




# Integral order photonic RF signal processors based on a soliton crystal micro-comb source

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## Abstract

Soliton crystal micro-combs are powerful tools as sources of multiple wavelength channels for radio frequency (RF) signal processing. They offer a compact device footprint, a large number of wavelengths, very high versatility, and wide Nyquist bandwidths. Here, we demonstrate integral order RF signal processing functions based on a soliton crystal micro-comb, including a Hilbert transformer and first, second and third-order differentiators. We compare and contrast the results and the trade-offs involved with varying the comb spacing, and tap design and shaping methods.

Keywords: RF photonics, optical resonators, signal processor

(Some figures may appear in colour only in the online journal)

## 1. Introduction

Radio frequency (RF) signal processing functions, including the Hilbert transform and differentiation, are building blocks of advanced RF applications such as radar systems, single sideband modulators, measurement systems, speech processing, signal sampling, and communications [1–50].

Although the electronic digital-domain tools that are widely employed enable versatile and flexible signal processing functions, they are subject to the electronic bandwidth bottleneck of analog-to-digital converters [4], and thus face challenges in processing wideband signals.

Photonic microwave and RF systems [1–10] have experienced significant attention over the past 20 years because of their combined ability to achieve very high bandwidths, together with their low loss and very high immunity to electromagnetic interference. Many approaches to photonic RF signal

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processing have been proposed that take advantage of the coherence of the RF imprinted optical signals—thereby inducing optical interference. These coherent approaches map the response of optical filters, implemented through optical resonators or nonlinear effects, onto the RF domain [7–12]. As such, the ultimate performance of the RF filters largely depends on the optical filters. State-of-art demonstrations of coherent photonic RF filters include those that use integrated micro-ring resonators (MRRs), with Q factors of >1 million, as well as techniques that employ on-chip (waveguide-based) stimulated Brillouin scattering [13, 14]. Both of these approaches have their unique advantages—the former uses passive devices and so can achieve very low power consumption, while the latter can achieve a much higher frequency selectivity, reaching a 3 dB bandwidth resolution as low as 32 MHz.

Coherent approaches generally focus on narrow-band applications where the frequency range of concern is narrow and the focus is on frequency selectivity, and where the filters are generally band-pass or band-stop in nature. In contrast, incoherent approaches that employ transversal filtering structures can achieve a very diverse range of functions over a much wider frequency range, such as Hilbert transforms and differentiations. The transversal structure originates from the classic digital finite impulse response filter, where the transfer function is achieved by weighting, delaying and summing the input signals. Unlike digital approaches that operate under von-Neumann protocols, photonic implementations achieve the entire process through analog photonics, where the weighting, delaying and summing happens physically at the location of the signals, instead of reading and writing back-and-forth from memory.

To achieve the transversal structure optically, four steps are required. First, the input RF signals are replicated, or multicast, onto multiple wavelengths simultaneously using wavelengths supplied from either multiple single wavelength, or single multiple wavelength, sources. Next, the replicated signals are assigned different weights for each wavelength, and then the composite signal is progressively delayed where each wavelength is incrementally delayed relative to the adjacent. Finally, the weighted replicas are summed together by photodetecting the entire signal. The underpinning principle to this process is to physically achieve multiple parallel channels where each channel carries and processes one replica of the RF signal. In addition to wavelength multiplexing techniques, this can also be accomplished with spatial multiplexing, such using an array of fibre delay lines to spatially achieve the required parallelism. Although this is straightforward to implement, it suffers from severe tradeoffs between the number of channels and overall footprint and cost. Exploiting the wavelength dimension is a much more elegant approach since it makes much better use of the wide optical bandwidth of over the 10 THz that the telecommunications C-band offers, and thus is more compact. However, traditional approaches to generating multiple optical wavelengths have been based on discrete laser arrays [6–10], and these face limitations in terms of a large footprint, relatively high cost, and challenges in terms of accurate control of the wavelength spacing.

Optical frequency combs—equally spaced optical frequency lines—are a powerful approach to implementing incoherent photonic RF filters since they can provide a large number of wavelength channels with equal frequency spacings, and in a compact scheme. Among the many traditional methods of achieving optical frequency combs, electro-optic (EO) techniques have probably experienced the widest use for RF photonics. By simultaneously driving cascaded EO modulators with a high-frequency RF source, a large number of comb lines can be generated, and these have been the basis of many powerful functions [46–50]. However, EO combs are not without challenges. On the one hand, they generally have a small Nyquist zone (half of the frequency spacing), limited by the RF source, but the bulky optical and RF devices are challenging to be monolithically integrated. As such, to address the issues of size, reliability and cost-effectiveness for photonic RF systems, integrated frequency combs are a highly attractive approach.

Integrated Kerr optical frequency combs [51–77], or micro-combs, that originate via optical parametric oscillation in monolithic MRRs, have recently attracted significant attention as an innovative and powerful approach to RF photonics because of their ability to generate many highly coherent multiple wavelength channels in an integrated single chip source. They offer a much higher number of wavelengths than typically is available through EO combs, together with a wide range of comb spacings (free spectral range (FSR)) including ultra-large FSRs, as well as a very small size and low complexity. Micro-combs have enabled many fundamental breakthroughs including ultrahigh capacity communications [78–80], neural networks [81–83], complex quantum state generation [84–91] and much more. In particular, they have proven to be very powerful tools for a wide range of RF applications such as optical true time delays [31], transversal filters [34, 39], signal processors [29, 32], channelizers [38, 45] and others [15, 18, 26–45]. They have greatly expanded the capability and performance of microwave signal processors in many respects, including increased resolution (for coherent systems) together with larger bandwidths (for incoherent systems).

In one of the first reports of using micro-combs for RF signal processing, we demonstrated a Hilbert transformer based on a transversal filter that employed up to 20 taps, or wavelengths [36, 37]. This was based on a 200 GHz FSR spaced micro-comb source that operated in a semi-coherent mode that did not feature solitons. Nonetheless, this provided a low enough noise comb source to enable very attractive performance, achieving a bandwidth of over five octaves in the RF domain. Subsequently [15], we demonstrated 1st, 2nd and 3rd order integral differentiators based on the same 200 GHz source, achieving high RF performance with bandwidths of over 26 GHz, as well as a range of RF spectral filters including bandpass, tunable bandpass and gain equalizing filters [32, 33].

Recently, a powerful category of micro-combs—soliton crystals—has been reported [59, 60, 77]. They feature ultra-low intensity noise states and straightforward generation methods using only adiabatic pump wavelength sweeping. Soliton crystals are unique solutions to the parametric

dynamics governed by the Lugiato-Lefever equation. They are tightly packaged solitons circulating along the ring cavity, stabilized by a background wave generated by a mode-crossing. Due to their much higher intra-cavity intensity compared with the single-soliton Dissipative Kerr solitons (DKS) states, thermal effects that typically occur during the transition from chaotic to coherent soliton states are negligible, thus alleviating the need for complex pump sweeping methods.

We have exploited soliton crystal states generated in record low FSR (49 GHz) MRRs, thus generating a record large number of wavelengths, or taps, to achieve a broad array of microwave and RF signal processing functions. These include RF filters [35], true time delays [30], RF integration [43], fractional Hilbert transforms [27], fractional differentiation [42], phase-encoded signal generation [26], arbitrary waveform generation [44], filters realized by bandwidth scaling [39], and RF channelizers [45].

In this work, we further examine transversal photonic RF signal processors that exploit soliton crystal micro-combs. We demonstrate integral order Hilbert transformers as well as 1<sup>st</sup>, 2<sup>nd</sup>, and 3<sup>rd</sup> order integral differentiators and explore in detail the inherent trade-offs between using differently spaced soliton crystal micro-combs and different numbers of tap weights as well as design methods. Our study sheds light on the optimum number of taps, while the experimental results agree well with theory, verifying the feasibility of our approach towards the realization of high-performance photonic RF signal processing with potentially reduced cost, footprint and complexity.

## 2. Operation principle

The formation of Kerr micro-combs is a fundamentally complex process that is enhanced by a high 3rd order nonlinear material refractive index, low linear loss, low two photon absorption, as well as carefully designed dispersion which generally needs to be anomalous in the spectral region of interest [51–65]. A wide range of material platforms have been used to demonstrate micro-comb generation [58], such as magnesium fluoride, silica glass, doped silica glass, or Hydex [66–77], and silicon nitride [53–65]. The MRRs that are the basis to generate the Kerr soliton crystal micro-combs used in this work are shown in figure 1(a). They were fabricated in Hydex glass, a doped silica glass, high refractive index platform, together with Complementary metal-oxide-semiconductor (CMOS) compatible fabrication processes. This platform displays very low linear and nonlinear optical loss, and so very high Q factor MRRs can be produced that feature narrow resonance linewidths, corresponding to Q factors as high as  $1.5 \times 10^6$ . Further, we were able to achieve oscillation in MRRs that had radii as large as  $\sim 592 \mu\text{m}$ , yielding a very low FSR of  $\sim 0.393 \text{ nm}$ , corresponding to  $\sim 48.9 \text{ GHz}$  (figure 1(b)) [54, 55]. For the fabrication process, first Hydex glass was deposited featuring a high-index ( $n = \sim 1.7$  at 1550 nm). The deposition process was low temperature plasma-enhanced chemical vapour

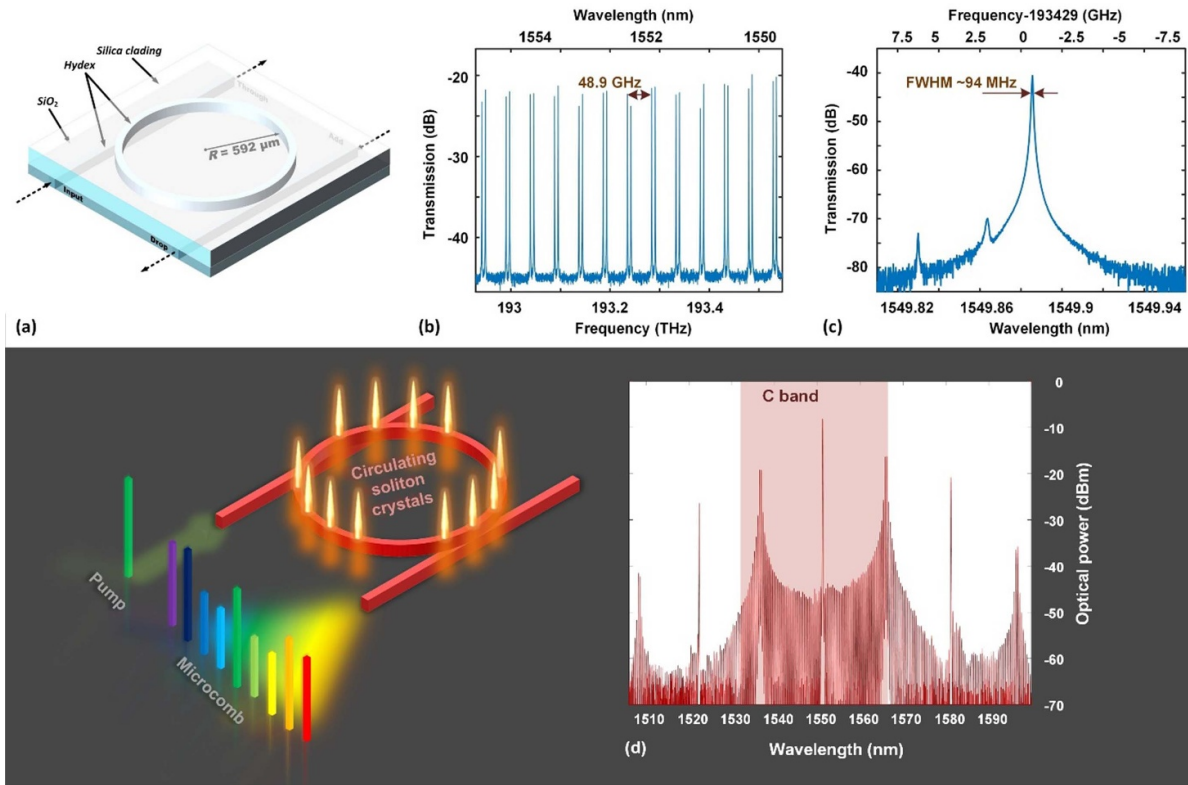
deposition, which was combined with lithography methods pattern to the waveguides, which were based on deep UV stepper mask photolithography. Etching was performed via reactive ion etching, and the last step consisted of deposition of the upper cladding layer. Our devices tend to use a vertical coupling design with a ring resonator core to bus waveguide core gap typically being about 200 nm. This approach can control the gap much more accurately than via lithographic methods since it is determined by film growth. The advantages of the Hydex platform in terms of Kerr optical micro-combs include a very low linear optical loss of typically  $\sim 0.06 \text{ dB cm}^{-1}$ , together with a moderately large Kerr nonlinearity of about  $\sim 233 \text{ W}^{-1} \text{ km}^{-1}$  and most importantly, a vanishing two photon absorption even up to extremely high intensities of  $\sim 25 \text{ GW cm}^{-2}$  [66–78]. The devices were integrated with on-chip mode converters which allowed them to be packaged with fibre pigtailed, resulting in a very low insertion loss for the through-port of 0.5 dB/facet.

To generate soliton crystal micro-combs, we amplified the pump power up to 30.5 dBm. When the detuning between the pump wavelength and the unpumped resonance wavelength decreased so that the power in the MRR reached a threshold, modulation instability (MI) gain driven oscillation occurred.

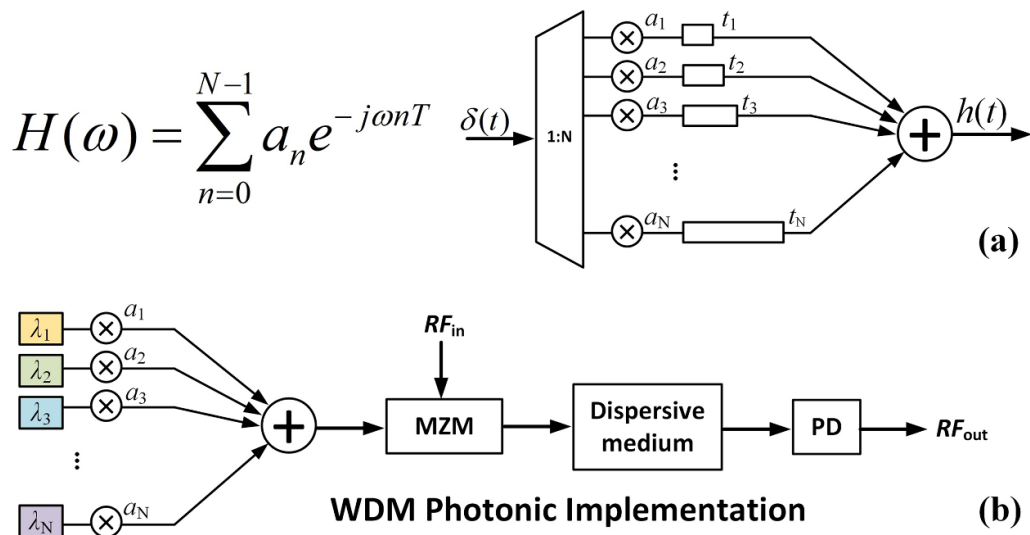
This initially generated primary combs with a wavelength spacing governed by the peak wavelength of the MI gain, which is a function of both the dispersion and power inside the MRR. As the detuning decreased further, distinctive optical spectra were finally observed (figure 1(d)) that were indicative of what has been seen from the spectral interference between tightly packed solitons in a cavity—so-called ‘soliton crystals’ [59, 60]. A second power step jump in the measured intra-cavity power was observed at this point, where the soliton crystal spectra appeared. For microwave and RF applications, particularly with transversal filter structures, we have found that it is not absolutely necessary to achieve complete coherence of the comb lines, or that any specific state is needed such as either single soliton states (DKS) or soliton crystals, in order to achieve high system performance. The only important criterion is to avoid the completely chaotic regime [58] where the RF noise is extremely high. Notwithstanding this, the coherent states still yield the best overall performance and indeed, the soliton crystal states provide the lowest noise states of all the micro-combs that we have employed. As a result, we have focused on these states as the basis for microwave oscillators with extremely low phase-noise [28]. This is an important point since there exists a much wider range of low RF noise coherent states that are more easily achievable than any specific state related to pure solitons [58].

Figure 2 illustrates the conceptual diagram of the transversal structure. A given set of weighted and delayed copies of the input RF signal are multicast onto the comb wavelengths in the optical domain and subsequently summed after photodetection. Generally, the transfer function of a transversal signal processor is given by

$$H(\omega) = \sum_{n=0}^{N-1} a_n e^{-j\omega nT} \quad (1)$$



**Figure 1.** (a) Schematic of the micro-ring resonator. (b) Drop-port transmission spectrum of the integrated MRR with a span of 5 nm, showing an optical free spectral range of 48.9 GHz. (c) A resonance at 193.429 THz with a full width at half maximum (FWHM) of  $\sim 94$  MHz, corresponding to a quality factor of  $\sim 2 \times 10^6$ . (d) (Bottom) Schematic illustration of the integrated MRR for generating the Kerr frequency comb and the optical spectrum of the generated soliton crystal combs with a 100 nm span.

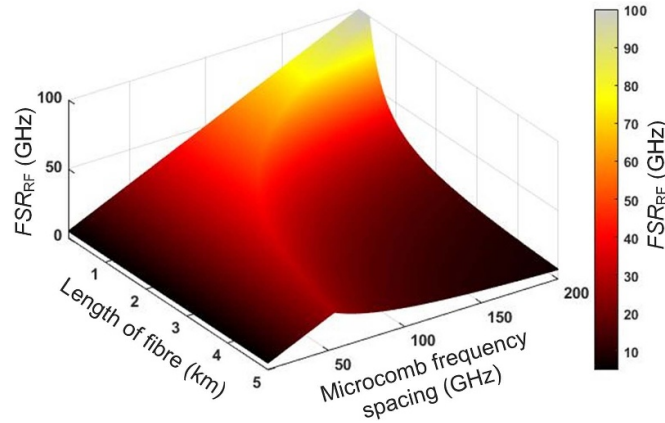


**Figure 2.** Conceptual diagram of the transversal structure. (a)  $H(\omega)$  is the transfer function of the transversal structure, where  $\omega$  denotes the angular frequency,  $N$  equals the number of taps,  $a_n$  is the tap weight of the  $n$ th tap, and  $T$  is the corresponding delays. (b) Experimental realization of the transfer function. Multiwavelength comb sources with different wavelengths provide different delay taps—each wavelength has a different delay generated by the dispersive medium. The summation function is performed by photodetection of the composite signal.

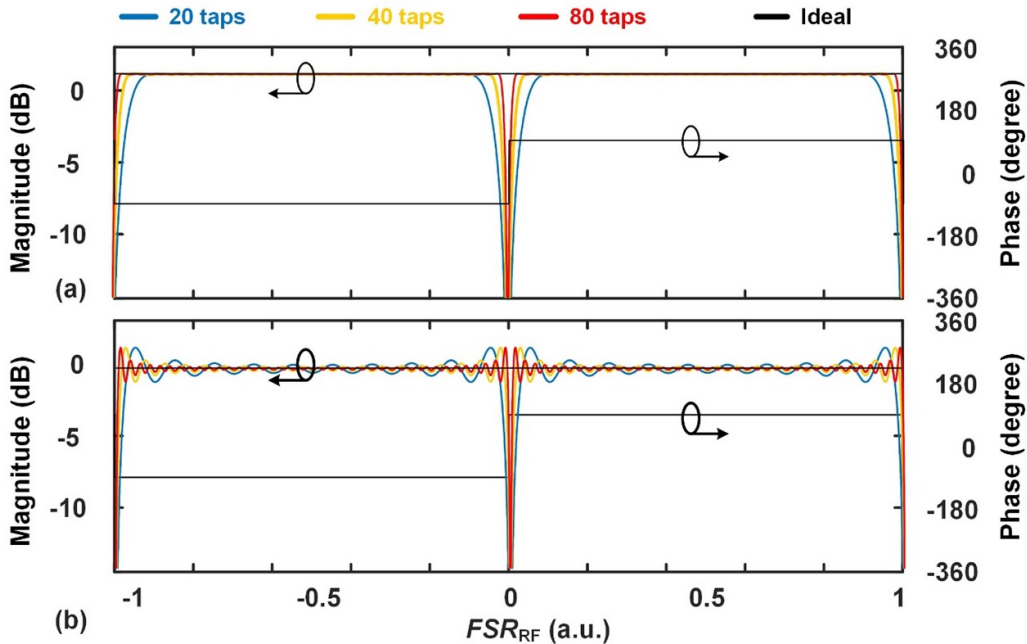
where  $N$  is the number of taps,  $\omega$  the RF angular frequency,  $T$  the time delay between adjacent taps, and  $a_n$  the tap coefficient of the  $n$ th tap, which is the discrete impulse response of the transfer function  $F(\omega)$  of the signal processor. The discrete

impulse response  $a_n$  can be calculated by performing the inverse Fourier transform of the transfer function  $F(\omega)$  of the signal processor [11]. The FSR of the RF signal processor is determined by  $T$ , since  $\text{FSR}_{\text{RF}} = 1/T$ . As the multi-wavelength





**Figure 3.** Free spectral range of the RF transversal signal processor according to the length of fibre and comb spacing. Here we used single mode fibre with the second order dispersion coefficient of  $\beta = \sim 17.4 \text{ ps nm}^{-1} \text{ km}^{-1}$  at 1550 nm for the calculation of  $\text{FSR}_{\text{RF}}$ .



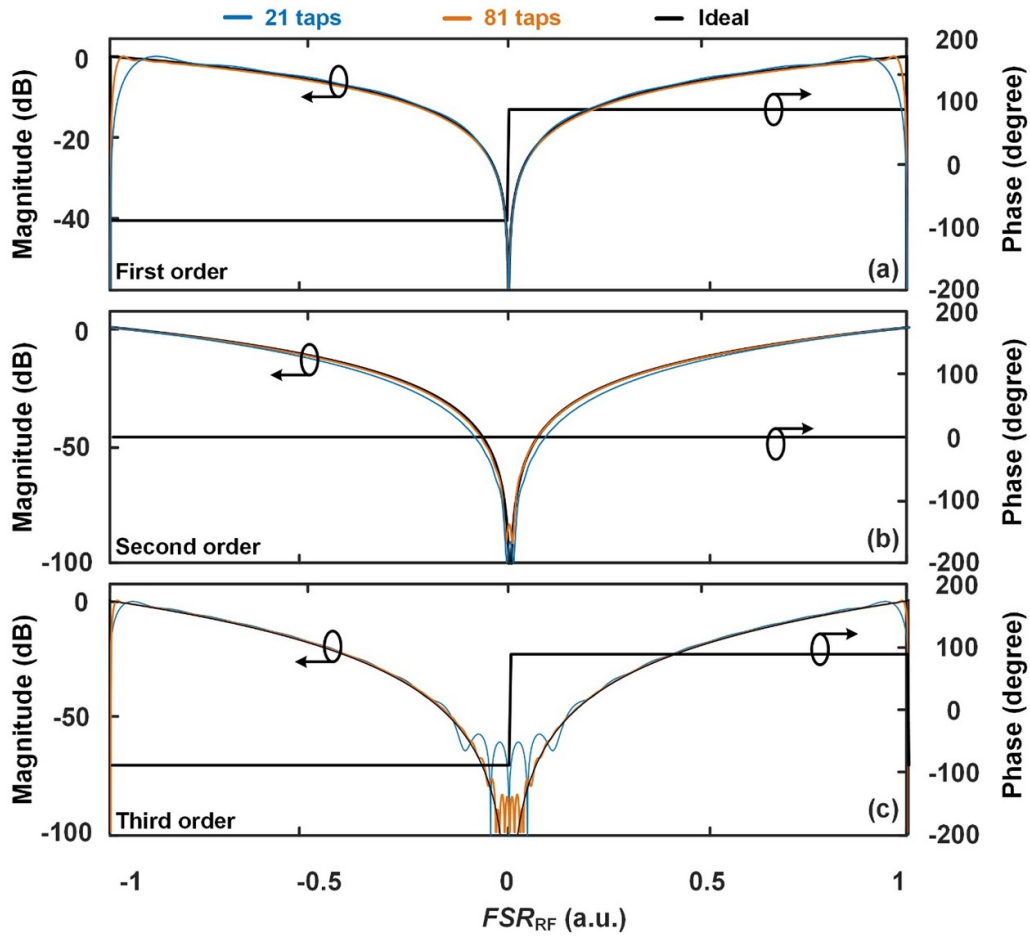
**Figure 4.** Theoretical and simulated RF magnitude according to the number of taps and ideal phase response of a Hilbert transformer with  $90^\circ$  phase shift. (a) With a hamming window applied. (b) Without window method applied.

optical comb is transmitted through the dispersive medium, the time delay can be expressed as

$$T = D \times L \times \Delta\lambda \quad (2)$$

where  $D$  is the dispersion coefficient,  $L$  the length of the dispersive medium, and  $\Delta\lambda$  is the wavelength spacing of the soliton crystal micro-comb (figure 1) which indicates the potentially broad bandwidth RF signal that the system can process. Figure 3 shows the relationship between the wavelength spacing of the comb, the total delay of the fibre, and the resulting RF FSR, or essentially the Nyquist zone. The operation bandwidth can be readily varied by changing

the time delay via a number of means, such as using different delay components. The largest operational bandwidth of the transversal signal processor is given by the Nyquist frequency which is half of the comb spacing. Thus, employing a comb shaping method to achieve a larger comb spacing could enlarge the maximum operational bandwidth. However, this comes with the tradeoff that it yields fewer taps, or wavelengths, over the wavelength range of interest, which in our case is the telecommunications C-band. Hence, the number of comb lines/taps as well as the comb spacing, are both key parameters that determine the performance of the signal processor. We investigate this tradeoff in this paper.



**Figure 5.** Theoretical and simulated RF magnitude according to the number of taps and ideal phase response of (a) first-order differentiator. (b) Second-order differentiator. (c) Third-order differentiator.

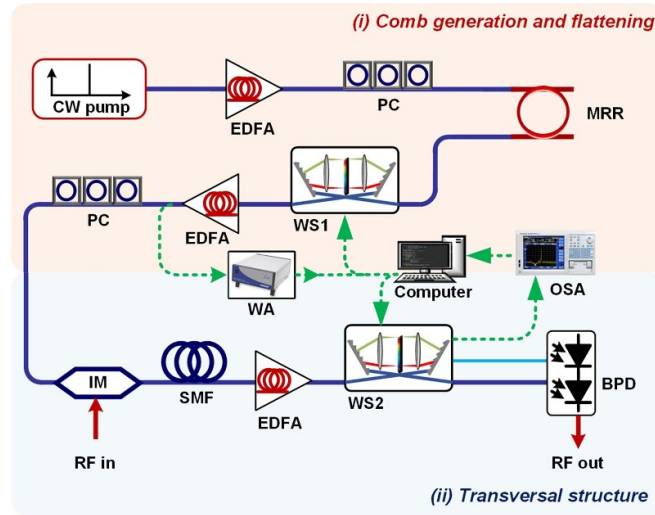
Figures 4 and 5 show the theoretically calculated performance of the Hilbert transformer with a  $90^\circ$  phase shift together with the 1st, 2nd and 3rd order integral differentiators in terms of their filter amplitude response, as a function of the number of taps. Note that a Hamming window [11] is applied in figure 4(a), in order to suppress the sidelobes of the Hilbert transformer. To implement the temporal differentiator and Hilbert transformer, tap coefficients in equation (1) were calculated based on the Remez algorithm [92].

### 3. Experiment

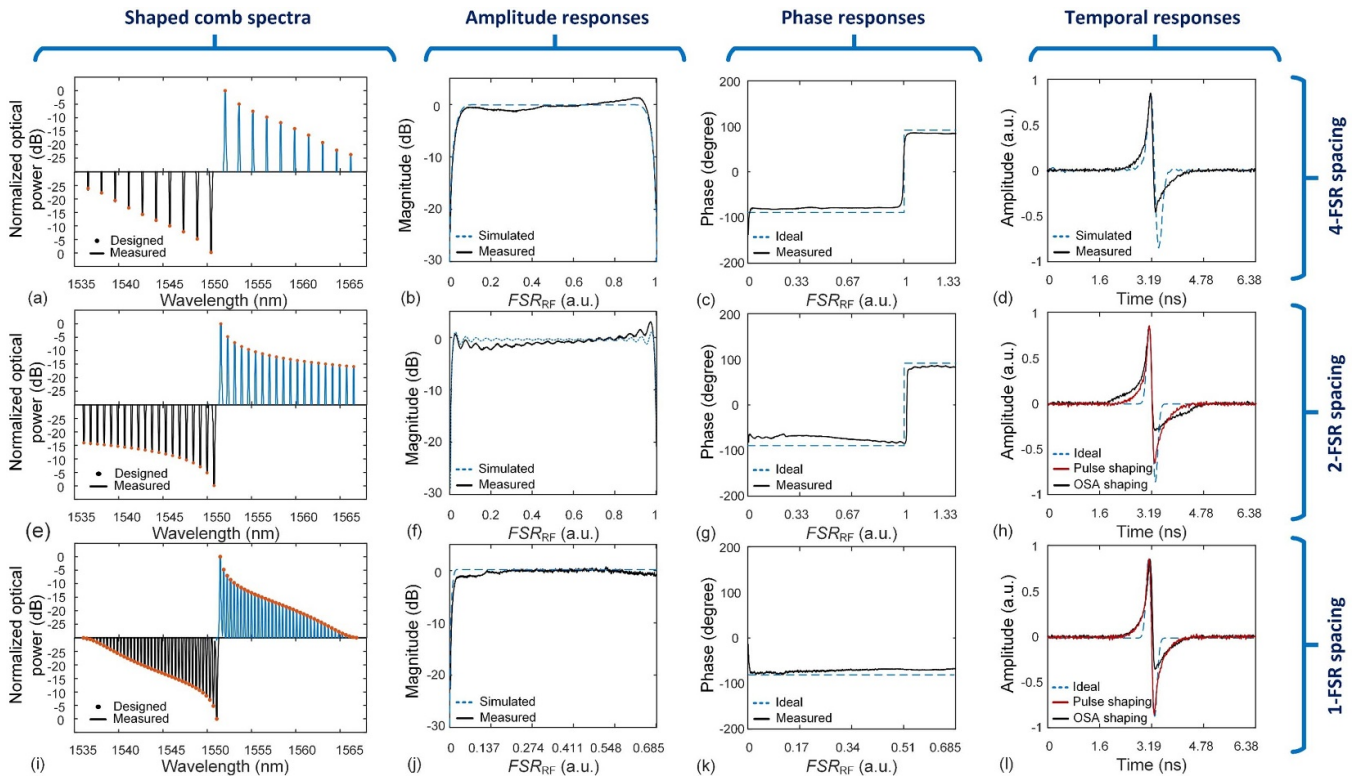
Figure 6 shows the experimental setup of the transversal filter signal processor based on a soliton crystal micro-comb. It consists mainly of two parts—comb generation and flattening followed by the transversal structure. In the first part, the generated soliton crystal micro-comb was spectrally shaped with two WaveShapers to enable a better signal-to-noise ratio as well as a higher shaping accuracy. The first WaveShaper (WS1) was used to equalize, or flatten, the comb spectrum from the originally generated scallop-shaped pattern that is

typical of soliton crystal micro-combs. In the second stage of the system, these equalized comb lines were all simultaneously modulated by the RF input signal with an EO modulator, which effectively multicast the RF signal onto all wavelength channels to yield identical copies. The RF replicas were then transmitted through a spool of standard SMF ( $\beta = \sim 17.4 \text{ ps nm}^{-1} \text{ km}^{-1}$ ) to obtain a progressive time delay between the adjacent wavelengths. Next, the second WaveShaper (WS2) equalized and weighted the power of the comb lines according to the designed tap coefficients. To increase the accuracy, we adopted a real-time feedback control path to read and shape the power of the comb lines accurately. Finally, the weighted and delayed taps were combined and converted back into the RF domain via a high-speed balanced photodetector (Finisar, 43 GHz bandwidth).

Figure 7 shows the experimental results for the Hilbert transformer with a  $90^\circ$  phase shift. The shaped optical combs are shown in figures 7(a), (e) and (i). A good match between the measured comb lines' power (blue lines for positive, black lines for negative taps) with the theoretically calculated design tap weights (red dots) was achieved, indicating that the micro-comb wavelengths were successfully weighted. Note that we



**Figure 6.** Experimental set up of RF signal processor based on soliton crystal micro-comb source. CW: continuously wave. EDFA: erbium-doped fibre amplifier. PC: polarization controller. WS: WaveShaper. IM: intensity modulator. SMF: single mode fibre. BPD: balanced photodetector. WA: wave analyzer. OSA: optical spectral analyzer.



**Figure 7.** Simulated and measured  $90^\circ$  Hilbert transformer with varying comb spacing. (a), (e) and (i) Shaped optical spectral. (b), (f) and (j) Amplitude responses (the IS211 responses measured by a Vector Network Analyzer). (c), (g) and (k) Phase responses. (d), (h) and (l) Temporal responses measured with a Gaussian pulse input.

applied a Hamming window [11] for single-FSR (49 GHz) and 4-FSR (196 GHz) comb spacings when designing the tap coefficients. One can see that with a Hamming window applied, the deviation of the amplitude response from the theoretical results can be improved. Figures 7(b), (f) and (j) show the theoretical and experimentally measured amplitude

response of the Hilbert transformer using a variety of different combs having different spacings, including single-FSR, 2-FSR, and 4-FSR comb spacings, respectively, while the phase responses are shown in figures 7(c), (g) and (k). We see that all 3 results show behaviour close the expected response of an ideal Hilbert transform. The system demonstration for the

**Table 1.** Performance of our transversal signal processors.

Type	Number of taps	Wavelength spacing	Frequency spacing (GHz)	Nyquist zone (GHz)	Octave	Temporal pulse RMSE	
						OSA shaping	Pulse shaping
Hilbert transformer	20	4-FSR	196	98	>4.5	~0.0957	/
Hilbert transformer	40	2-FSR	98	49	>6	~0.1065	~0.0845
Hilbert transformer	80	Single-FSR	49	24.5	/	~0.1330	~0.0782
Differentiator—1st order	21	4-FSR	196	98	/	~0.0838	/
Differentiator—2nd order	21	4-FSR	196	98	/	~0.0570	/
Differentiator—3rd order	21	4-FSR	196	98	/	~0.1718	/
Differentiator—1st order	81	Single-FSR	49	24.5	/	~0.1111	/
Differentiator—2nd order	81	Single-FSR	49	24.5	/	~0.1139	~0.0620
Differentiator—3rd order	81	Single-FSR	49	24.5	/	~0.1590	/

Hilbert transform using real-time signals consisting of Gaussian input pulses produced by an arbitrary waveform generator (KEYSIGHT M9505A) is shown in figures 7(d), (h) and (l) (black solid curves), recorded by a real-time high-speed oscilloscope (KEYSIGHT DSOZ504). To facilitate a comparison, we also show the response of an ideal Hilbert transformer in figures 7(d), (h) and (l) (blue dashed curves). For the Hilbert transformer with single-FSR, 2-FSR, and 4-FSR comb spacings, the root-mean-square errors (RMSEs) between the theoretical and experimentally measured curves were  $\sim 0.133$ ,  $\sim 0.1065$ , and  $\sim 0.0957$ . The performance parameters are listed in table 1.

Figure 8 shows the experimental results for the differentiators with increasing integral orders of 1, 2, and 3. The shaped optical spectra in figures 8(a), (e), (i), (m), (q) and (u) show good agreement between the theoretical tap weights and measured comb lines' power. Figures 8(b), (f), (j), (n), (r) and (v) show measured and simulated amplitude responses of the differentiators. The corresponding phase response is depicted in figures 8(c), (g), (k), (o), (s) and (w) where it can be seen that all (b), (f), (j), (n), (r) and (v) show measured and simulated amplitude integral differentiators agree well with the theory.

Here, we use the WaveShaper to programmably shape the combs to simulate MRRs with different FSRs. By artificially adjusting the comb spacing, we effectively obtain a variable operation bandwidth for the differentiator, which is advantageous for the diverse requirements of different applications. Here, we normalised the FSR of the RF response to have the unique operational bandwidth for comparing the performance of different processing functions in the same scales. For the 1<sup>st</sup>, 2<sup>nd</sup>, and 3<sup>rd</sup> order differentiators with a single-FSR (49 GHz) spacing, the calculated RMSEs between the measured and ideal curves are  $\sim 0.1111$ ,  $\sim 0.1139$ ,  $\sim 0.1590$ , respectively. For the 1<sup>st</sup>, 2<sup>nd</sup>, and 3<sup>rd</sup> order differentiators with a 4-FSR (196 GHz) spacing, the calculated RMSEs between the measured and ideal curves are  $\sim 0.0838$ ,  $\sim 0.0570$ ,  $\sim 0.1718$ , respectively. Note that there is some observed difference in the time-domain between the positive

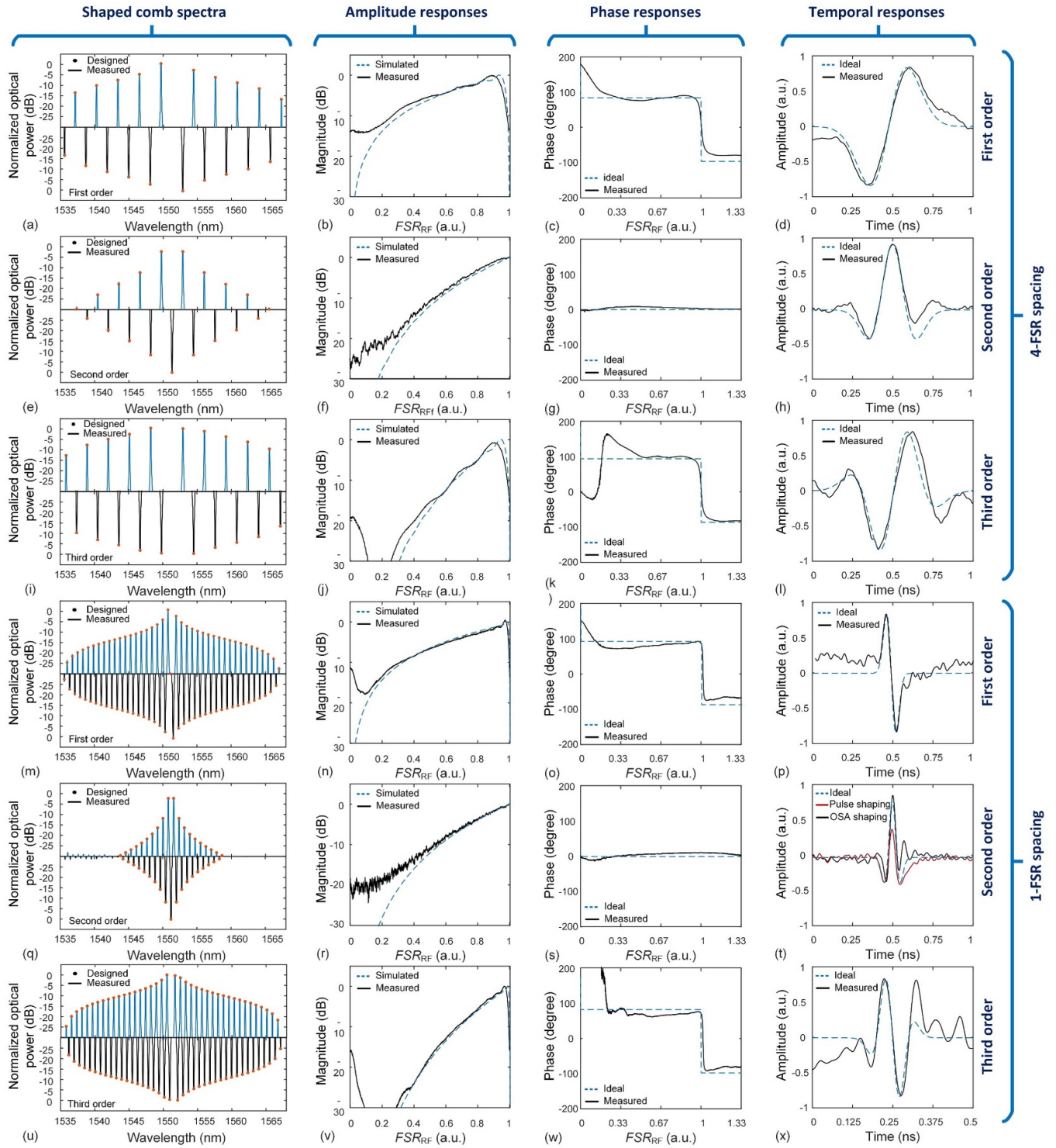
and negative amplitude and phase responses to the Gaussian input pulse which leads to a discrepancy with the ideal response. This is due to a combination of effects including the residual imbalance of the two ports of the balanced photodetector.

In order to reduce the errors mentioned above, for both the Hilbert transformer and the differentiator, we developed a more accurate comb shaping approach, where the error signal of the feedback loop was generated directly by the measured impulse response, instead of the optical power of the comb lines. We then performed the Hilbert transform and differentiation with the same transversal structure as the previous measurements, the results of which are shown in figures 7(h), (l) and 8(t). One can see that the imbalance of the response in the time domain has been compensated, and the RMSE of time-domain shown in table 1 has significantly improved. While this was the main source of error, the remaining discrepancy between theory and experiment in figures 7 and 8 arises from modulation chirp and third order dispersion in the fibre, which created distortion. In principle these can also be compensated for, and this will be addressed in future work.

Also note that the fact that the soliton crystal micro-comb was able to supply a larger number of comb lines, in our case up to 81 for the 1-FSR spaced comb, resulted in a much higher performance in terms of the spanned number of octaves in the RF domain as well as the RMSE, etc. On the other hand, the disadvantage is that single FSR spaced comb yields a lower operational bandwidth, being limited to approximately the Nyquist zone, which in that case is 25 GHz. The 2-FSR spacing and 4-FSR spaced system, on the other hand, can operate at RF frequencies that are well beyond that of traditional electronic microwave technologies. Therefore our shaping method gives the flexibility for us to achieve the required system.

Finally, figure 9 shows the 3 dB bandwidth of the Hilbert transformer versus the number of taps, for both theoretically calculated and experimentally measured results. As seen in figure 9, the theoretical 3 dB bandwidth increases

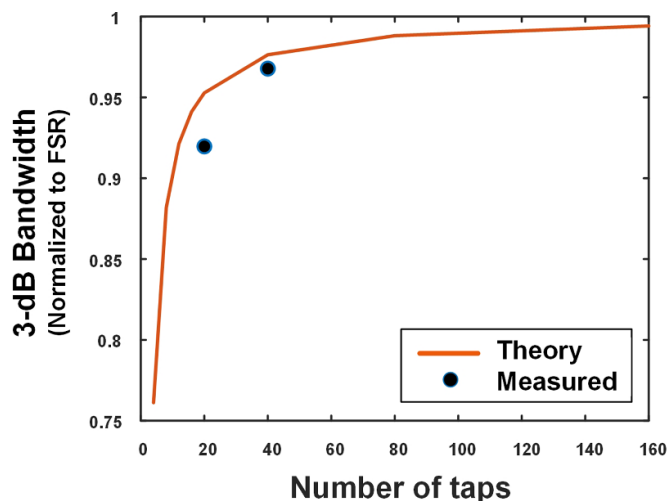




**Figure 8.** Simulated and measured first- to third-order differentiators with different comb spacing (single-FSR and 4-FSR). (a), (e), (i), (m), (q) and (u) Shaped optical spectral. (b), (f), (j), (n), (r) and (v) Amplitude responses. (c), (g), (k), (o), (s) and (w) Phase responses. (d), (h), (l), (p), (t) and (x) Temporal responses measured with a Gaussian pulse input.

rapidly with the number of taps but begins to saturate beyond 40 taps, meaning that there is limited benefit in including more taps. We note that we have previously shown a similar curve looking at the bandwidth dependence on the number of taps for a fractional Hilbert transformer in

figure 5(c) of [27], which showed good agreement between experiment and theory. In figure 9 we only show two measured points—while we did have data for 80 taps, the bandwidth was larger than what we could experimentally measure.



**Figure 9.** Simulated and experimental results of 3 dB bandwidth with different numbers of taps for a Hilbert transformer with  $90^\circ$  phase shift. The 3 dB bandwidth is expressed as a relative fraction of the RF FSR.

#### 4. Conclusion

We demonstrate record performance and versatility for soliton crystal micro-comb-based RF signal processing functions by varying the wavelength spacing and employing different tap designs and shaping methods. Our experimentally measured system performance agrees well with the theory, thus verifying that our soliton crystal micro-comb-based signal processor is a successful and attractive approach for achieving RF signal processors that feature broad operation bandwidths, a high degree of reconfigurability, and potentially also reduced cost and footprint.

#### Data availability statement

The data that support the findings of this study are available upon reasonable request from the authors.

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