exchange and AES-256-GCM for authenticated encryption during setup. Onion encryption of cells uses the Threefish cipher with 128B block size and 12 rounds of a Feistel network to double the block size as described in (Patarin et al., 2012). To find reasonable values for μ_s and μ_c , we benchmarked single core performance for one minute, using openssl speed (asymmetric cryptography) and our prototype code (Threefish). To approximate single core performance of an AWS c4.8xlarge instance, we benchmarked an Intel Core i7-7500U. Mixes in our testbed use an AMD GX-412TC at 1 GHz. The results are shown in Table 2 and already indicate the significant advantage of Threefish for onion encryption of cells.

Dummy Circuits. As the processing time at each layer highly depends on the total number of circuits, we first approximate the expected number E(F) of

Table 2: Cryptography benchmark, single core.

Algorithm	i7-7500U	<i>GX-412TC</i>
Curve448	1745 pkt s ⁻¹	$128\mathrm{pkts^{-1}}$
Curve25519	29 705 pkt s ⁻¹	1550 pkt s ⁻¹
Threefish	336 604 pkt s ⁻¹	39245 pkt s ⁻¹

dummy circuits. For this, we approximate our path selection strategy by allowing duplicates at any layer. Then, there are m^2 possible links between each pair of adjacent layers, i.e. up to m^2 new dummy circuits at each layer. Furthermore, every mix creates at least one dummy circuit per layer. Given the expected number n_i of "regular" circuits (users and dummy circuits created in previous layers) arriving at layer *i*, the expected number of *new* dummy circuits $E(F_i)$ is:

$$E(F_i) = m + m^2 \times (1 - 1/m^2)^{n_i}$$
(2)

Summing all $E(F_i)$, $1 \le i \le l-1$ yields the total expected number of dummy circuits E(F).

End-To-End Latency. The duration of both setup phase and one round of communication depends on the number $c_{i,v}$ of circuits a mix v has to handle at layer *i*. A reasonable (with high probability) upper bound for all $c_{i,v}$ may be determined as follows: First, the exit layer l has the highest load due to E(F) additional dummy circuits. Second, $c_{l,v}$ may be modelled by a Binomial distribution because all mixes have the same probability of being used as exit mix: $c_{l,v} \sim B(n + E(F), 1/m) = B_{l,v}$. Consequently, reasonable upper bounds for all $c_{i,v}$, $1 \le i \le l, v \in V$ are given by the quantiles \tilde{c}_q of $B_{l,v}$. We use q = 0.99for the remaining evaluation.

To process the cells of all circuits in time without packet loss, the lower bound for Δt_c (interval between synchronized forwarding on adjacent layers during communication phase) is as follows:

$$\Delta t_c \ge \omega + \delta + \max\left\{\frac{\tilde{c}_q \times \sigma_c}{\eta_t \times \beta}, \frac{\tilde{c}_q}{\eta_c \times t \times \mu_c}\right\}$$
(3)

It is dictated by the (assumed) accuracy of time synchronization (receiver clock may be ahead of sender clock by ω), the maximum propagation delay δ between any pair of mixes and the forwarding bottleneck (either communication bandwidth or cryptographic performance). The lower bound for the duration of one communication round and thus the end-toend latency of a message is given by $d_c = 2(l+1)\Delta t_c$. Additionally, the end-to-end latency is increased by $(d_c + \Delta t_w)/2$ on average because users first have to wait for the start of the next round. The resulting average end-to-end latency is depicted in Fig. 5. For comparison, we included the empirical results from



Figure 5: Average end-to-end latency for Karaoke, Hydra, and an instantiation of our model with Curve25519 for cells.



Figure 6: Average end-to-end latency of Hydra for varying m and n, with fixed ratios m/n.

Karaoke (Lazar et al., 2018), scenario with 100 AWS c4.x8large instances (up to 16 million users). Note that we multiplied their results by 1.5 to compensate for the average waiting time till the next round starts (while $\Delta t_w = 0$ in Karaoke, rounds cannot overlap). Furthermore, we also instantiated our model by using Curve25519 for onion encryption of cells instead of Threefish. This basically models a generic anonymity system that works similar to Karaoke and uses asymmetric cryptography for every message. Note that this instantiation (with $\eta_t = \eta_c = 0.25$, $\Delta t_w = 0$) predicts the performance of Karaoke quite accurately and thus can be used as an extrapolation for more users. Further note that optimized implementations of both Karaoke and Hydra potentially yield higher values for η_t and η_c , i.e. lower end-to-end latency.

As expected, our results show that using a symmetric cipher for cells drastically improves the scalability. Nevertheless, the end-to-end latency may be comparatively high for very small user populations due to the inevitable waiting time between rounds.

Scalability. Fig. 6 shows the average end-to-end latency of Hydra for varying number of users and mixes, with fixed ratios m/n of mixes per users. The results show that Hydra is able to scale horizontally: More users can be supported without degrading latency by proportionally adding more mixes. Note that for fixed *n*, deploying more mixes has limited advantages: Many mixes per user may increase the overhead due to additional dummy circuits and waiting times between rounds still impose a lower bound on average end-to-end latency (15 s for $\Delta t_w = 30$ s).



Figure 7: Minimum epoch duration in Hydra.

Epoch Duration. As shown above, Δt_w should not be too high. However, smaller values for Δt_w decrease energy efficiency for mobile devices. Furthermore, an epoch needs more communication rounds *k* to allow the setup to finish in time when Δt_w is small, potentially degrading robustness. Consequently, a good trade-off has to be found. Similar to our calculations above, the total setup time d_s is:

$$d_{s} = (l-1) \left(\omega + \delta + \max \left\{ \frac{\tilde{c}_{q} \times \sigma_{s}}{\eta_{t} \times \beta}, \frac{\tilde{c}_{q}}{\eta_{c} \times t \times \mu_{s}} \right\} \right)$$
(4)

To allow the setup to finish in time, d_s further has to be less or equal to the total idle time during one epoch:

$$d_s \le k \times \Delta t_w \tag{5}$$

Then, the epoch duration d_e , which is the twice the communication duration, is bounded as follows:

$$d_e \ge 2k(d_c + \Delta t_w) \ge 2 \left[\frac{d_s}{\Delta t_w}\right] (d_c + \Delta t_w) \tag{6}$$

The lower bound increases quadratically with the number of users, because both d_s and d_c increase. This can also be seen in Fig. 7. Consequently, using a "weaker" curve (Curve25519 still has a security level of ≈ 128 bit) may be a reasonable trade-off to avoid very long epochs when user population grows.

Testbed. We implemented a prototype of the core Hydra mix functionality (synchronized forwarding and rendezvous) in Rust, using gRPC as user API and plain TCP for relaying cells between mixes. We deployed m = 9 mixes using PC Engines APU3c4 SoCs (system on a chip, $\beta = 1 \text{ Gbit s}^{-1}$, t = 4 cores at 1 GHz). As all mixes are directly attached to one switch, $\omega + \delta$ should be negligible. Remaining parameters for the testbed are l = 4, $\Delta t_c = 0.5$ s, $\Delta t_w = 25$ s and k = 20. Circuit setup uses Curve25519. We further implemented a load generator that mimics many users, using their circuits to send one message to themselves every round and measuring packet loss. Our experiments, each running 3 consecutive epochs, show that the small deployment can support up to 260 thousand users with packet loss below 1%. The bottleneck is the comparatively weak CPU. Compared to our model, the results indicate a value of $\eta_c \approx 0.37$.

Summary. Compared to previous messaging systems with strong anonymity, our model shows that Hydra is able to support significantly more users with acceptable latency by not using asymmetric cryptography for every message. Even more users are supported by deploying more mixes. Our findings are supported by benchmarks and a prototype of Hydra.

6 CONCLUSION

Using padded circuits for multiple rounds allows Hydra to support millions of users with strong anonymity and relatively low latency. Further, our rendezvous mechanism avoids shortcomings of previous circuitbased systems with strong anonymity: A circuit may be used to communicate with multiple contacts and location anonymity is significantly improved.

In future, we want to combine Hydra with an anonymity system that is able to support applications with higher bandwidth and stricter latency requirements, like VoIP. For this, a similar protocol may be used, but with tuned parameters and path selection. Moreover, we evaluate post-quantum secure key exchange protocols for circuit setup. Our prototypes are published at https://github.com/hydra-acn.

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